| 1 | Leveraging aquatic-terrestrial interfaces to capture putative habitat generalists |
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- 22 Key Words: Microbial colonization, habitat generalism, trait conservation, environmental
- 23 interfaces, abiotic constraints, microbiome manipulation

24 Abstract

25 Habitat type is a strong determinant of microbial composition. Habitat interfaces, such as 26 the boundary between aquatic and terrestrial systems, present unique combinations of abiotic 27 factors for microorganisms to contend with. Aside from the spillover of certain harmful 28 microorganisms from agricultural soils into water (e.g. fecal coliform bacteria), we know little 29 about the extent of soil-water habitat switching across microbial taxa. In this study, we developed 30 a proof-of-concept system to facilitate the capture of putatively generalist microorganisms that can 31 colonize and persist in both soil and river water. We aimed to examine the phylogenetic breadth 32 of putative habitat switchers and how this varies across different source environments. Microbial 33 composition was primarily driven by recipient environment type, with the strongest phylogenetic 34 signal seen at the order level for river water colonizers. We also identified more microorganisms 35 colonizing river water when soil was collected from a habitat interface (i.e. soil at the side of an 36 intermittently flooded river, compared to soil collected further from water sources), suggesting 37 that environmental interfaces could be important reservoirs of microbial habitat generalists. 38 Continued development of experimental systems that actively capture microorganisms that thrive 39 in divergent habitats could serve as a powerful tool for identifying and assessing the ecological 40 distribution of microbial generalists.

41 Introduction

42 Microorganisms are found in almost every environment that we can access on Earth, but 43 individual taxa differ widely in their ubiquity. While some can grow across a broad environmental 44 range, many are restricted to relatively narrow niche space (i.e. habitat generalists and specialists, 45 respectively) (Barberán et al., 2014). In some cases, microbial biogeography may be limited by 46 environmental opportunity, as microorganisms are less likely to be well-adapted to conditions they 47 have not been exposed to. For instance, a lineage that is endemic to isolated cave sediments may 48 have never had the opportunity to colonize a human gut; whether it would develop this ability 49 given the opportunity would then depend on its specific suite of traits. Similarly, there is evidence 50 that the ability to biodegrade plastics among microorganisms is increasing as this opportunity 51 becomes more widespread in the environment (Zrimec et al., 2021). Due to their direct relevance 52 to public health, certain disease-causing microorganisms are well-known for likely habitat 53 switching between animals and humans (e.g. E.coli (Rwego et al., 2008); SARS-CoV-2 -19 54 (Cohen, 2022)), soils and humans (e.g. *Bacillus anthracis* (Steffan et al., 2020)), or soil and water 55 (e.g. fecal coliform bacteria (Pachepsky & Shelton, 2011)). However, we do not have a general 56 understanding of the frequency or extent of habitat switching among non-pathogenic 57 microorganisms, despite acknowledgement of the forces that shape microbial biogeography (Chu 58 et al., Larkin & Martiny, 2017).

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Environmental heterogeneity and stability play an important role in shaping the potential habitat range of microorganisms (Hotaling *et al.*, 2019, Bell & Bell, 2021, Xu *et al.*, 2022). In spatially or temporally heterogeneous environments, some organisms may undergo niche expansion by developing broadly adapted phenotypes to cope with the range of conditions they

64 encounter. For instance, in frequently perturbed environments, organisms can rely on 65 compensatory adaptations (e.g. copiotrophy; dormancy; phenotypic plasticity (Shoemaker & Lennon, 2018, Kurm et al., 2019)) to cope with periods of abiotic or biotic stress. Alternatively, 66 67 microorganisms may respond to environmental heterogeneity by confining themselves to a narrow 68 portion of their fundamental niche and increasing their competitive advantage within that space 69 (e.g. oligotrophy; antibiotic compound production), particularly when conditions remain stable 70 (Barrett et al., 2005, Hibbing et al., 2010, Stone et al., 2023). The costs associated with generalist 71 and specialist lifestyles have long been debated, with some finding generalism to be linked with 72 higher metabolic burden (Lipson et al., 2008, Hall et al., 2010) and others finding no clear evidence 73 of fitness or functional trade-offs (Bennett & Lenski, 2007). Ultimately, this likely depends on the 74 type of generalism and the traits required to allow microorganisms to function across a broad range 75 of conditions.

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77 There are several practical implications to understanding the factors that promote habitat 78 switching. For instance, repurposing soils for agriculture will inherently reshape the microbial 79 composition and function of those soils but may also have spillover effects on the microbiomes of 80 adjacent land or water (Bell & Tylianakis, 2016, Bell & Bell, 2021). In addition, identifying 81 taxonomic groups or traits that promote a broad survival range could benefit the development of 82 microbial inoculants, which are notorious for their unpredictable survival across field conditions 83 (Kaminsky et al., 2019). In this study, we developed a proof-of-concept system for capturing putative habitat generalists. Such systems are of interest, because they could be used to 1) clearly 84 85 identify microorganisms based on observed ecological traits and 2) test the functional capacity of 86 different microbiome subsets post-capture. Here, we used microcosms to interface a non-sterile

87 source (water or soil) with a biotically-cleared recipient environment (soil or water) to capture 88 microorganisms that can colonize and persist between divergent habitat types. We assayed two 89 distinct types of soil: one from a riverbed that is intermittently flooded through the year, though 90 not exposed to water at the time of sampling (representing a natural soil-water interface), and one 91 from a nearby farm that is well above the water level of the river. We hypothesized that: 1) putative 92 habitat switching would be restricted to specific lineages, as we expected traits that allow for 93 habitat switching to be complex and therefore phylogenetically conserved, and 2) we would 94 identify more putative habitat switchers from soil collected at a water-soil interface than soil 95 collected further from the river, as microbiomes conditioned to fluctuating water and soil 96 environments are likely to have undergone niche expansion into both. This proof-of-concept study 97 demonstrates the potential for using active microbial capture systems to move beyond survey-98 based studies and collect microbiome subsets based on ecologically relevant traits.

99

100 Materials and Methods

101 Soil and water collection and processing

102 On 14 December 2020, river water and two distinct soil samples were collected from Cole 103 Farm, a cultivated land site within the Susquehanna Shale Hills in Pennsylvania containing a sub-104 catchment of Shaver's Creek. This site was formerly part of the NSF-funded Critical Zone 105 Observatory Network (Li et al., 2018). River water was collected in bleach-sterilized 15 L buckets 106 and the containers were pre-rinsed six times with river water downstream of the final collection 107 site to minimize capture of disturbed sediments. Collected water samples were stored in a cold 108 room at 4°C or frozen at -20°C for short- or long-term use, respectively, and a portion immediately 109 filter-sterilized with 0.2 um cellulose nitrate membranes (Majaneva et al., 2018). Water quality

- before and after sterilizing was analyzed by the Agricultural Analytical Services Laboratory at
 Pennsylvania State University (See Supplementary Table 1).
 - 112

113 Soils were collected from two locations within the study site to obtain microbiomes 114 historically conditioned to distinct environmental pressures: 1) farm soil: directly from an 115 agriculturally-managed field not susceptible to river flooding (40°38'07.6"N 77°56'38.0"W), and 116 2) riverbed soil: from un-managed river-adjacent sediments (40°38'00.6"N 77°56'29.4"W), where 117 intermittent flooding was apparent from soil compaction and vegetation patterns. Each soil was 118 homogenized and divided into batches of "natural" (non-sterile) or biotically-cleared soil (further 119 referred to as sterilized soil). Natural field soils from each collection site were immediately frozen 120 until experimental setup to preserve their microbiomes. To standardize comparisons of microbial 121 colonization between two different soil types, soils from each location intended for sterilization 122 were sieved through a 12 mm wire mesh to minimize rocks and soil aggregates that could generate 123 spurious noise in colonization between replicates. They were then autoclaved three individual 124 times (3 x 60 min @ 121°C) with 24 h between each cycle (Howard *et al.*, 2017, King *et al.*, 2022). 125 While all soil sterilization methods will alter soil properties to some extent (McNamara et al., 126 2003) we have found autoclaving to be most effective in removing microorganisms (Trexler & 127 Bell, 2019, Kaminsky et al., 2021, Yates et al., 2022). While no sterilized version of water or soil 128 can fully replicate the original environment, our goal was to assess microbial movement into 129 complex soil and water analogues in the absence of biotic pressures. Soils before and after 130 sterilizing were analyzed for nutrient concentrations and particle size by the Agricultural 131 Analytical Services Laboratory at Pennsylvania State University (Supplementary Table 2 & 3).

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134 Examples of fully constructed microcosms are provided in Fig. 1, along with a visual 135 representation of the full experimental design. To evaluate microbial movement between divergent 136 habitats, we designed our microcosms to interface soil and water using 565 ml Microbox 137 containers with filter membrane lids that allow sterile gas exchange (Sac O₂ company, Deinze, 138 Belgium, catalogue: O118/80+OD118). Microcosms were filled partially with 450 ml of river 139 water, leaving an air buffer between the meniscus and lid. Soil was aliquoted (200 ml) and encased 140 in sterile nylon stockings, to allow microbial movement across the barrier while maintaining a soil-141 water interface within the microcosm. Nylon stockings were sterilized by immersing in absolute 142 ethanol for 20 min followed by a 20 min UV-sterilization and drying in a biological safety cabinet 143 prior to use. Control treatments included soil-only and water-only microcosms, which were 144 constructed as either a unit containing a nylon stocking filled with soil (200 ml) or containing 450 145 ml of river water, respectively. All soil-only microcosms were normalized to 70 % water holding 146 capacity prior to setup, estimated by measuring the volume of water needed to saturate each soil 147 type and back-calculating the volume needed to perform the adjustment.

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149 *Microcosm experiment setup - Initial colonization phase*

One of our goals was to assess this microcosm design as a means to reproducibly capture microorganisms that can colonize and persist between divergent habitats. Experimental treatments are described throughout this paper as a *source* microbiome colonizing a sterile *recipient* environment. Treatments consisted of: 1) source farm soil to recipient river water, 2) source riverbed soil to recipient river water, 3) source river water to recipient farm soil, and 4) source river water to recipient riverbed soil. Our baseline controls include both a natural and sterile

version of soil-only and water-only treatments, which are defined further in the next section. All treatments and controls were replicated six times yielding 60 microcosms (and a total of 120 microcosms in the full experiment). Microcosms were randomized on a bench and incubated at a constant room temperature (24 °C) until harvest. The initial colonization phase of our experiment includes the day of microcosm setup (19 December 2020) to the end of the 31-day incubation period (19 January 2021). Our chosen timeframe has previously been shown to be sufficient for observing microbial recolonization of sterile soil in prior experiments (King *et al.*, 2022).

163

164 Microcosm experiment setup - Secondary transfer phase

165 Because there is a high degree of microbial dormancy and varying abundances of relic 166 DNA across habitats (e.g. up to 99% in soils; (Lebaron et al., 2001, Carini et al., 2016)), we sought 167 to maximize our capture of the active microbial pool by initiating a "secondary transfer phase". A 168 portion of the colonized recipient at the end of the initial colonization phase was transplanted into 169 a secondary sterile recipient of the same habitat type. For example, a recolonized recipient water 170 in the initial phase would be transferred into another sterile recipient water. The additional transfer 171 would allow putative habitat switchers to recolonize in an environment that is, at least initially, 172 free of dormant cells and relic DNA. Water inoculum at the end of the initial colonization phase 173 was transplanted to recipient sterile river water in a 1:10 dilution (45 ml in 405 ml), whereas a 5% 174 direct transfer of colonized soil (5 g) was transplanted into sterile recipient soil (95 g), as outlined 175 in Trexler & Bell (2019). Constructed microcosms were again randomized on a bench and allowed 176 to incubate for 21 d at room temperature, starting on day of transplant into the secondary sterile 177 recipient (19 January 2021) and ending the day of sample harvest (9 February 2021). All setup and 178 harvest procedures in both initial and secondary transfer phases were completed within 24 h.

180 Our baseline controls, which were incubated in parallel to experimental treatments, include 181 both a natural and sterilized version of soil-only and water-only treatments. Natural baseline 182 controls serve as a benchmark for comparing colonization dynamics in recipient environments 183 across habitats, while sterile baseline controls were used to identify any regrowth of sterilization-184 resistant taxa through the timeline of the experiment (sterile baseline control data is presented 185 exclusively in Supplementary Fig. 2). We define a natural baseline control as the regrowth of a 186 natural source environment into its sterilized habitat analogue throughout initial colonization and 187 secondary transfer phases of the experiment (for instance, source river water > recipient river water 188 (Initial colonization phase) > recipient river water (Secondary transfer phase)). This allows us to 189 compare the regrowth dynamics of a natural source microbiome in its recipient analogue, with that 190 of recipients from a divergent habitat source. By also including sterile baseline controls, we can 191 assess the regrowth of bacteria that were not removed during sterilization, though sequencing 192 depth in half of the sterile soil baseline controls was poor and the remainder were compositionally 193 distinct from experimental samples (Supplementary Table 5 and Supplementary Fig. 2A & 2B). 194 For sterile water baseline controls, the dominant genera found after regrowth were aquatic 195 microorganisms that have previously been observed to pass through 0.22 um filtration systems 196 (Supplementary Table 5 and Supplementary Fig. 2C & 2D). A total of 60 microcosms were 197 constructed at the secondary transfer phase of this experiment. Soil and water used to construct 198 secondary transfer microcosms were sterilized and handled using the same methodology outlined 199 in preparation for the initial colonization phase, and again analyzed for nutrient concentrations and 200 particle size post-sterilization by the Agricultural Analytical Services Laboratory at Pennsylvania 201 State University (Supplementary Tables 1 & 2).

10

203 DNA extraction and amplicon sequencing

204 All microcosm samples were collected within a UV-sterilized biological safety cabinet. At 205 the end of the initial colonization phase, after sacrificing a portion of water or soil to seed 206 secondary transfer phase microcosms, DNA was extracted using the NucleoSpin 96 Soil DNA 207 extraction kit (Macherey-Nagel; catalogue: 740787.2) directly from soil as per the manufacturer's 208 instructions and from water with the following modifications. Water samples at the end of 209 secondary transfer phase were collected by passing the remaining 405 ml of microcosm water 210 through 0.2 um cellulose nitrate filter membranes, which were then cut in half using sterile scissors 211 to fit into Type A bead tubes. Many water samples from water-soil microcosms at the end of the 212 initial colonization phase were un-filterable due to clogging, so to minimize extraction bias, DNA 213 was extracted from a pellet via centrifugation for all samples at this phase. These methods are 214 detailed (Supplementary Table 4) and represent data that is presented exclusively in supplementary 215 material. Bacterial composition was characterized with amplicon sequencing of partial 16S rRNA 216 gene fragments (515F and 806R) (Apprill et al., 2015, Parada et al., 2016). Raw data files in 217 FASTQ format were deposited in the NCBI sequence read archive under BioProject number 218 PRJNA798746.

219

220 PCR

Bacterial composition was characterized with amplicon sequencing of partial 16S rRNA gene fragments (515F and 806R) (Apprill *et al.*, 2015, Parada *et al.*, 2016). The PCR mix for reactions was as follows: 12 μ L of 5Prime HotMasterMix, 1.5 μ L of each primer (10 μ M), 1.5 μ L template DNA and 13.5 μ L molecular grade water for a final PCR volume of 30 μ L. Bacterial 16S

225 rRNA gene PCR cycling conditions were as follows: 3 min at 94°C, 25 cycles of: 45 sec at 94°C, 226 60 sec at 50°C, and 90 sec at 72°C, and a final elongation step of 10 min at 72°C. The resulting 227 amplicons were cleaned using Mag-Bind TotalPure NGS magnetic beads (Omega Bio-tek; 228 catalogue: M1378-01). Illumina indexes were added to the cleaned amplicons with the following 229 PCR ingredients: 12.5 μ L of Platinum II Hot-Start PCR Master Mix, 2.5 μ L of each index (10 μ M) 230 and 2.5 μ L of sterile water for a final volume of 20 μ L. The indexing PCR cycling conditions were 231 as follows: 1 min at 98°C, 8 cycles of: 15 sec at 98°C, 30 sec at 55°C, and 20 sec at 72°C, and a 232 final elongation step of 5 min at 72°C. Indexed amplicons were then normalized using the 233 SequalPrep normalization plate kit (ThermoFisher; catalogue: A1051001), pooled, concentrated 234 with a Savant SpeedVac (Thermo Scientific, Waltham, MA, USA) at 50 °C for 3 h, and purified 235 with a gel extraction using the PureLink Quick Gel Extraction Kit (ThermoFisher; catalogue: 236 K210012). The pooled library was sequenced on the Illumina V3 600 cycle MiSeq sequencing 237 platform (2 x 250bp yielding ~45,000 pairs of reads per sample) at the Pennsylvania State 238 University Genomics Core Facility (Huck Institutes for the Life Sciences).

239

240 Sequence analysis

Raw demultiplexed 16S rRNA gene data were processed using the Quantitative Insights into Microbial Ecology (QIIME 2 version 2021.4) pipeline (Bolyen *et al.*, 2019). Briefly, pairedended 16S rRNA gene sequences were imported and trimmed, and denoised using DADA2, which also removes chimeric sequences (Callahan *et al.*, 2016). The classify-sklearn qiime feature classifier was used to assign taxonomy against the Silva v.138 database (Quast *et al.*, 2013) at the single nucleotide threshold (amplicon sequencing variants; ASVs). The dataset was further cleaned by removing sequences identified as chloroplasts or mitochondria, and by removing ASVs with less than 48 (0.001 %) sequences for the 16S rRNA gene dataset (Bokulich *et al.*, 2013). The
cleaned 16S rRNA gene data were then rarefied at 3,670 sequences per sample.

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251 Statistical analysis

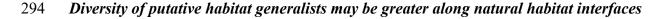
252 Processed sequencing data were imported into the R statistical environment v.4.2.1 (R Core 253 Team, 2012) and used to create a *Phyloseg* object (McMurdie & Holmes, 2013). Chao1 species 254 richness and Shannon's index (as a measure of richness and evenness) were used to estimate alpha 255 diversity in recipient environments colonized by divergent sources. Recipient river water 256 colonized by either source riverbed or farm soil, and the two recipient soil types colonized by river 257 water were tested for statistical differences with a Kruskal-Wallis test from the stats package, 258 followed by a Dunnett's post hoc test. To compare bacterial composition between microcosm 259 treatments, a Principal Coordinates Analysis (PCoA) was performed based on Bray-Curtis 260 dissimilarities using the "ordinate()" function in the *Phyloseq* package. Permutational multivariate 261 analysis of variance (PERMANOVA) using the "adonis2" function from the vegan package 262 (Oksanen et al., 2013) was used to determine the impact of recipient environment type 263 (explanatory variables) on bacterial composition of the colonizer communities (response variable). 264 P values were adjusted using the Bonferroni method (Jafari & Ansari-Pour, 2019) correcting for 6 265 comparisons. To identify taxonomic colonization trends across treatments, the total number of 266 unique ASVs in each recipient environment was quantified and summarized in a 4D Venn diagram. 267 Further, the relative abundance of ASVs at least 80% prevalent across all replicates of 268 experimental water and soil recipients was plotted to determine and visualize the taxonomic 269 classification of core colonizers.

270

271 **Results and Discussion**

272 Understanding the factors that shape the breadth of microbial habitat colonization has been 273 a paramount focus for decades from global (Lozupone & Knight, 2007, Nemergut et al., 2011) to 274 local scales (Wu et al., 2019), including how these patterns interface with ecological theory, for 275 example dispersal limitation and functional tradeoffs. It is therefore of interest to improve our 276 ability to predict which taxa are likely to be found in a particular niche, their potential functional 277 contributions under different environmental conditions, and the likelihood of microbial spillover 278 between divergent environments. In this proof-of-concept study, we develop a new system to 279 perform a reciprocal transplant between two natural soil types and river water, to assess 280 community-level patterns in microbial habitat switching. To comprehensively assess the 281 performance of this system for the first time, we focused on higher within-treatment replication 282 and testing of microbial composition at multiple experimental stages, rather than increasing the 283 number of source and recipient environments, which would be a target for future studies. We 284 define putative habitat-switching as a certain taxon being detected in a recipient environment 285 (colonized by a divergent source environment type) at the end of the secondary transfer phase 286 incubation period. Previous work has attempted to categorize microorganisms as specialists or 287 generalists based on the number of habitats they occupy in publicly available sequence data 288 (Monard et al., 2016, Delgado-Baquerizo et al., 2018); however, widespread variation in genomic 289 surveying methodologies and a lack of controlled environmental manipulations have made it 290 difficult to assess under which conditions microbial habitat switching between source and recipient 291 environments is phylogenetically restricted (exclusive to certain microbial lineages) or a broadly 292 acquired ability.

293



295 To explore the impact of soil origin on bacterial colonizer composition in a receiving 296 aquatic environment, we contrasted alpha diversity in the river water recipients colonized by two 297 soils, which were either in direct contact (riverbed soil) or farther away (farm soil) from a natural 298 river. We found higher species richness and evenness in water recipients colonized by a riverbed 299 soil (Shannon diversity; p = 0.003, Chao1; p = 0.002; Fig. 2A), suggesting the capacity for 300 microbial habitat switching could be greater when microorganisms exist at a contextual habitat 301 interface. Along a riverbed, the resident soil microbiome is forced to interact with river water, as 302 it introduces frequent but irregular fluxes in environmental conditions such as aqueous submersion, 303 oxygen gradients, dynamic or transient biodiversity deposits, nutrient economy, etc. Over time, 304 frequent environmental fluctuations may select for more generalist lifestyles due to heterogenous 305 conditions. In support of our data, Evans & Wallenstein (2012) found that microbiomes exposed 306 to a decade of experimentally-intensified precipitation in a grassland soil led to improved moisture 307 adaptation in laboratory microcosms and Porter & Rice (2013) identified differences in nickel 308 tolerance in *Rhizobium* species along a serpentine soil gradient. Improved community fitness or 309 plasticity is also observed in numerous adaptive laboratory evolution experiments under varying 310 environmental conditions (Dragosits & Mattanovich, 2013). In contrast, our chosen farm soil was 311 atop a hill and never subject to interactions with the river water. The historical differences in 312 environmental conditions between our soils could be a factor driving the lower diversity of 313 organisms able to colonize the recipient water when the source was a farm soil.

314

A central goal of this experiment was to assess the extent to which our microcosm approach can be used to capture putative habitat switchers across divergent environments, so we limited our diversity of source material (soil & water) to improve replication potential and validate our 318 microcosm system. As only one type of source river water was assayed, we were not able to 319 compare potentially similar patterns in the opposite direction of colonization (i.e., distinct source 320 water types on a common recipient soil). However, we examined alpha diversity in our divergent 321 soil recipients when colonized by a common source river water and found no significant difference 322 in species diversity or richness (Shannon diversity; p = 0.775, Chao1; p = 0.438; Fig. 2B). River 323 water microbiomes are likely to be more transient than a localized riverbed soil community 324 (Teachey et al., 2019) and therefore may not experience the same degree of environmental 325 conditioning to be able to switch efficiently between the water and various soils they encounter in 326 a stream. As an alternative hypothesis, there is some evidence of greater niche space and 327 phylogenetic diversity being found in sediments compared to soils, thus, the pool of organisms 328 with the potential to colonize water may have been larger in our riverbed soil, leading to higher 329 diversity in colonized water compared to when farm soil was the source (Lozupone & Knight, 330 2007, Thompson et al., 2017). However, we observed relatively similar starting species richness 331 and significant compositional differences between our natural source soil environments, 332 suggesting source diversity was not a confounding factor (Supplementary Fig. 3).

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334 *Recipient environment type structures microbial colonizer communities*

We sought to identify compositional overlap between endpoint communities, to examine the strength of environmental filtering when source microbiomes were introduced into recipient environments (Fig. 3; Table 1); (see Supplementary Fig. 1 for comparisons including "intermediate" communities at the end of initial colonization phase. Many microbial traits are conserved at different taxonomic levels based on their complexity (Martiny *et al.*, 2015). For example, pH tolerance, which can require cell membrane modification, and photosynthesis, which 341 involves numerous genes that are deeply conserved, while others can develop rapidly at shallow 342 taxonomic levels, such as viral resistance (Martiny et al., 2013, Martiny et al., 2015). Therefore, 343 we explored the phylogenetic levels at which recipient communities of water or soil were 344 statistically indistinguishable from each other, to explore the potential complexity of traits that 345 allow habitat switching. For source river water colonizing recipient farm or riverbed soils, we 346 identified significant differences between the community composition in recipient soil types up to 347 the Phylum level, which was the broadest taxonomic level that we assessed (Fig. 3A; Table 1). 348 These data suggest that edaphic properties are strong environmental filters for microbial 349 composition (soil property analyses in Supplementary Table 2) as identified in numerous previous 350 studies (Lauber et al., 2009, Leff et al., 2015, Delgado-Baquerizo et al., 2018), and that there does 351 not appear to be trait conservation. This is further supported by the patterns exhibited by the natural 352 baseline controls, which serve as a reference point for what the community would look like under 353 a self-colonization scenario. The deviation from the natural baseline indicates that the introduced 354 microbes from divergent source environments are responding to and interacting with the novel 355 environment (i.e., environmental filtering). For our two source soils colonizing recipient river 356 water, we identified significant compositional differences at finer taxonomic resolutions (ASV-357 Family), but not at the Order-Phylum levels (Table 1). These data suggest that the traits required 358 for water colonization, from two disparate soil sources, were conserved roughly at the Order level, 359 with the top three most abundant being Burkholderiales, Rhizobiales, and Micrococcales. Despite 360 the limitations of using phylogeny to identify trait-based conservation along environmental axes 361 (such as microbial habitat breadth), our findings show that microbial transfer between our aquatic-362 terrestrial environments is not evolutionarily trivial, as it was restricted to specific taxonomic 363 groups. The ecological attributes that enable microbial "habitat switching" (Supplementary Table

364 6) are not well-characterized, likely vary across types of environmental transitions, and could 365 consist of multiple traits rather than one alone, therefore, analyses at the community-level using 366 controlled manipulations and differentiating between active and dormant microbial pools is needed 367 to improve our modeling and prediction capability of where we might expect to find microbial 368 taxa across spatial and temporal scales.

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370

Core microbes were shared across environments

We surveyed taxa that were consistently found across both soil and water recipient 371 372 environments at the end of the secondary transfer phase as an indicator for microbial habitat 373 switching ability (i.e. growth or persistence in a novel environment). The most dominant taxa 374 across all soil or water recipients being Actinobacter or an unclassified genus in the 375 Comamonadaceae family respectively, (see Supplementary Figure 4 for top ten most abundant 376 taxa plots). Relative to the total richness of ASVs found in each recipient environment, a mere 18 377 (<1%) of them were shared (Fig. 4A). Of those, only two were at least 80% prevalent in replicates 378 of each recipient, an unclassified bacterial species in the Micrococcaceae family 379 (Actinobacteriota) and an unclassified bacterial species assigned to the Devosia genus 380 (Proteobacteria). The Devosia are a motile genus of bacteria widely reported in soil habitats. The 381 Devosia are known for their ability to break down an array of hydrocarbons and have a high degree 382 of genetic promiscuity via horizontal gene transfer (Rivas et al., 2002, Talwar et al., 2020), which 383 would support the potential proclivity toward a generalist lifestyle. However, it represented an 384 extremely low percent relative abundance in each sample (Fig. 4B) and may be bacterial 385 persistence rather than adaptation and active growth, despite our efforts to differentiate between 386 these fractions by initiating a secondary transfer phase. While the exact mechanisms that govern 387 bacterial genome size are not comprehensively understood, larger or smaller genome sizes have 388 been associated with generalist or specialist lifestyles respectively (Gweon et al., 2017, Sriswasdi 389 et al., 2017, Bell & Bell, 2021). Bacterial and Archaeal genomes can range from 100 kbp to 16 390 Mbp (Garcia et al., 2014, Rodríguez-Gijón et al., 2022), and genome size has also been found to 391 vary according to habitat type (Beier et al., 2022). While categorizing generalist or specialist 392 lifestyles is not as straightforward as establishing a size threshold, when BLASTing the 393 representative sequences for our two universal ASVs they had estimated genome sizes of 4.5 Mbp 394 (Actinobacteriota; CP066362.1; E-value of 3e⁻¹²⁷) and 5.8 Mbp (Devosia; MT239494.1; E-value 395 of 3e⁻¹²⁷), aligning with those of other microbial genera broadly linked with generalist life histories, 396 suggesting functional potential for our core microbes to adapt to environmental novelty. For 397 instance, Barberán et al., (2014) found that the ubiquity and habitat breadth of soil dwelling bacteria 398 was positively correlated with genome size.

399

400 **Conclusions**

401 A growing body of work attempts to map microbiome composition to ecosystem functions such 402 as nitrogen fixation or decomposition rates, which can be particularly useful when assessing the 403 health and productivity of managed systems (e.g. agriculture) or predicting ecosystem response 404 under global change conditions (Wang & Xue, 2021). But while the relatively low cost of high-405 throughput sequencing has made it a common tool in estimating microbial presence in natural 406 environments, it remains challenging to predict ecosystem function from this information alone 407 (Morris *et al.*, 2020, Wemheuer *et al.*, 2020).

408

While our study focuses mainly on microbial presence and observable habitat switching, it lays the foundation for this microcosm approach to be coupled with additional techniques, such as enzyme assays, stable isotope probing (SIP), or multi-omics to enhance our understanding of active

412 microbial communities. These techniques can be specifically tailored to assess the functional 413 attributes of active microbial communities, but they often face challenges due to signals from relic 414 DNA or dormant cells. Our method of active capture has the potential to limit some of these 415 challenges by enriching for active colonizing microbes, and in combination with other techniques, 416 could provide additional insights between microbiome composition, microbial activity, and 417 ecosystem functionality. Further, it could provide a means to cross-validate the results generated 418 by other methods intended to distinguish between active, dormant, and dead cells. Bioorthogonal 419 noncanonical amino acid tagging (BONCAT), for instance, is a cutting edge method that uses 420 translational incorporation of a noncanonical amino acid probe into cellular proteins, followed by 421 azide-alkyne click-chemistry to detect metabolically active bacteria (Couradeau et al., 2019). 422 However, it lacks a reliable benchmark for quantifying microbiome constituents that are not 423 captured by the method (e.g., microorganisms that might be metabolically active but not 424 undergoing protein synthesis or are fundamentally incompatible with the chosen amino acid 425 probe).

426

427 Our method provides a potentially scaleable approach to physically capture subsets of a 428 microbiome with an ecological trait of interest, allowing for active microbial pools to be cross 429 compared with other existing methods. Together, this research and future studies can further our 430 understanding of the likelihood that soil microbial composition in one environment could impact 431 function and composition in connected systems. Future studies may also consider including 432 multiple reciprocal inoculations to apply stronger selection for taxa that can consistently switch 433 between and actively grow in divergent source and recipient environments, while further excluding 434 those that persist alone.

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440

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445

446 Author Contributions

447 SCR and THB designed the experiment, analyzed the data, and wrote the manuscript, 448 incorporating edits and feedback from contributing authors. SCR and WLK set up microcosms, 449 and prepared and submitted samples for sequencing. SCR and JLS generated the microbial 450 prevalence analyses.

451

452 **Conflict of Interest**

453 None declared.

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455 References

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