



1 Soil carbon accrual and biopore formation across a plant 2 diversity gradient

3 Kyungmin Kim^{1,2,3,4}, Maik Geers-Lucas⁵, G. Philip Robertson^{3,4,6} and Alexandra
4 Kravchenko^{3,4}

5 ¹Department of Agricultural Biotechnology, Seoul National University, Seoul, Korea

6 ²Institute of Plant Environmental Science, Research Institute of Agriculture and Life Sciences, Seoul National
7 University, Seoul, Korea

8 ³Department of Plant Soil and Microbial Sciences, Michigan State University, East Lansing, MI, USA

9 ⁴DOE Great Lakes Bioenergy Research Center, Michigan State University, East Lansing, MI, USA

10 ⁵Department of Soil Science, Technische Universität Berlin, Germany

11 ⁶W.K. Kellogg Biological Station, Michigan State University, Hickory Corners, MI, USA

12 *Correspondence to:* Kyungmin Kim (km_kim@snu.ac.kr)

13 **Abstract.** Plant diversity promotes soil organic carbon (SOC) gains through intricate changes in root-soil
14 interactions and their subsequent influence on soil physical and biological processes. We assessed SOC and pore
15 characteristics of soils under a range of switchgrass-based plant systems, representing a gradient of plant diversity
16 with species richness ranging from 1 to 30 species 12 years after their establishment. We focused on soil biopores
17 as indicators of root activity legacy, measured using X-ray computed micro-tomography scanning, and explored
18 biopore relationships with SOC accumulation.

19 Plant functional richness explained 29% of bioporosity and 36% of SOC variation, while bioporosity itself
20 explained 36% of the variation in SOC. The most diverse plant system (30 species) had the highest SOC, while
21 long-term bare soil fallow and monoculture switchgrass had the lowest. Of particular note was a two-species
22 mixture of switchgrass (*Panicum virgatum* L.) and ryegrass (*Elymus canadensis*), which exhibited the highest
23 bioporosity and achieved SOC levels comparable to those of the systems with 6 and 10 plant species, and were
24 inferior only to the system with 30 species. We conclude that plant diversity may enhance SOC through biopore-
25 mediated mechanisms and suggest a potential for identifying specific plant combinations that may be particularly
26 efficient for fostering biopore formation and subsequently SOC sequestration.

27

28 1 Introduction

29 Plant diversity has been found to positively influence soil organic carbon (SOC) accumulation in various
30 ecosystems, including grasslands (Lange et al., 2015; Sprunger and Robertson, 2018) and row crop agriculture
31 (Liebman et al., 2013; McDaniel et al., 2014). Among the mechanisms through which higher plant diversity
32 promotes SOC storage are i) high biomass and C inputs from roots (Yang and Tilman, 2020), ii) slower root
33 decomposition in high diversity system due to increased root C:N ratios (Chen et al., 2017), and iii) higher
34 microbial activity enhanced by belowground inputs, where greater quantities of plant-added C are being
35 microbially processed and transformed into microbial biomass (Prommer et al., 2020; Lee et al., 2023) then
36 necromass (Qian et al., 2023; Mou et al., 2024). This microbially-processed C is then protected through physico-
37 chemical associations with soil minerals (Cotrufo et al., 2022). Moreover, in diverse plant communities
38 belowground competition among plants with contrasting root architectures can lead to greater root proliferation



39 through the soil matrix (Gersani et al., 2001; Bargaz et al., 2017; Wang et al., 2017). More extensive and dense
40 root growth results in greater volumes of the soil matrix being exposed to inputs of new root-derived organic
41 material and subsequent microbial activities (Kravchenko et al., 2019). However, spatial distributions and root
42 morphological characteristics of neighboring plant species can vary (Bolte and Villanueva, 2006; Wang et al.,
43 2014), thereby producing root-soil interactions unique to specific plant communities. Moreover, recent evidence
44 has shown that root-soil interactions and plant-derived C gains can also be affected by soil pore structure (Quigley
45 and Kravchenko, 2022; Lucas et al., 2023).

46 Analysis of root-soil interactions in diverse perennial plant communities in situ is extremely challenging due to
47 the opaque nature of soil and the difficulty of carrying out long-term (e.g., multiyear) continuous rhizobox or
48 greenhouse studies. Thus, much knowledge regarding impacts of diverse communities on root-soil interactions is
49 based on speculations from the data on root volumes and architecture generated upon disturbing the system to
50 procure the roots and upon conducting the root measurements after cleaning away the soil. In contrast, sampling
51 intact soil from long-term field studies and visualizing root residues, particulate organic matter (POM), and pores
52 via X-ray computed micro-tomography (μ CT) can generate helpful information on root-soil interactions,
53 augmenting data from destructive root system analyses (Helliwell et al., 2013).

54 We surmise that information on biopores from μ CT scanning can be of particular relevance for assessing root
55 impacts and root-soil interactions in perennial plant systems. Biopores are the soil pores originated from biological
56 activity such as plant root growth and the movement of earthworms and other soil fauna (Dexter, 1986; Blackwell
57 et al., 1990). Root-originated biopores, formed either by growth of living roots or by decomposition of old roots,
58 are particularly significant as they are 40 times more abundant, especially in subsoils, compared to earthworm
59 biopores (Banfield et al., 2018). Root biopores are tubular, round-shaped channels with sizes ranging from a few
60 micron to several centimeters (Kautz, 2015). Since root inputs are primarily introduced into the soil through the
61 biopores, they have >2.5 times higher soil C contents compared to bulk soil (Banfield et al., 2017). Rapid microbial
62 decomposition of plant residues and accumulation of microbial residues observed in root biopores (Banfield et al.,
63 2018) suggest that biopore characteristics may reflect the physical preferences and biochemical processes
64 involved in the transformation and accumulation of plant-derived C.

65 Reuse of existing biopores by newly grown roots is a commonly observed process in annual crops such as wheat,
66 fodder radish, and spring barley (White and Kirkegaard, 2010; Wahlström et al., 2021). Switchgrass, a North
67 American prairie grass, currently actively explored as a potential bioenergy feedstock (Larnaudie et al., 2022;
68 Zegada-Lizarazu et al., 2022), is known for its particularly active use of old root channels (i.e., biopore reuse),
69 especially when grown in monoculture (Lucas et al., 2023). Because of their continuous reuse, accompanied by
70 repeated influxes of new C and stimulated microbiota, biopores in perennial plant systems can be viewed as
71 hotspots of C processing and are both a product of historic root-soil interactions and a current arena of such
72 interactions. X-ray μ CT is particularly suitable for biopore investigation (Wendel et al., 2022), enabling the
73 examination of accumulated evidence of past root-soil interactions.

74 We hypothesize that in systems with varying levels of plant diversity enhanced biopore formation and their greater
75 abundance can stimulate C gains. Here we examine first, how a plant diversity gradient comprised of 1 to 30 North
76 America prairie species can shape soil pore characteristics, especially biopores, and second, whether these
77 characteristics are associated with SOC levels accumulated over the prior 12-years.



78 **2 Materials and Methods**

79 **2.1 Experimental site and soil sampling**

80 Soil samples were collected from the Cellulosic Biofuel Diversity Experiment site established in 2008 at Kellogg
81 Biological Station (KBS, 42°23'47" N, 85°22'26" W), a part of the KBS Long-Term Ecological Research (LTER)
82 program (Robertson and Hamilton, 2015). The soil is fine-loamy, mixed, mesic, Typic Hapludalf (Kalamazoo
83 loam). The experiment consists of twelve plant systems representing a 12-point gradient of plant diversity, six of
84 which were used in this study. Specifically, we sampled a bare soil system, which was kept free of vegetation
85 since 2016 after 8 years of continuous corn (CE1), a monoculture switchgrass (*Panicum virgatum*, L.; var.
86 Southlow) system (CE7), a mixture of two grass species, namely, switchgrass and Canadian rye (*Elymus*
87 *canadensis*, L.) (CE8), a mixture of six native grasses (CE9), a mixture of six native grasses and four forbs (CE10),
88 and a mixture of six native grasses and 24 forbs (CE12). Plant species of each system are listed in Supplementary
89 Table S1. The experiment is in a randomized complete block design with four replicated 9.1 m x 27.4 m plots for
90 each plant system.

91 Aboveground biomass of the plots, except for CE1 (bare soil), was sampled every fall from 2010-2019 (Fig. S1a),
92 and the data of 2018 and 2019 was used for this study (Fig. S1b). The entire aboveground biomass from each plot
93 was harvested with a mini combine, leaving 10-15 cm of stubble, and weighed and subsampled for moisture
94 content determination.

95 For soil pore analysis, intact soil cores (5 cm diameter (\emptyset) and 5 cm height) were taken from the 7-12 cm depth
96 interval in July 2019. Loose soil adjacent to each core was also procured for measurements of other soil
97 characteristics. Two soil cores were collected from each plot, for a total of 48 soil cores (6 systems x 4 replicate
98 plots x 2 cores per plot).

99

100 **2.2 Soil characteristics measured using destructively sampled soil**

101 Soil moisture at the time of core sampling was determined gravimetrically using a 20 g subsample of loose soil
102 immediately upon collection. The remaining loose soil samples were air-dried for 2 days and sieved to < 2 mm
103 for further analysis.

104 Total soil C and N were measured by combustion analysis using an elemental CN analyzer (Costech Analytical
105 Technologies Inc., CA, USA). Soil C mineralization was measured via 10 d incubation: 10 g of air-dried soil were
106 brought to 20% gravimetric moisture, placed in a beaker that was then placed in a 450 mL Mason jar with ~5 mL
107 of purified water on the bottom for maintaining high humidity within the jar. Mason jars were kept in the dark at
108 20 °C for 10 days, and CO₂ concentration in the headspace was measured for each jar using Infrared Photoacoustic
109 Spectroscopy (INNOVA Air Tech Instruments, Denmark).

110 **2.3 Soil core scanning and pore structure analysis**

111 Soil cores were subjected to X-ray computed micro-tomography (North Star Imaging, X3000, Rogers, USA) to
112 visualize and quantify soil pore structure. The scanning was conducted with a projection energy level of 75 KV



113 and 450 μA , with 2880 projections per scan. 3D reconstruction of the images was computed using eFX-CT
114 software (North Star Imaging, Rogers, USA) obtaining a final scanning resolution of 18.2 μm .
115 Reconstructed images were processed using Fiji software (Schindelin et al., 2012) and simpleITK package in
116 Python (Beare et al., 2018). A series of image pre-processing steps was conducted using Fiji and its Xlib plugin
117 (Münch and Holzer, 2008). Specifically, images were cropped into 1500 x 1500 pixels with a height of 2240
118 pixels to remove artifacts near core edges. Then, a 2D non-local filter ($\sigma=0.1$) was applied to reduce noise.
119 For pore segmentation, threshold values were obtained from eight segmentation methods, i.e., Otsu, Kitler, Huang,
120 Triangle, ISO, Li, Renyi, and Moments. Outliers that exceeded >1 standard deviation of the mean were removed.
121 This approach enabled us to minimize the side effects of using one specific thresholding method and ensured
122 robustness of the segmentation (Schlüter et al., 2014). Hereafter, we refer to the $>18.2 \mu\text{m}$ \varnothing pores as visible pores,
123 and their total volume as visible porosity. Pore size distributions of visible pores were determined by the Local
124 Thickness method embedded in Fiji, which is based on maximal inscribed spheres approach (Silin and Patzek,
125 2006). For biopore identification, the images were subjected to Tubeness filtering in Fiji to detect tubular type
126 pores of different radius. Detailed procedures for biopore segmentation are publicly available
127 (https://github.com/Maik-Lu/Roots_and_Biopores). Total volumes of visible pores and biopores were presented
128 as visible porosity and bioporosity. Surface area of biopores was calculated by applying assumption that the
129 biopore shape is cylindrical in a given radius, and the average distance to biopores was calculated using the
130 Euclidean Distance Transform (3D) function in Fiji.

131

132 **2.4 Plant diversity indicators**

133 Two plant diversity indicators were used in this study: i) plant species richness, and ii) plant functional richness
134 (Díaz and Cabido, 2001). Plant species richness was represented by the number of plant species in each treatment,
135 i.e., 0, 1, 2, 6, 10, and 30 for CE1, CE7, CE8, CE9, CE10, and CE12, respectively. For plant functional richness
136 we adopted the ecological concept of plant functional types, used to simplify plant diversity and behavior in
137 ecological models (McMahon et al., 2011). Specifically, we followed the approach used in grassland studies
138 (Mangan et al., 2011; Spiesman et al., 2018) by separating species based on different photosynthetic pathways
139 (C3 vs. C4), and leaf shape (broad-leaf vs. grasses) to form three functional groups, namely, C3 grasses, C4 grasses,
140 and forbs. Based on species characteristics (Table S1), plant functional richness of each treatment was equal to 0,
141 1, 2, 2, 3, and 3 for CE1, CE7, CE8, CE9, CE10, and CE12, respectively.

142

143 **2.5 Statistical analysis**

144 The statistical model for soil C, N, C:N ratio, 10-day mineralization, visible porosity, and bioporosity data
145 consisted of plant system as a fixed effect, and experimental blocks and blocks by systems interaction as random
146 effects (Milliken and Johnson, 2009). The latter term, in essence, represents experimental plots and was used as
147 an error term to test the plant system effect. The statistical model for the aboveground biomass measured during
148 two consecutive years further included year and its interaction with the plant system as fixed factors. The statistical
149 model for pore and biopore size distribution data also included the size and size by plant system interaction as



150 fixed effects, and soil core nested within the plant system and experimental plot as the random effect. Normality
151 was checked by visual inspection of normal probability plots, and when found violated, the data were subjected
152 to either square root or lognormal transformation prior to the analyses. The equal variance assumption was tested
153 by Levene's test, and when found to be violated, the unequal variance model was fitted using the approach
154 suggested by Milliken and Johnson (2009).

155 To explore associations of soil characteristics with pore and biopore data, the porosity and bioporosity from two
156 intact cores of each plot were averaged, followed by linear regression analysis. All statistical analyses were
157 conducted using SAS 9.4 software, using PROC MIXED and PROC REG procedure. Results are reported as
158 statistically significant at $p < 0.05$ and as trends at $p < 0.1$. P-values < 0.1 , < 0.05 , and < 0.01 are marked with *, **,
159 and ***, respectively.

160

161 **3 Results**

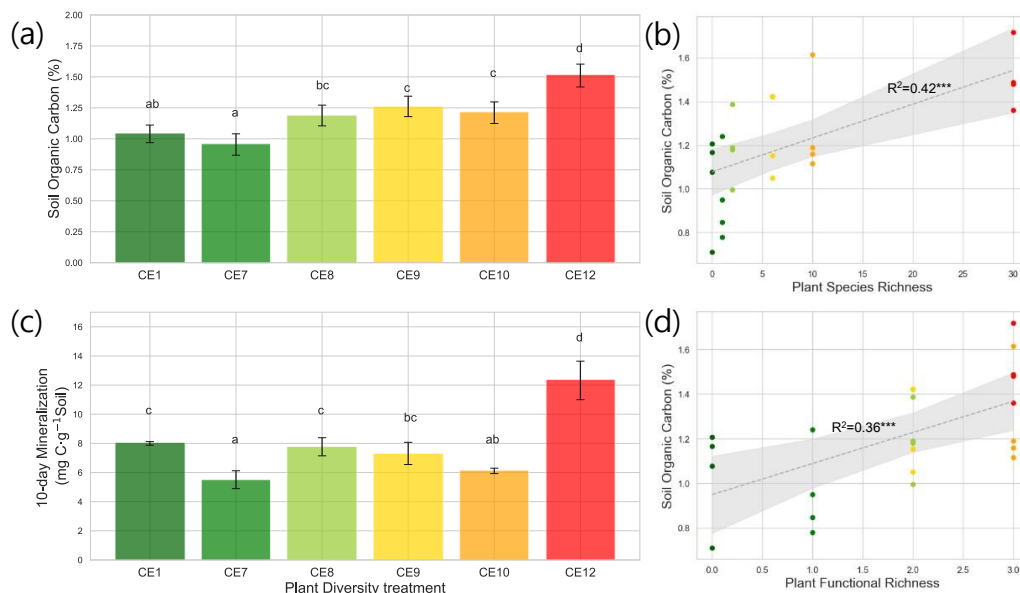
162 **3.1 Plant biomass and soil C characteristics of the studied plant systems**

163 Total aboveground biomass (2018-2019) tended to be higher in the most diverse systems (CE10 and CE12) than
164 in grass-only systems (CE8 and CE9), while the monoculture switchgrass (CE7) was intermediate ($p < 0.10$, Fig.
165 S1b). Total aboveground biomass was weakly correlated with plant species richness (Fig. S2a) and not correlated
166 with plant functional richness (Fig. S2b). Total aboveground biomass was not correlated with SOC contents (Fig.
167 S2c).

168 The plant systems with the highest diversity (CE12) had markedly higher SOC as compared to the rest of the
169 systems (Fig. 1a). However, an increase in plant diversity from a two-species (CE8) to six-species (CE9) and then
170 to a ten-species (CE10) system did not affect SOC (Fig. 1a). Soil C:N ratio was smallest in monoculture
171 switchgrass (CE7), and greatest in high diversity systems (CE10 and CE12) ($p < 0.01$, Fig. S3). Carbon
172 mineralization was highest in CE12, followed by bare soil (CE1), and CE8 (Fig. 1c). C mineralization was lowest
173 in CE7 and CE10.

174

175



176

177

178 **Figure 1: Soil Organic Carbon (SOC) content (a) and 10-day mineralization (c) across different plant diversity systems.**
 179 **Correlations between SOC and Plant Species Richness (b), as well as Plant Functional Richness (d), are shown. Letters**
 180 **indicate significant differences between plant diversity treatments ($p < 0.05$). Dotted gray lines in (b) and (d) represent**
 181 **fitted regression models, with light gray shaded area denoting 95% confidence interval. R2 values are provided for**
 182 **each model. Asterisks (***) indicate statistically significant regression models at $p < 0.01$.**

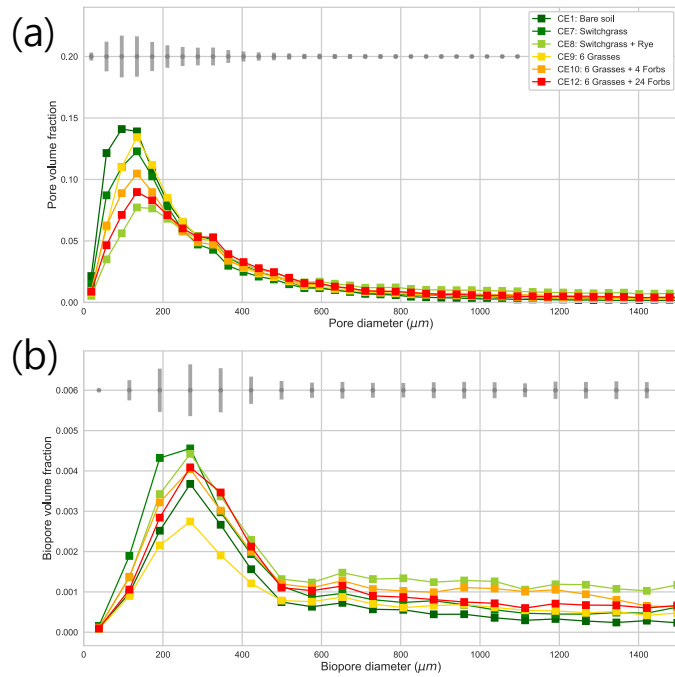
183

184 3.2 Biopore characteristics

185 Plant systems affected pore size distributions (Fig. 2a), where CE8, CE10, and CE12 had the lowest volumes of
 186 < 200 μm diameter pores and the highest volumes of >400 μm diameter pores, while an opposite trend was
 187 observed for CE1, CE7, and CE9 systems. Biopores, which was segmented based on its tubular morphology,
 188 tended to be larger than regular pores of arbitrary shapes (Fig. 2). For example, while the mode (i.e., the most
 189 frequent value) pore diameter of the entire pore size distribution was $\sim 100 \mu\text{m}$ (Fig. 2a), for biopores the modal
 190 pore diameter was $\sim 300 \mu\text{m}$ (Fig. 2b).

191 Visible porosity (pores of > 18.2 μm diam.) was highest in CE9 followed by CE8 (Fig. 3a). In contrast to visible
 192 porosity, bioporosity was the highest in CE8, which is comprised of switchgrass and Canadian ryegrass (Fig. 3b).
 193 In addition to CE8, throughout the entire range of biopore sizes, CE10 and CE12 also had consistently higher
 194 biopore volumes (Fig. 2b) as well as higher total bioporosity than the rest of the systems (Fig. 3b). Total surface
 195 areas of biopores (all pores of < 1500 μm diam.) were highest in CE7 and CE8, and lowest in CE1 ($p < 0.05$, Fig.
 196 4a). Average distance to biopores showed an opposite trend from surface area, i.e., farthest in CE1 and CE9 and
 197 shortest in CE8 ($p < 0.05$, Fig. 4d).

198

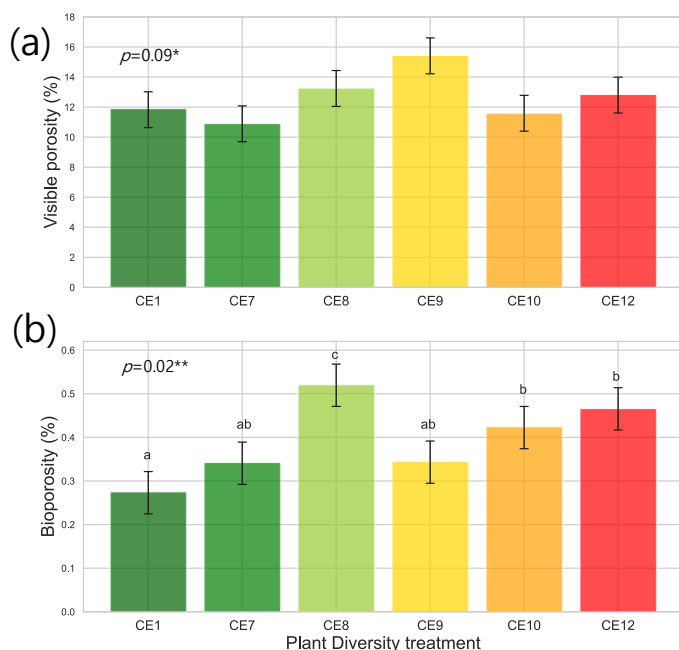


199

200 **Figure 2: Pore size distribution (a) and biopore size distribution (b) in different plant diversity systems. Gray bars**

201 **indicate the least significant difference (LSD) of each pore diameter.**

202



203

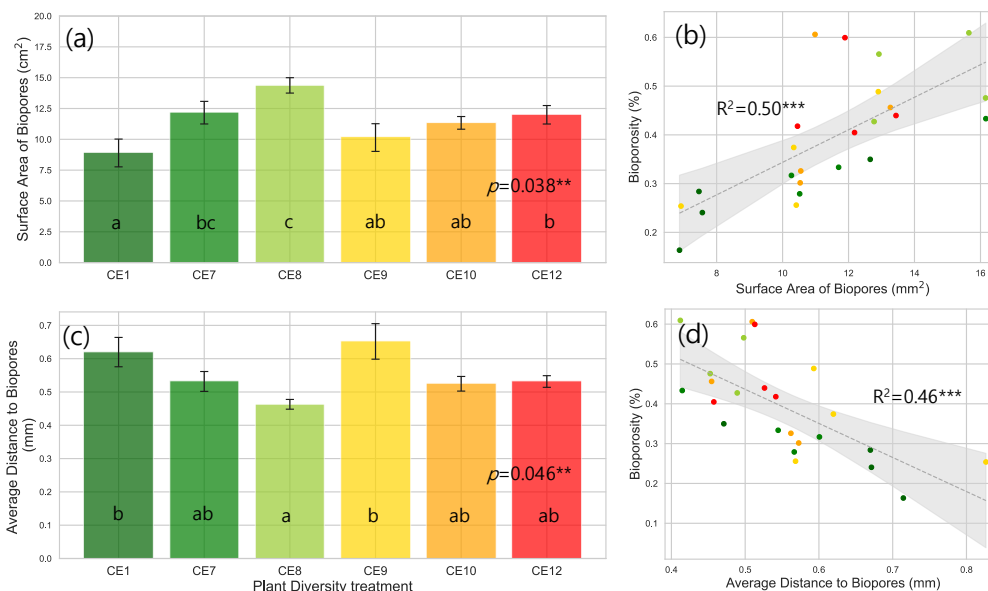
204 **Figure 3: Visible porosity (a) and bioporosity (b) in different plant diversity systems. Asterisks * and ** indicate**
 205 **statistically significant differences among plant diversity treatments at $p < 0.10$ and 0.05 , respectively. Letters indicate**
 206 **significant differences between plant diversity treatments ($p < 0.05$).**

207 3.3 Correlation between plant diversity, pore characteristics, and soil organic carbon

208 Overall, plant species richness and plant functional richness were positively correlated with SOC, with plant
 209 species richness explaining 42% of SOC variation ($p < 0.01$, Fig. 1b) and plant functional richness 36% of SOC
 210 ($p < 0.01$, Fig. 1d). The surface area of biopores was positively correlated with bioporosity with an R^2 of 0.50 ($p <$
 211 0.01 , Fig. 4b). On the other hand, average distance to biopores was negatively associated with bioporosity, with
 212 an R^2 of 0.46 ($p < 0.01$, Fig. 4d). Visible porosity was not correlated with plant species richness (Fig. S4b).
 213 Bioporosity was significantly affected by plant species richness ($p < 0.01$), which explained 10% of bioporosity
 214 variation (Fig. S4a). In contrast to plant species richness, plant functional richness explained 29% of the variance
 215 in bioporosity ($p < 0.05$, Fig. 5a). Total visible porosity was not correlated with SOC (Fig. S4b), while bioporosity
 216 was positively correlated with SOC with an R^2 of 0.36 ($p < 0.01$, Fig. 5b).

217

218



219

220 **Figure 4: Surface area of biopores (a) and average distance to biopores (c) across different plant diversity systems.**

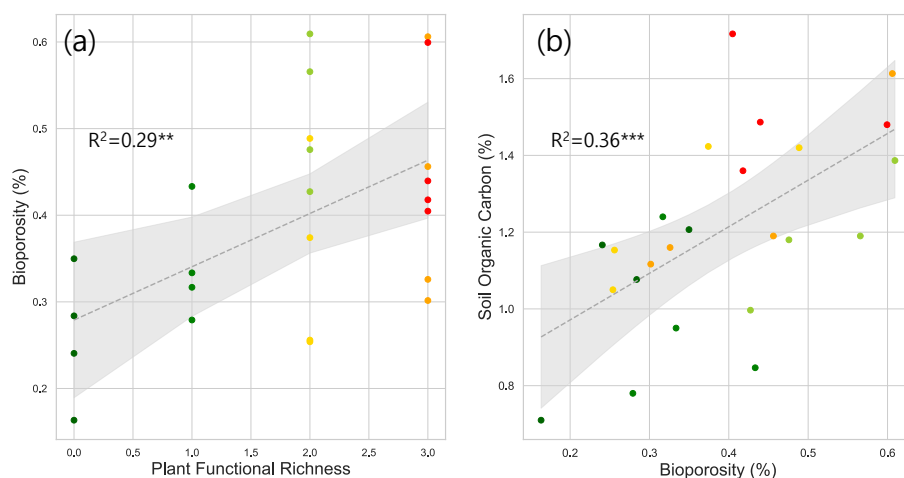
221 **Correlations between bioporosity and surface area of biopores (b), as well as average distance to biopores (d), are**

222 **shown. Letters indicate significant differences between plant diversity treatments ($p < 0.05$). Dotted gray lines in (b)**

223 **and (d) represent fitted regression models, with light gray shaded area denoting 95% confidence interval. R^2 values**

224 **are provided for each model. Asterisks (***) indicate statistically significant regression models at $p < 0.01$.**

225



226

227 **Figure 5: Correlation between plant functional richness and bioporosity (a), and between bioporosity and soil organic**

228 **carbon (b). R^2 values are provided for each model. Dotted gray lines represent fitted regression models, with light gray**

229 **shaded area denoting 95% confidence interval. Asterisks ** and *** indicate statistically significant regression models**

230 **at $p < 0.05$ and 0.01 , respectively.**



231 **4 Discussion**

232 **4.1 Biopores link plant diversity and SOC accumulation**

233 Consistent with our expectations and previous literature (Lange et al., 2015; Prommer et al., 2020; Yang and
234 Tilman, 2020), 12 years of contrasting plant system was sufficient to develop differences in SOC among the
235 studied plant systems, with the highest SOC observed in the most diverse plant system (Fig. 1a, b, and d). However,
236 the lack of correlation between the plant aboveground biomass and SOC observed here (Fig. S2c) suggests that
237 greater plant biomass did not itself significantly contribute to SOC increases. This lack of impact is even more
238 obvious when comparing CE7 (monoculture) and CE8 (two-species system), where CE8 had the lowest
239 aboveground biomass but its SOC was comparable to that from the systems with 3–5 times higher plant species
240 richness and higher aboveground biomass (CE9 and 10, Fig. 1a and S1b).

241 Besides plant diversity, bioporosity was another characteristic consistent with SOC results of the study (Fig. 5b).
242 Since the correlation between plant richness and SOC might have been amplified due to a wide range of plant
243 richness (specifically driven by species richness = 30, Fig. 1b and d), bioporosity might be a better indicator of
244 SOC. Moreover, the CE8 system with its unexpectedly high SOC turned out to have higher bioporosity than the
245 other studied systems (Fig. 3b), a trend that was present for all studied biopore sizes (Fig. 2b). Carbon processing
246 in root-originated biopores is more rapid than in bulk soil, since higher inputs of organic substrates (e.g., root
247 exudates) promote growth and assimilation of C by soil microbes (Kuzyakov and Blagodatskaya, 2015) and
248 consequently increases microbial necromass accumulation (Banfield et al., 2018).

249 The biopores in CE8 had the greatest surface area of biopores, followed by the most diverse system (Fig. 4a). The
250 average distance to biopores was the shortest in CE8, followed by diverse systems (CE10 and CE12) (Fig. 4c).
251 The surface area of biopores is critical as it represents the specific portion of the soil matrix that directly intercepts
252 root-derived carbon inputs, i.e., rhizodeposits (Keller et al., 2021) and decomposed root residues processed by
253 soil microbes (Kim et al., 2022). A shorter average distance to biopores indicates greater accessibility for root-
254 derived carbon, facilitating its efficient transfer into the soil matrix.

255 Biopores are pore spaces that have been impacted by roots and thus reflect root growth, death, and resulting
256 changes in the soil's physicochemical properties accumulated for 12 years. In ecosystems with high plant species
257 diversity, the importance of biopore characteristics is further amplified. Diverse plant communities exhibit
258 complex root architectures due to interspecific interactions, leading to varying quantities and spatial distributions
259 of root-derived carbon. Increased root-originated bioporosity also indicates diversified root growth paths, which
260 leads to strengthened root-soil contact (Lucas et al., 2023). A greater interface with the soil matrix (i.e., surface
261 area) facilitates diffusion and storage of microbially processed C (Kravchenko et al., 2019), thereby contributing
262 to increased SOC.

263

264 **4.2 Future research directions: winning plant species combinations?**

265 Interestingly, while bioporosity was not affected by the number of plant species within the system, it was
266 positively correlated with the systems' functional diversity (Fig. 5a). This implies that greater diversity of
267 functional groups – rather than a greater diversity of plant species per se – may lead to a more thorough exploration
268 of the soil matrix in part through biopore formation, subsequently enhancing soil C accumulation.



269 Moreover, certain combinations of specific plant species, e.g., CE8 (Switchgrass + Canadian rye), can be more
270 “effective” in building biopores, and potentially furthering SOC accumulation through rapid processing of added
271 substrates (Banfield et al., 2017; Banfield et al., 2018). We hypothesize that Canadian rye could be viewed as a
272 species with a keystone effect on bioporosity and SOC accumulation. A “keystone effect” refers to beneficial
273 effect of specific plant species on ecosystem function (Mills et al., 1993). For instance, legume species added to
274 grasslands have been found to disproportionately affect biomass productivity and root C accrual (Minns et al.,
275 2001; Fornara and Tilman, 2008; Lange et al., 2015; Yang et al., 2019) due to N assimilation by legumes and
276 consequent utilization of that N by grasses (Minns et al., 2001; Mangan et al., 2011; Mou et al., 2024). Introduction
277 of a C3 plant, i.e., Canadian rye, into a monoculture C4 switchgrass community may have altered switchgrass root
278 growth and exudation patterns. Sensitivity of chemical composition of switchgrass root exudates to neighboring
279 plant species (e.g., C3 *Koeleria macrantha* Ledeb.), and resultant increases in microbial biomass C and changes
280 in bacterial diversity in the switchgrass rhizosphere have indeed been demonstrated before (Ulbrich et al., 2022).
281 We see the need for further investigation into the role that individual members of grassland communities may
282 play in stimulating soil pore structure development and soil C accumulation. Identifying keystone species enabling
283 more efficient C accumulation can guide plant restoration and SOC accrual efforts.

284 **Acknowledgements**

285 This work was supported by a 2019 Kellogg Biological Station LTER Fellowship. Support for this research was
286 provided by the U.S. Department of Energy, Office of Science, Office of Biological and Environmental Research
287 (Award DE-SC0018409), by the National Science Foundation Long-term Ecological Research Program (DEB
288 2224712) at the Kellogg Biological Station, and by Michigan State University AgBioResearch. This work was
289 also supported by the New Faculty Startup Fund from Seoul National University.
290

291 **Code/Data availability**

292 The datasets generated during and/or analyzed during the current study are available upon request.

293 **Author contribution**

294 K. K Formal analysis, investigation, Writing-original draft, visualization
295 M.G: Software, Validation, Writing-Review & Editing
296 G. P. R: Resources, Project administration, Writing-Review & Editing
297 A. K: Conceptualization, Resources, Writing-Review & Editing, Supervision, Funding acquisition

298 **Competing interests**

299 The authors declare that they have no known competing financial interests or personal relationships that could
300 have appeared to influence the work reported in this paper.



301 **References**

- 302 Banfield, C.C., Dippold, M.A., Pausch, J., Hoang, D.T., Kuzyakov, Y., 2017. Biopore history
303 determines the microbial community composition in subsoil hotspots. *Biology and Fertility of Soils* 53,
304 573-588.
- 305 Banfield, C.C., Pausch, J., Kuzyakov, Y., Dippold, M.A., 2018. Microbial processing of plant residues
306 in the subsoil—The role of biopores. *Soil Biology and Biochemistry* 125, 309-318.
- 307 Bargaz, A., Noyce, G.L., Fulthorpe, R., Carlsson, G., Furze, J.R., Jensen, E.S., Dhiba, D., Isaac, M.E.,
308 2017. Species interactions enhance root allocation, microbial diversity and P acquisition in intercropped
309 wheat and soybean under P deficiency. *Applied Soil Ecology* 120, 179-188.
- 310 Beare, R., Lowekamp, B., Yaniv, Z., 2018. Image segmentation, registration and characterization in R
311 with SimpleITK. *Journal of statistical software* 86.
- 312 Blackwell, P., Green, T., Mason, W., 1990. Responses of biopore channels from roots to compression
313 by vertical stresses. *Soil Science Society of America Journal* 54, 1088-1091.
- 314 Bolte, A., Villanueva, I., 2006. Interspecific competition impacts on the morphology and distribution
315 of fine roots in European beech (*Fagus sylvatica* L.) and Norway spruce (*Picea abies* (L.) Karst.).
316 *European Journal of Forest Research* 125, 15-26.
- 317 Chen, H., Mommer, L., Van Ruijven, J., De Kroon, H., Fischer, C., Gessler, A., Hildebrandt, A.,
318 Scherer-Lorenzen, M., Wirth, C., Weigelt, A., 2017. Plant species richness negatively affects root
319 decomposition in grasslands. *Journal of Ecology* 105, 209-218.
- 320 Cotrufo, M.F., Haddix, M.L., Kroeger, M.E., Stewart, C.E., 2022. The role of plant input physical-
321 chemical properties, and microbial and soil chemical diversity on the formation of particulate and
322 mineral-associated organic matter. *Soil Biology and Biochemistry* 168, 108648.
- 323 Dexter, A., 1986. Model experiments on the behaviour of roots at the interface between a tilled seed-
324 bed and a compacted sub-soil: III. Entry of pea and wheat roots into cylindrical biopores. *Plant and soil*
325 95, 149-161.
- 326 Díaz, S., Cabido, M., 2001. Vive la différence: plant functional diversity matters to ecosystem processes.
327 *Trends in ecology & evolution* 16, 646-655.
- 328 Fornara, D., Tilman, D., 2008. Plant functional composition influences rates of soil carbon and nitrogen
329 accumulation. *Journal of Ecology* 96, 314-322.
- 330 Gersani, M., Brown, J.S., O'Brien, E.E., Maina, G.M., Abramsky, Z., 2001. Tragedy of the commons
331 as a result of root competition. *Journal of Ecology* 89, 660-669.
- 332 Helliwell, J.R., Sturrock, C.J., Grayling, K.M., Tracy, S.R., Flavel, R., Young, I., Whalley, W., Mooney,
333 S.J., 2013. Applications of X-ray computed tomography for examining biophysical interactions and
334 structural development in soil systems: a review. *European Journal of Soil Science* 64, 279-297.
- 335 Kautz, T., 2015. Research on subsoil biopores and their functions in organically managed soils: A
336 review. *Renewable Agriculture and Food Systems* 30, 318-327.
- 337 Keller, A.B., Brzostek, E.R., Craig, M.E., Fisher, J.B., Phillips, R.P., 2021. Root-derived inputs are
338 major contributors to soil carbon in temperate forests, but vary by mycorrhizal type. *Ecology letters* 24,
339 626-635.
- 340 Kim, K., Gil, J., Ostrom, N.E., Gandhi, H., Oerther, M.S., Kuzyakov, Y., Guber, A.K., Kravchenko,
341 A.N., 2022. Soil pore architecture and rhizosphere legacy define N₂O production in root detritosphere.
342 *Soil Biology and Biochemistry* 166, 108565.
- 343 Kravchenko, A., Guber, A., Razavi, B., Koestel, J., Quigley, M., Robertson, G., Kuzyakov, Y., 2019.
344 Microbial spatial footprint as a driver of soil carbon stabilization. *Nat. Commun.*, 10, 3121.
- 345 Kuzyakov, Y., Blagodatskaya, E., 2015. Microbial hotspots and hot moments in soil: concept & review.
346 *Soil Biology and Biochemistry* 83, 184-199.
- 347 Lange, M., Eisenhauer, N., Sierra, C.A., Bessler, H., Engels, C., Griffiths, R.I., Mellado-Vázquez, P.G.,
348 Malik, A.A., Roy, J., Scheu, S., 2015. Plant diversity increases soil microbial activity and soil carbon
349 storage. *Nature communications* 6, 6707.
- 350 Larnaudie, V., Ferrari, M.D., Lareo, C., 2022. Switchgrass as an alternative biomass for ethanol
351 production in a biorefinery: Perspectives on technology, economics and environmental sustainability.
352 *Renewable and Sustainable Energy Reviews* 158, 112115.



- 353 Lee, J.H., Lucas, M., Guber, A.K., Li, X., Kravchenko, A.N., 2023. Interactions among soil texture,
354 pore structure, and labile carbon influence soil carbon gains. *Geoderma* 439, 116675.
- 355 Liebman, M., Helmers, M.J., Schulte, L.A., Chase, C.A., 2013. Using biodiversity to link agricultural
356 productivity with environmental quality: Results from three field experiments in Iowa. *Renewable*
357 *Agriculture and Food Systems* 28, 115-128.
- 358 Lucas, M., Santiago, J.P., Chen, J., Guber, A., Kravchenko, A., 2023. The soil pore structure
359 encountered by roots affects plant-derived carbon inputs and fate. *New Phytologist* 240, 515-528.
- 360 Mangan, M.E., Sheaffer, C., Wyse, D.L., Ehlke, N.J., Reich, P.B., 2011. Native perennial grassland
361 species for bioenergy: establishment and biomass productivity. *Agronomy Journal* 103, 509-519.
- 362 McDaniel, M.D., Tiemann, L.K., Grandy, A.S., 2014. Does agricultural crop diversity enhance soil
363 microbial biomass and organic matter dynamics? A meta-analysis. *Ecological Applications* 24, 560-
364 570.
- 365 McMahon, S.M., Harrison, S.P., Armbruster, W.S., Bartlein, P.J., Beale, C.M., Edwards, M.E., Kattge,
366 J., Midgley, G., Morin, X., Prentice, I.C., 2011. Improving assessment and modelling of climate change
367 impacts on global terrestrial biodiversity. *Trends in ecology & evolution* 26, 249-259.
- 368 Milliken, G.A., Johnson, D.E., 2009. *Analysis of Messy Data Volume 1*. (No Title).
- 369 Mills, L.S., Soulé, M.E., Doak, D.F., 1993. The keystone-species concept in ecology and conservation.
370 *BioScience* 43, 219-224.
- 371 Minns, A., Finn, J., Hector, A., Caldeira, M., Joshi, J., Palmborg, C., Schmid, B., Scherer-Lorenzen,
372 M., Spehn, E., Troumbis, A., project, t.B., 2001. The functioning of European grassland ecosystems:
373 potential benefits of biodiversity to agriculture. *Outlook on AGRICULTURE* 30, 179-185.
- 374 Mou, X., Lv, P., Jia, B., Mao, H., Zhao, X., 2024. Plant species richness and legume presence increase
375 microbial necromass carbon accumulation. *Agriculture, Ecosystems & Environment* 374, 109196.
- 376 Münch, B., Holzer, L., 2008. Contradicting geometrical concepts in pore size analysis attained with
377 electron microscopy and mercury intrusion. *Journal of the American Ceramic Society* 91, 4059-4067.
- 378 Prommer, J., Walker, T.W., Wanek, W., Braun, J., Zezula, D., Hu, Y., Hofhansl, F., Richter, A., 2020.
379 Increased microbial growth, biomass, and turnover drive soil organic carbon accumulation at higher
380 plant diversity. *Global Change Biology* 26, 669-681.
- 381 Qian, Z., Li, Y., Du, H., Wang, K., Li, D., 2023. Increasing plant species diversity enhances microbial
382 necromass carbon content but does not alter its contribution to soil organic carbon pool in a subtropical
383 forest. *Soil Biology and Biochemistry* 187, 109183.
- 384 Quigley, M., Kravchenko, A., 2022. Inputs of root-derived carbon into soil and its losses are associated
385 with pore-size distributions. *Geoderma* 410, 115667.
- 386 Robertson, G.P., Hamilton, S.K., 2015. Long-term ecological research at the Kellogg Biological Station
387 LTER site. *The ecology of agricultural landscapes: Long-term research on the path to sustainability* 1,
388 32.
- 389 Schindelin, J., Arganda-Carreras, I., Frise, E., Kaynig, V., Longair, M., Pietzsch, T., Preibisch, S.,
390 Rueden, C., Saalfeld, S., Schmid, B., 2012. Fiji: an open-source platform for biological-image analysis.
391 *Nature methods* 9, 676-682.
- 392 Schlüter, S., Sheppard, A., Brown, K., Wildenschild, D., 2014. Image processing of multiphase images
393 obtained via X-ray microtomography: A review. *Water Resources Research* 50, 3615-3639.
- 394 Silin, D., Patzek, T., 2006. Pore space morphology analysis using maximal inscribed spheres. *Physica*
395 *A: Statistical mechanics and its applications* 371, 336-360.
- 396 Spiesman, B.J., Kummel, H., Jackson, R.D., 2018. Carbon storage potential increases with increasing
397 ratio of C 4 to C 3 grass cover and soil productivity in restored tallgrass prairies. *Oecologia* 186, 565-
398 576.
- 399 Sprunger, C.D., Robertson, G.P., 2018. Early accumulation of active fraction soil carbon in newly
400 established cellulosic biofuel systems. *Geoderma* 318, 42-51.
- 401 Ulbrich, T.C., Rivas-Ubach, A., Tiemann, L.K., Friesen, M.L., Evans, S.E., 2022. Plant root exudates
402 and rhizosphere bacterial communities shift with neighbor context. *Soil Biology and Biochemistry* 172,
403 108753.
- 404 Wahlström, E.M., Kristensen, H.L., Thomsen, I.K., Labouriau, R., Pulido-Moncada, M., Nielsen, J.A.,
405 Munkholm, L.J., 2021. Subsoil compaction effect on spatio-temporal root growth, reuse of biopores
406 and crop yield of spring barley. *European Journal of Agronomy* 123, 126225.



- 407 Wang, B., Zhang, W., Ahanbieke, P., Gan, Y., Xu, W., Li, L., Christie, P., Li, L., 2014. Interspecific
408 interactions alter root length density, root diameter and specific root length in jujube/wheat agroforestry
409 systems. *Agroforestry systems* 88, 835-850.
- 410 Wang, X.-Y., Ge, Y., Wang, J., 2017. Positive effects of plant diversity on soil microbial biomass and
411 activity are associated with more root biomass production. *Journal of Plant Interactions* 12, 533-541.
- 412 Wendel, A.S., Bauke, S.L., Amelung, W., Knief, C., 2022. Root-rhizosphere-soil interactions in
413 biopores. *Plant and soil* 475, 253-277.
- 414 White, R.G., Kirkegaard, J.A., 2010. The distribution and abundance of wheat roots in a dense,
415 structured subsoil—implications for water uptake. *Plant, cell & environment* 33, 133-148.
- 416 Yang, Y., Tilman, D., 2020. Soil and root carbon storage is key to climate benefits of bioenergy crops.
417 *Biofuel Research Journal* 7, 1143-1148.
- 418 Yang, Y., Tilman, D., Furey, G., Lehman, C., 2019. Soil carbon sequestration accelerated by restoration
419 of grassland biodiversity. *Nature communications* 10, 718.
- 420 Zegada-Lizarazu, W., Zanetti, F., Di Virgilio, N., Monti, A., 2022. Is switchgrass good for carbon
421 savings? Long-term results in marginal land. *GCB Bioenergy* 14, 814-823.