# 1 SPECIES-SPECIFIC ROOT MICROBIOTA DYNAMICS IN

# 2 **RESPONSE TO PLANT-AVAILABLE PHOSPHORUS**

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#### 62 **SUMMARY**

Phosphorus (P) is a limiting element for plant growth. Several root microbes,
 including arbuscular mycorrhizal fungi (AMF), have the capacity to improve
 plant nutrition and their abundance is known to depend on P fertility. However,
 how complex root-associated bacterial and fungal communities respond to
 changes in P availability remains ill-defined.

- We manipulated the availability of soil P in pots and compared the root
   microbiota of non-mycorrhizal Arabidopsis with mycorrhizal Petunia plants.
   Root bacteria and fungi were profiled using ribosomal operon gene fragment
   sequencing, we searched for P sensitive microbes and tested whether a P
   sensitive core microbiome could be identified.
- Root microbiota composition varied substantially by P availability. A P
   sensitive core microbiome was not identified as different bacterial and fungal
   groups responded to low-P conditions in Arabidopsis and Petunia. P sensitive
   microbes included Mortierellomycotina in Arabidopsis, while these were AMF
   and their symbiotic endobacteria in Petunia. Of note, their P-dependent root
   colonization was reliably quantified by sequencing.
- The species-specific root microbiota dynamics suggest that Arabidopsis and
   Petunia evolved different microbial associations under the selection pressure of
   low P availability. This implies that the development of microbial products that
   improve P availability requires the consideration of host-species specificity.

# 83 KEY WORDS

- 84 Arabidopsis thaliana, arbuscular mycorrhizal fungi (AMF), endobacteria, Petunia
- 85 *hybrida*, phosphate, root microbiota

#### 86 **INTRODUCTION**

87 Phosphorus (P) presents one of the key nutrients for plant growth. While a small 88 fraction of soil P is directly available for plant uptake, the larger fraction is complexed 89 to organic and mineral soil components and therefore inaccessible for plants. The conventional agronomic solution to increase P availability for plants relies on 90 91 supplementing mineral phosphate ( $PO_4^{3-}$ ). However, yield optimization requires excess 92 application of phosphate since less than thirty percent of applied P fertilizers effectively 93 support plant growth, the rest of the applied phosphate readily transforms to plant non-94 available P forms (Cordell et al., 2009). Such an overuse causes the rapid depletion of 95 finite phosphorus reservoirs, is expensive and causes environmental harm, primarily 96 with negative impacts on the aquatic environment by eutrophication of the surface 97 water (Cordell et al., 2009; Scholz & Wellmer, 2013; Reijnders, 2014). Therefore, next-98 generation agriculture requires novel sustainable solutions that reduce fertilizer inputs 99 and increase the nutrient-use efficiency while maintaining high plant yields.

100 Numerous root-associated microbes have the capacity to mobilize soil P or 101 metabolize recalcitrant forms (Gyaneshwar et al., 2002; Jacoby et al., 2017), thereby enhancing plant performance and agricultural yield especially under nutrient limiting 102 103 conditions. For fungi, there is a continuum of functionally similar associations between 104 different groups of root fungi and their host plant species (van der Heijden et al., 2017). 105 For instance, arbuscular mycorrhizal or ectomycorrhizal fungi are intimately connected 106 to plant roots and support plant growth by mobilizing and transporting P from a larger 107 soil volume and more distant pools of P thanks to their large hyphal network, (Jakobsen et al., 1992). Aside from these classical mycorrhizal plants, also nonmycorrhizal plants 108 109 such as Arabidopsis thaliana [hereafter: Arabidopsis] and Arabis alpina rely on fungal 110 associations for nutrient acquisition (Cosme et al., 2018). They rely on beneficial fungal 111 endophytes including Colletotrichum tofieldiae (Hiruma et al., 2016), Serendipita 112 indica [formerly Piriformospora indica] (Yadav et al., 2010) or a fungus of the order 113 Helotiales (Almario et al., 2017). Typically, the P availability in soil determines to 114 which extent a plant is colonized by the fungal symbiotic partner with high levels of 115 colonization under low-P conditions and little colonization in soils with high-P levels. 116 In addition to fungi, many root bacteria are known to support plant nutrition with their 117 abilities to solubilize inorganic P or to mineralize organic P (Rodríguez & Fraga, 1999; 118 Alori et al., 2017). Powerful P solubilizing bacteria include strains from the genera

Bacillus, Pseudomonas and Rhizobium; for a more comprehensive list as well as their growth effects on crops, we refer to Alori *et al.* (2017). While a wide range of individual rhizosphere microbes is known to support plant P nutrition, the effects of P availability on the overall root microbiota remains less understood. A deeper understanding of interactions between plants and their microbial allies in response to the bioavailability of P is needed for developing microbe-dependent P fertilization solutions (Schlaeppi & Bulgarelli, 2015; Busby *et al.*, 2017).

126 Interactions among microbes emerge as a critical component for the 127 maintenance of host-microbial homeostasis and for plant performance (Hassani et al., 128 2018). Inter-kingdom microbial associations occur in the plant root microbiota as for 129 instance root fungi hosting endobacteria in their cells (Desirò et al., 2014). Such ancient 130 fungi-endobacteria interactions (Bonfante & Desirò, 2017) include root fungi of the 131 Mucoromycota (Spatafora et al., 2017) that host diverse bacterial endosymbionts related to Burkholderia or Mycoplasma. An example of Burkholderia-related 132 133 endobacteria includes Candidatus Glomeribacter gigasporarum that is hosted by a 134 Glomeromycotina fungus (Bianciotto et al., 2003). Mycoplasma-related endobacteria 135 have a broader host range with presence in Glomeromycotina (Naumann et al., 2010), 136 Mortierellomycotina (Desirò et al., 2018) and Mucoromycotina (Desirò et al., 2015). The occurrence and functional contribution of fungal endobacteria adds a further level 137 138 of complexity to the interactions of plant with and among their associated microbes.

139 Plants are more and more recognized in context with their microbial 140 communities, where a multitude of microbes collectively function as a microbiome. P 141 fertilization as well as P depletion are known to induce shifts in soil microbial 142 communities (Wakelin et al., 2012; Leff et al., 2015; Huang et al., 2016; Bergkemper 143 et al., 2016; Ikoyi et al., 2018). For example, grassland soil microbes consistently 144 responded to phosphate inputs with compositional community changes, as for instance 145 mycorrhizal fungi, oligotrophic bacteria and methanogenic Archaea decreased in 146 relative abundance with nutrient additions (Leff et al., 2015). While the responses of 147 soil microbial communities to varying levels of different sources of P have been well studied, the plant root-associated microbial communities have received less attention 148 149 (Silva et al., 2017; Almario et al., 2017; Robbins et al., 2018). Robbins et al., (2018) 150 investigated the effects of different levels of P fertilization on the Arabidopsis 151 rhizosphere and root microbiota. While phosphate applications had little effects on 152 microbial diversity, they affected more strongly the plant-associated microbiota

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153 compared to bulk soil communities, suggesting plant-mediated cues for structuring the 154 plant microbiota in response to the nutritional status. The authors noted a weak P-155 fertilization effect on root communities that was manifested by low-abundant root-156 associated microbes. This suggests P to be a minimal driver in shaping microbial 157 communities compared to larger drivers such as compartment (soil vs. rhizosphere, 158 rhizoplane, and roots) or soil type (soils differing chemically, physically and with 159 regard to their microbiota; Hacquard et al., 2015). The work on model non-mycorrhizal 160 plants revealed subtle responses of the root microbiota to the availability of soil P; 161 further work is needed to test whether mycorrhizal plants exhibit stronger root 162 microbiota responses thanks to their colonizing symbionts.

163 Petunia x hybrida [hereafter: Petunia] is a model plant that is commonly used for investigating the symbiosis with arbuscular mycorrhizal fungi (AMF, Wegmüller et 164 165 al., 2008; Breuillin et al., 2010). Due to its fast life cycle, modest size and the 166 availability of genetic tools made, Petunia is also a model to study plant development 167 (Vandenbussche et al., 2016), plant nutrition (Liu et al., 2018) and hormonal signaling 168 (Hamiaux et al., 2012). Petunia belongs to the Solanaceae family, thus is related to 169 tomato, potato and eggplant so that root microbiota knowledge may be transferable to 170 these staple food crops. We therefore chose Petunia in comparison with non-171 mycorrhizal Arabidopsis to study root microbiota dynamics in response to P availability in soil and how plants cope with P limiting conditions. 172

173 In this study, we tested the hypothesis that the composition of the root 174 microbiota alters depending on the P availability and we asked whether a core microbiome or plant species-specific microbiomes prevail in response to P deficiency. 175 176 We expected the Petunia root microbiota to enrich for AMF under low-P conditions, 177 whereas the Arabidopsis response to low-P remained unclear. Hence, while differential 178 fungal responses were anticipated for the two plant species, we were interested in their 179 bacterial responses and whether a different sets of bacteria will respond to the varying 180 levels of P availability. A particular goal of the study was to uncover the interplay 181 between root bacteria and fungi and we examined their co-occurrence patterns in 182 response to the varying P availability. We expected to find potential microbial 183 interactions and hypothesized that the root microbiota data contains paired sequence 184 information of fungal endobacteria and their corresponding host fungi. A technical goal 185 of this study was to quantify AMF colonization in the context of whole fungal diversity

186 based on DNA-based sequencing instead of the traditional morphological187 quantification by microscopy.

This study reveals that root microbiota composition varies markedly by P availability in soil and that different fungal and bacterial groups are responsive to low-P conditions in Arabidopsis and Petunia. We find co-abundant groups of candidate microbial cooperation partners, including AMF and their symbiotic endobacteria, both known to support plant growth under low-P conditions. Our work suggests that Arabidopsis and Petunia have evolved individual microbial solutions, involving multitrophic microbial interactions, to cope with low-P conditions.

#### **MATERIAL AND METHODS**

#### 196 PLANT GROWTH

197 The experiment was conducted in 400 ml pots lined with a mesh (Trenn-Vlies, 198 Windhager, Thalgau, Germany). Soil was collected on April 4<sup>th</sup> 2014 from a field site 199 (47°26'20" N 8°31'40" E), sieved to 2 mm and stored at 4°C until use. Soil was mixed 200 1:1 volume with sterilized quartz-sand. Chemical properties of the sand-soil mixture 201 were analyzed at the Labor für Boden- und Umweltanalytik (Eric Schweizer AG, Thun, 202 Switzerland): pH 6.8, 6/31/51% (clay/silt/sand) and 1.4/1.05/1.07 mg kg-1 (water-203 extractable N/P/K).

204 Petunia seeds were surface sterilized with 70% ethanol, washed with autoclaved 205 water and plated on 1/2 strength Murashige and Skoog basal medium (Sigma, Buchs, 206 Switzerland) supplemented with 1.5% sucrose and solidified with 1.5% agar. Plants 207 were germinated under long-day conditions (16-h photoperiod) in climate chamber 208 (Sanyo MLR-352H; Panasonic, Osaka, Japan) at 25°C and 60% relative humidity. 209 After 7 days, seedlings were transferred to 400 ml pots filled with substrate. Plants were 210 grown for two weeks in the same climate chamber then moved to an in-house climate 211 chamber with same humidity, photoperiod and temperature. Plants were fertilized with 212 a corrected Petunia nutrient solution (Reddy et al., 2007), prepared with three 213 concentrations of phosphate: 0.03 mM KH<sub>2</sub>PO<sub>4</sub> (low-P), 1 mM KH<sub>2</sub>PO<sub>4</sub> (medium-P) 214 and 5 mM KH<sub>2</sub>PO<sub>4</sub> (high-P). Each plant received 300 ml of the solution over the last 215 six weeks before harvest. We conducted two separate experiments using the same 216 treatments and growth conditions, the first to collect the plant root samples (DNA 217 analyses and microscopy) and shoot biomass and a second experiment to quantify leaf 218 nutrient levels.

# 219 SAMPLE COLLECTION

Plants were harvested at 10 weeks. The roots were separated from the shoot with a clean scalpel. The shoots were dried in a 60° C oven for dry weight analysis. The loosely attached soil was shaken from the roots, the roots were washed three times in PBS buffer (approximately 10 ml for 1 g of fresh weight) and then split into two equivalent subsamples. Samples for DNA extraction were stored at -80°C until processing. Samples for microscopy were stored in 50% ethanol. After staining with pen ink (Vierheilig *et al.*, 1998), root length colonization was determined using the

227 magnified intersections method for 100 intersections per sample (McGonigle *et al.*,

1990). Soil from unplanted pots was collected by removing the top 1 cm layer and then

- 229 mixing the soil below, one sample (250 mg 500 mg) was taken from each pot.
- 230 The dried shoots were weighed and milled. P and K concentrations were analyzed using
- 231 inductively coupled plasma-optical emission spectroscopy (ICP-OES) at the elemental
- analytic department of Agroscope according to (VDLUFA-Verlag, 2006).

#### 233 MICROBIOTA PROFILING

234 The protocol for microbiota profiling, including DNA extraction, PCR, 235 sequencing and bioinformatics, is described in detail in Methods S1. The comparison 236 of the PCR approaches is reported in Notes S1, which contains the bioinformatic script, 237 input data, analysis script and the markdown report. The bioinformatic analysis of the 238 main samples of the study is documented with the scripts, parameters, support and 239 report files in Notes S2. The raw sequencing data of the MiSeq runs and the SMRT 240 sequencing are available from the European Nucleotide Archive ENA under the study 241 accession PRJEB27162.

#### 242 STATISTICAL ANALYSES

243 Statistical analyses were performed using R v3.3.2 (R Core Team, 2016) within 244 Rstudio (RStudio Team, 2015). The effects of P availability on dry weight, P content 245 and K content were assessed with a linear model. Dry weight data was log-transformed 246 to satisfy the assumptions of the linear model (normality of residuals and 247 homoscedasticity). To test for the effect of P availability on AMF colonization, a 248 generalized linear model was fitted with quasibinomial distribution to account for 249 overdispersion. Rarefaction curves were prepared with the function 'rarecurve' from 250 vegan (Oksanen et al., 2018). For alpha diversity, the data was rarefied to 15'000 sequences 500 times. For each subsample, several diversity indices were estimated: 251 252 richness (S) is the number of OTUs, H is the Shannon index from which D=exp(H) was 253 calculated (Jost, 2007), and Sheldon evenness is  $E = \exp(H)/S$  (Sheldon, 1969). 254 ANOVA was used to assess the effect of P a and plant species on the mean of the 500 255 subsamples for each sample. For the rest of the analysis, the data was filtered (at least 256 4 sequences per sample in 4 samples) to remove low abundant OTUs. The effects of P 257 availability and plant species on community composition were assessed with 258 permutational multivariate analysis of variance (PERMANOVA) of Bray-Curtis 259 dissimilarities and visualized with principal coordinate analysis (PCoA) using vegan

and phyloseq (McMurdie & Holmes, 2013). The effect of P availability on abundance of each OTU was investigated with edgeR (Robinson *et al.*, 2010) on TMM-normalized data (Robinson & Oshlack, 2010) and visualized with ternary plots. TMM-normalized data was used to calculate Spearman rank correlations between OTUs for co-occurrence networks. Positive ( $\rho$ >0.7) and significant relationships (P<0.001) were visualized with igraph (Csardi & Nepusz, 2006). Scripts, functions and support files are available as **Notes S3. Figure S1** visualizes the workflow of the analysis steps.

#### 267 IDENTIFICATION OF ENDOBACTERIA

268 We describe the identification of endobacteria OTUs using a phylogenetic 269 placement approach in Methods S1. Briefly, we pre-selected candidates in the 270 microbiome dataset using two approaches and then validated their representative 271 sequences by fine mapping to a reference tree of known endobacteria sequences. The 272 first approach was based on sequence clustering and for the second, we employed co-273 occurrence characteristics from network analysis. Command line and analysis code in 274 R (including markdown report) as well as the database with curated endobacteria 275 16S rDNA reference sequences are available as Notes S4.

#### 276 **Results**

#### 277 EXPERIMENTAL SETUP FOR MANIPULATING PHOSPHATE LEVELS

278 We investigated the dynamics of the root-associated microbiota to the 279 availability of soil P and compared the non-mycorrhizal model species Arabidopsis to 280 Petunia, which forms symbiosis with AMF. Plants were sown in a field soil that was 281 amended with sand and we manipulated soil P availability by applying low, medium or 282 high levels of phosphate. Unplanted pots were included as controls to collect soil 283 samples. We first confirmed the effectiveness of the applied phosphate levels and found 284 that phosphate treatments positively affected plant growth (Fig. 1a), increased P levels 285 in plant leaves (Fig. 1b), while reducing the AMF colonization levels in Petunia roots 286 (Fig. 1c). As we manipulated soil P levels using simple K salts, we tested if the low-P 287 condition would also be limited in potassium. Since the plants growing in low-P 288 conditions were sufficiently supplied with K (Fig. 1d), we concluded that the simple 289 approach of using KH<sub>2</sub>PO<sub>4</sub><sup>3-</sup> solutions permitted to establish a P gradient without 290 causing K limiting conditions.

#### 291 PROFILING SOIL AND ROOT MICROBIAL COMMUNITIES

First, we evaluated the following PCR approaches to profile root fungal communities: ITS1F and ITS2 (McGuire *et al.*, 2013a), fITS7 and ITS4 (Ihrmark *et al.*, 2012a) and ITS1F with the reverse complement of fITS7. Community profiles were inspected for the proportions of plant and AMF sequences as well as for fungal diversity. We selected ITS1F and ITS2, because this PCR approach captured low levels of plant sequences at good coverage of AMF and highest levels of taxa richness (**Fig. S2**, See **Notes S1** for a detailed comparison of the PCR approaches).

We then characterized soil and plant root-associated bacterial and fungal communities by sequencing amplicons of the 16S rRNA gene and the internal transcribed spacer (ITS) region 1, respectively. We obtained 2'196'310 high-quality bacteria sequences with a median of 36'718 sequences per sample and 3'809'350 highquality fungal sequences with a median of 54'337 sequences per sample. Bacterial and fungal sequences clustered into 3'701 bacterial operational taxonomic units (bOTUs) and 1'688 fungal OTUs (fOTUs), respectively.

306 Soil bacteria comprised abundant Acidobacteria, Actinobacteria, Firmicutes,
 307 Deltaproteobacteria and Verrucomicrobia, whereas plant roots were mainly colonized

by Betaproteobacteria, Gammaproteobacteria and Bacteroidetes (Fig. 2). The bacteria
community composition at Phylum rank was not markedly different between
Arabidopsis and Petunia.

311 For fungi, Ascomycota and Basidiomycota were abundant in soil and Petunia 312 root samples (Fig. 2). Mortierellomycotina were particularly abundant in soil fungal 313 communities, whereas a high number of Glomeromycotina was found in Petunia roots, 314 which varied as a function of the applied phosphate levels. Consistent with the levels 315 of AMF root colonization measured by microscopy (Fig. 1c), Glomeromycotina were 316 most abundant in Petunia roots under low-P conditions and decreased in proportion 317 with increasing P availability (Fig. 3a). The cumulative relative abundance of Glomeromycotina sequences was significantly positively correlated (adj.  $R^2 = 0.59$ ; P 318 319 < 0.001) with the rate of AMF root colonization as assessed by microscopy (Fig. 3b). 320 We noted that the root fungal community of Arabidopsis was dominated by sequences 321 belonging to Olpidiomycotina. Most of these sequences belonged to fOTU1 (assigned 322 to Olpidium brassicae), which accounted for 94.50% of the sequences in Arabidopsis 323 but only 0.79% of the sequences in Petunia samples. To exclude that this is a technical 324 peculiarity of MiSeq, we confirmed the dominance of O. brassicae by sequencing the 325 entire ITS region (PCR primers ITS1F and ITS4) using SMRT sequencing (Fig. 2c). 326 We refer to the Notes S5 for the detailed comparison of the sequencing approaches. In 327 brief, the SMRT-sequencing based community profiles also avoided amplifying plant 328 sequences while abundantly capturing the AMF. Both methods have their inherent 329 technical advantages with the MiSeq approach offering enhanced throughput and 330 sampling depth, whilst the SMRT-sequencing method provides enhanced taxonomic 331 resolution. Albeit a few quantitative differences, the two approaches reproduce overall 332 similar taxonomic compositions and revealed remarkably similar biological patterns 333 (Notes S5).

#### 334 PHOSPHATE INDUCED VARIATION IN MICROBIAL DIVERSITY

In the following, we used the MiSeq-based fungi profiles as they were obtained using the same sequencing platform as the bacteria and because of the enhanced sequencing depth. Bacteria and fungi richness was highest in unplanted soil, followed by Petunia and then Arabidopsis roots (**Fig. S3**). ANOVA confirmed the effect of plant species on alpha diversity for both bacteria and fungi and further uncovered an effect by the different P availability on the bacteria community (**Fig. S4**, **Table S1**). Bacterial

richness, diversity and evenness were generally higher in Petunia compared to
Arabidopsis and generally increased with increasing P concentrations. With the
dominance of *O. brassicae*, fungal richness, diversity and evenness were markedly
lower in Arabidopsis compared to Petunia.

345 Utilizing principal coordinate analysis (PCoA) of Bray-Curtis dissimilarities, 346 we found compositional differences in microbial communities due to the tested 347 experimental factors sample type, plant species and P availability (Fig. 4). Consistent with previous work (Bulgarelli et al., 2012; Hartman et al., 2018), bacteria and fungi 348 349 differed markedly between the sample types of unplanted soil and roots (Fig. S5). With 350 regard to plant species, fungal communities were more divergent between Arabidopsis 351 and Petunia roots compared to bacteria communities (Fig. 4), possibly reflecting their 352 opposite behavior with AMF. Permutational multivariate analysis of variance 353 (PERMANOVA), finding significant plant species effects on both bacterial and fungal 354 communities (Table S2), confirmed that plant species explained more variation for 355 fungi (53% of variation) compared to bacteria (14%).

356 The effects of P availability were apparent in bacterial communities of both 357 Arabidopsis and Petunia by clustering following the gradient in phosphate levels (Fig. 358 4A), whereas for fungi, this was only manifested in Petunia (Fig. 4B). PERMANOVA 359 confirmed a significant P availability effect for the bacteria (Table S2). To approximate 360 the effect sizes of P availability on the Petunia and Arabidopsis root microbial 361 communities, we inspected the R2 values of PERMANOVA applied to the data of each 362 plant separately. While P availability explained 14.1% and 13.3% of variation in 363 Petunia root bacterial and fungal communities, respectively, it accounted for 15.0% and 364 21.7% of variation in the Arabidopsis root microbial communities (**Table S3**). This 365 indicates that varying P availability in soil can account for about 15% of variation in 366 plant root microbiota composition.

#### 367 IDENTIFYING PHOSPHATE SENSITIVE MICROBES

Next, we identified P sensitive OTUs – OTUs being differentially abundant between low and high-P conditions – using edgeR (Robinson *et al.*, 2010). In total we found 2.2% bOTUs and 6.3% fOTUs responsive to the varying P availability in Petunia, while 3.1% bOTUs and 13% fOTUs were sensitive in Arabidopsis (**Fig. 5a**, **Table S4**). With the exception of four bOTUs, different sets of P sensitive bacteria and fungi OTUs were found for Arabidopsis and Petunia, suggesting that the two plant species have 374 differential microbial responses to low-P conditions. Among the four shared bOTUs 375 was a prominent Dechloromonas sp. (bOTU2), which is more abundant under low-P 376 conditions in both plant species (Fig. 5b). Bacteria from different taxonomic lineages 377 were abundant under low or high-P conditions (Table S4). The most abundant 378 Arabidopsis root bacteria included also Burkholderiales. Bdellovibrionales and 379 Rhodocyclales under low-P conditions, whereas taxa from the Chthoniobacterales, 380 Planctomycetales and Verrucomicrobiales were enriched under high-P conditions. 381 Under low-P conditions, the abundant Petunia root bacteria included members of the 382 Burkholderiales and Rhodocyclales, whereas under high-P conditions, a slightly 383 different set of bacteria, including a Flavobacterium sp. (Flavobacteriales), a Tahibacter 384 sp. (Xanthomonadales) and members of the Verrucomicrobiales were abundant. 385 Examples of highly abundant and low-P specific Burkholderiales and Rhodocyclales 386 members include a Dechloromonas sp. (bOTU2) and a Candidatus Accumulibacter 387 (bOTU13, Fig. 5b). Among the Petunia root bacteria, which are enriched under low-P 388 conditions, we noticed an bOTU assigned to Candidatus Glomeribacter gigasporarum 389 (bOTU134, Fig. 5b), which presents an endobacterium associated with lineages in the 390 AMF family Gigasporaceae (Bianciotto et al., 2003).

391 Similar to bacteria, different fungal lineages responded to low or high-P 392 conditions in Arabidopsis and Petunia (Table S4). In Arabidopsis, besides many low 393 abundant and often taxonomically poorly resolved fungi, the distinct group of 394 Mortierellomycotina (e.g., fOTU7, Fig. 5c) was enriched under low-P conditions. 395 Under high-P conditions, the abundant fungi O. brassiceae (Olpidiales, fOTU2, Fig. 396 5c), Hygrophoraceae sp. (Agaricales, fOTU10) and Cadophora sp. (Helotiales, 397 fOTU14) were found besides numerous low abundant fOTUs. While in Petunia only a 398 handful of diverse and low abundant fungi were enriched under high-P conditions, we 399 found a large group of 28 mycorrhizal fOTUs enriched in the low-P treatment (Table 400 S4). These mycorrhizal fOTUs belonged mostly to the order Glomerales and included 401 numerous abundant members such as Funneliformis and Glomus spp. (e.g., fOTU6 in 402 Fig. 5c).

403 PHOSPHATE-INDUCED DYNAMICS IN MICROBIAL ABUNDANCE

Finally, we utilized co-occurrence network analysis to find pairs or groups of microbes with a similar abundance behavior along the gradient of plant-available P. Co-abundance presents a pre-requisite for cooperation among microbes and we

407 speculated to identify possible candidate cooperation partners that may contribute to 408 support plant growth under low-P conditions. Figure 6a visualizes the significant 409 positive pairwise correlations between root microbiota members (bOTU-bOTU, fOTU-410 fOTU and bOTU-fOTU) of Petunia and Arabidopsis growing in conditions with low, 411 medium or high-P availability. We then partitioned the network into discrete 412 community modules and mapped the P-sensitive bOTUs and fOTUs into the network 413 and modules. While we did not find groups of co-occurring OTUs (=modules) that were responsive to high-P conditions, we found two major modules, 'M1' and 'M26', that 414 415 comprised high proportions of P-responsive OTUs (Fig. 6b) being specifically 416 abundant under low-P conditions (Fig. 6c). The module 'M1' comprised only bacteria, 417 mainly belonging to the Betaproteobacteria orders Burkholderiales and Rhodocyclales (Table S5). In contrast, the module 'M26' grouped a set of five taxonomically diverse 418 419 bacteria lineages with a large set of fOTUs primarily belonging to the order Glomerales 420 (Table S5). These fOTUs represented almost all AMF fOTUs in the dataset (Table S5) 421 and interestingly, they co-occurred with the Candidatus Glomeribacter bOTU134.

422 The same analysis was conducted for Arabidopsis and revealed a module 'M27' 423 with co-occurring bacteria and fungi OTUs that were specifically abundant under high-424 P conditions (Fig. 6, Table S5). This module grouped diverse bacteria members 425 including Planctomycetes and Verrucomicrobia and a diverse set of fungi. The module 426 'M19' held low abundant and taxonomically diverse bacteria and fungi that favored 427 intermediate P-levels. The module 'M4' comprised abundantly co-occurring bacteria 428 and fungi under low-P conditions, belonging mainly to diverse Proteobacteria and 429 Ascomycota or unknown fungi, respectively. With the exception of a few bacteria, the 430 low-P responsive modules of Arabidopsis and Petunia had specific compositions (Fig. 431 6d), which is consistent with the species-specific root microbiota dynamics to low-P 432 condition.

433 Microbes that simultaneously co-occur with many others are often referred to keystone taxa as they may play an important ecological role by determining community 434 435 dynamics and microbiome functioning (Banerjee *et al.*, 2018). We identified keystone 436 OTUs, defined based on their high degree of co-occurrence, for the Arabidopsis and 437 Petunia root microbiota networks (Table S5). While all Arabidopsis keystone OTUs belonged to the high-P module 'M27', we found keystone OTUs in the low-P 438 439 responsive module 'M26' of Petunia. These low-P responsive keystone OTUs were the 440 Glomeromycotina fOTU6 and fOTU111 as well as fOTU109 of unknown taxonomy.

#### 441 ENDOBACTERIA

442 To understand whether bacterial communities associated with the Arabidopsis 443 or Petunia root microbiota could include fungal endobacteria, we aligned candidate 444 bOTU sequences to a database of curated endobacteria sequences (see methods). Phylogenetic placement confirmed bOTU134 as Candidatus Glomeribacter closely 445 446 related to one hosted in Scutellospora pellucida (Figs. 7a, S6, S7). In addition, we 447 identified two bOTUs (330 and 778) mapping to Mycoplasma-related endobacteria 448 identified in the AMF species Claroideoglomus claroideum and C. etunicatum, 449 respectively. Although these two bOTUs do not belong to the 'AMF module M26' of 450 Petunia, they were, similar to bOTU134, significantly higher in abundance under low-451 P conditions (Table S3). Phylogenetic placement analysis revealed six additional Burkholderia- and two Mycoplasma-related endobacteria OTUs (Figs. 7, S6), however 452 453 as they were detected with only a handful of reads in a few samples, we did not include 454 them for network analysis (see Notes S4 for details). The use of microbiota network 455 characteristics was generally not indicative for identifying endobacteria OTUs, by 456 contrast the clustering-based approach proved to function well (Figs. S6, S7, Notes S4). 457 In summary, the combined sequencing of bacteria and fungi permitted to identify three 458 endobacteria OTUs that had a consistent abundance behavior with their mycorrhizal 459 hosts along the P-gradient.

#### 460 **DISCUSSION**

461 In this study, we revealed the dynamics of the root microbiota of non-462 mycorrhizal Arabidopsis and mycorrhizal Petunia plants along a gradient of plant-463 available P in soil. We demonstrate that the composition of the root microbiota alters 464 depending on P availability and we revealed species-specific microbial patterns in response to low-P conditions. Under low-P conditions, we confirmed a substantial 465 466 colonization by AMF in Petunia together with numerous bacteria of the Burkholderiales 467 and Rhodocyclales, whereas Arabidopsis roots hosted mainly Mortierellomycotina 468 fungi and abundant bacteria from the Burkholderiales, Bdellovibrionales and 469 Rhodocyclales. However, the root microbiota of the two plants contained different 470 members (bOTUs) of these taxonomic lineages. These groups of P-sensitive microbes 471 responded simultaneously to the different levels of P availability. Among these co-472 occurring microbes, we found fungal endobacteria and their corresponding hosts, 473 presenting a well-known example of highly specific multitrophic microbial 474 interactions.

#### 475 ENDOBACTERIA

476 To our knowledge, this is the first report to identify endobacteria of Mucoromycotina in a plant microbiota study. Above all, the experimental design with 477 478 low- to high-P conditions was instrumental to become aware of fungal endobacteria in 479 the dataset. A first hint for the presence of endobacteria came from the statistical 480 approach to find differentially abundant bOTUs between low and high-P conditions, 481 revealing the enrichment of a Candidatus Glomeribacter OTU under low-P conditions 482 (Fig. 5b). Of note, bOTU134 was almost overlooked, as a reliable taxonomy 483 assignment (confidence >0.7) was only available down to family level, while the deeper 484 data exploration indicated a link with endobacteria (genus-level assignment was 485 'Candidatus Glomeribacter', confidence 0.34). The second hint that pointed to 486 endobacteria and their hosts were the co-abundance patterns, which grouped bOTUs 487 including Candidatus Glomeribacter bOTU134 with numerous Glomeromycotina 488 fOTUs (Table S5). Here again, experimental design was instrumental because the co-489 occurrence analysis groups microbes with similar abundances in samples from low- to 490 high-P conditions. Finally, we relied on phylogenetic placement to confirm that 491 bOTU134 represents a Candidatus *Glomeribacter*, which is phylogenetically related to 492 a previously isolated exemplar from the AMF species Scutellospora pellucida (Fig. 7).

493 The identification of bOTU134 as a fungal endobacterium prompted us to 494 search for additional potential endobacteria in the Arabidopsis or Petunia root 495 microbiota. We compared two strategies, co-occurrence characteristics and sequence 496 similarity to known endobacteria, for their usefulness to identify endobacteria from root 497 microbiota data. For the co-occurrence characteristics strategy, we selected all bOTUs 498 that significantly co-occurred with fOTUs from lineages known to host endobacteria, 499 and then placed the resulting 129 candidate bOTUs into the endobacteria reference tree. 500 For the second strategy, we clustered all sequences of the curated endobacteria database 501 with all representative bOTU sequences of the microbiota dataset, and then placed the 502 resulting 22 candidate bOTUs with the highest sequence similarity into the 503 endobacteria reference tree. Overall, in addition to bOTU134, two abundant (bOTUs 504 330 and 778) and 8 low-abundant endobacteria OTUs were identified (Notes S4). 505 Moreover, the relative abundance of the three OTUs along the P-gradient was 506 consistent with the one of their fungal hosts (Table S4). While both approaches 507 identified bOTUs 134 and 778, the clustering-based approach functioned more 508 efficiently as also low abundant candidates were identified.

509 There are probably multiple reasons why endobacteria and their hosts were 510 largely neglected in microbiota studies so far. Reasons include the low taxonomic 511 resolution of short-read community data or the underrepresentation of reference 512 endobacteria sequences in commonly used taxonomy databases. Here, only the 513 combined sequencing of bacteria and fungi together with the dedicated experimental 514 design to manipulate the abundance pattern of fungal hosts and the curated endobacteria 515 database permitted to identify endobacteria OTUs. Our study demonstrates that 516 microbiota and/or metagenomic datasets represent useful tools to investigate 517 endobacterial-fungal interactions in their true ecological context. Possibly, such 518 cultivation-independent methods can point to further endobacterial-fungal 519 partnerships. Since endobacteria are ecologically relevant for the fitness of their (plant-520 associated) fungal hosts (Salvioli et al., 2016; Uehling et al., 2017; Desirò et al., 2018), 521 they may also relay some benefits or detriments to the host plant of the fungus 522 (Bonfante & Desirò, 2017). Hence, mycorrhizal plants, their colonizing fungi along 523 with their endobacteria form an entity of a multi-kingdom symbiosis. As put forward 524 by the holobiont concept (Vandenkoornhuyse et al., 2015), the importance of multi-525 kingdom microbe-microbe interactions for plant performance is not only true for 526 endobacteria and their fungal hosts but also in general between root bacteria and root

527 fungi. For instance, root bacteria are essential to protect plants against pathogenic root

528 fungi (Durán et al., 2018).

#### 529 QUANTIFYING AMF IN PLANT ROOTS

530 Although specific sequencing methods to quantify AMF in plant roots (Öpik et 531 al., 2009; Schlaeppi et al., 2016) are available, we sought to establish a sequencing-532 based approach to assess AMF in plant roots in the context of the whole fungal 533 diversity. In the search for a PCR approach that avoided amplification of plant ITS 534 sequences, we also wanted that AMF would be well captured in plant roots unlike other 535 plant root-fungi profiling methods (Ihrmark et al., 2012b; Hartman et al., 2018). The 536 Illumina approach by McGuire et al. (2013b), although reporting soil fungal profiles, 537 indicated that PCR primers ITS1F and ITS2 would permit to abundantly capture AMF 538 and this approach turned out to be successful on plant roots, too (Fig. S2).

539 Prior to community sequencing, we had evaluated the effectiveness of our 540 experimental P availability gradient by confirming that AMF abundantly colonize 541 Petunia roots under low-P but not under high-P conditions (Fig. 1c). We performed this 542 quality control using the traditional 'magnified intersection' (McGonigle *et al.*, 1990) 543 microscopy method on equivalent subsamples as the ones that were used for the 544 sequencing. The microscopy method relies on staining cleared roots, interpreting and 545 enumerating the different fungal structures following a defined counting scheme under 546 the microscope. Compared to the sequencing-based quantification of AMF in plant 547 roots, the microscopy method appears disadvantageous as it is prone to operator-to-548 operator variation, is time consuming and lacks throughput, discrimination between 549 AMF species as well as the context of the whole fungal diversity. Nevertheless, we 550 found a reliable agreement between the two methods with a significant positive 551 correlation (Fig. 3b). In summary, the MiSeq-based community profiling approach 552 with the PCR primers ITS1F and ITS2 avoided amplification of plant ITS sequences, 553 abundantly displayed the AMF and independently reproduces AMF colonization 554 patterns of plant roots.

## 555 AMF AS KEYSTONE SPECIES

556 Keystone taxa are thought to own central positions in microbial networks, with 557 many links to other species; therefore, they may play important ecological roles by 558 determining community dynamics and microbiome functioning (Banerjee *et al.*, 2018). 559 AMF were postulated to be keystone species (van der Heijden & Hartmann, 2016) and

560 indeed, we find two Glomeromycotina OTUs (fOTU6 and fOTU111) as being 561 keystones in the low-P responsive Petunia module 'M26' (Fig. 6). Technically, the two 562 Glomeromycotina OTUs fulfilled the network-based criteria defining keystone OTUs 563 - keystone OTUs have high degree of co-occurrence, high closeness centrality and low 564 betweenness centrality (Banerjee et al., 2018). The two identified keystone OTUs have 565 high degrees of co-occurrence implying they are co-abundant with many other (mostly 566 Glomeromycotina) OTUs in the network. However, with regard to these network-567 topology based criteria, there is a major caveat linked to Glomeromycotina fungi: 568 several Glomeromycotina species have particularly high intraspecies genetic diversity 569 at the rRNA operon (Stockinger et al., 2010; Lekberg et al., 2014) and, as a 570 consequence, these fungi require multiple OTUs (at >97% sequence identity) to 571 represent a single species. For example, three OTUs described the AMF Rhizoglomus 572 irregulare (Schlaeppi et al., 2016). Therefore, multiple OTUs per fungal species artificially inflate the number of co-occurring OTUs for an AMF species (the 3 OTUs 573 574 of *R. irregulare* will consistently co-occur with each other). While we agree that AMF 575 fulfil a key role in root microbiome functioning and this is especially true under low-P 576 conditions, we anticipate that the mathematical criteria for identifying AMF keystones 577 from network data may need to be improved and validated using functional analyses. 578 Instead of assigning keystone status to some pseudo-replicated sequence groups (e.g., 579 the 3 OTUs for *R. irregulare*) based on network topology, we rather favor the idea of 580 empirically nominate keystone microbes because of their known key function(s) in a 581 given condition (e.g., low-P availability).

#### 582 OLPIDIUM BRASSICAE

583 The root microbiota of Arabidopsis but not Petunia, whether profiled with 584 MiSeq or SMRT-sequencing, comprised abundant sequences assigned to *O. brassicae*, 585 which is a common root-infecting fungal pathogen of Brassicaceae plants (Lay et al., 586 2018). As biotrophic fungus, O. brassicae does not cause tissue maceration. Although 587 the Arabidopsis roots were without signs of disease when harvested, we learned after 588 the community sequencing that the fungus had spread in the root tissue. Nevertheless, 589 such dominance of O. brassicae OTUs was observed in previous studies (Tkacz et al., 590 2015; Durán et al., 2018; Lay et al., 2018). Similar to our study, Lay et al. (2018) 591 examining canola, wheat and pea roots, also found a Brassicaceae-specific enrichment 592 of an O. brassicae OTU. Because these findings originate from different Brassicaceae

593 species and different soil types, we consider the dominance of *O. brassicae* in 594 Arabidopsis roots in our study rather a true biological observation than a technical 595 artifact. Although, we confirmed this observation with SMRT sequencing, we cannot 596 fully exclude that the frequent amplification of *O. brassicae* OTUs may be linked to 597 the PCR primer ITS1f, as all these studies target the ITS1 region and have the use of 598 ITS1 or ITS1f PCR primers in common.

#### 599 *P-SENSITIVE MICROBIOTA*

600 We found species-specific microbial patterns in response to low-P conditions 601 consisting of abundant Mortierellomycotina and Glomeromycotina fungi in 602 Arabidopsis and Petunia, respectively (Fig. 5, Table S4). Similar to the functioning of 603 AMF in plant P provision, there are some reports that Mortierella spp. support P nutrition of plants (Alori et al., 2017). Although represented by different sequence 604 605 groups, bacteria of the Burkholderiales and Rhodocyclales were abundant in both 606 species. Bacteria of both orders, including members that attach to AMF hyphae, are 607 well known for their ability to solubilize and mobilize P (Sharma et al., 2013; Taktek et al., 2015; Alori et al., 2017). Candidatus Accumulibacter being abundant in Petunia 608 609 under low-P conditions (bOTU13, Fig. 5b) as well as the Dechloromonas sp. (bOTU2, 610 enriched in low-P, both plant species) are both intriguing root bacteria, as they are capable of polyphosphate metabolism, which has been implicated in stress response to 611 low nutrients in the environment (Rao & Kornberg, 1996; Flowers et al., 2013). In 612 613 summary, it appears that non-mycorrhizal Arabidopsis and mycorrhizal Petunia rely on 614 different microbial associations to cope with low-P conditions.

615 We revealed species-specific and in contrast to Robbins et al. (2018), we found 616 marked root microbiota dynamics of the two plants along a gradient of plant-available. A plausible reason for stronger P effects on the root microbiota is that our approach 617 created stronger P limiting conditions (1.05 mg P kg<sup>-1</sup> soil) compared to the low-P 618 control soil (P1, did not receive phosphate amendments over the last 65 years) of the 619 620 long-term P fertilization experiment studied by Robbins et al. (2.3 mg P kg<sup>-1</sup> soil, values are directly comparable as they were analyzed in the same professional soil laboratory 621 622 with the same method). Moreover, we established a steeper gradient between low and high-P conditions with a P availability of ~113 mg P kg<sup>-1</sup> soil as high-P condition 623 compared to ~12 mg P kg<sup>-1</sup> by Robbins *et al.* (2018). The stronger P limiting conditions 624 in our study were also reflected in the different rosette biomass data in both studies as 625

626 we find a twofold reduction in median rosette biomass whereas they measured at 627 maximum a 1.5x effect in low-P soils.

#### 628 CONCLUDING REMARKS

The analysis of root microbiota dynamics of Arabidopsis and Petunia to low-P conditions revealed a number of plant-species specific root microbes that are preferentially selected at low soil P availability. With regard to agricultural applications, this works suggests that for supporting different plant species in P nutrition, different P-solubilizing and/or mineralizing bacteria strains are needed. Possibly this explains the high context dependency of successful field applications with P-solubilizing and/or mineralizing bacterial products.

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646

#### 647 AUTHOR CONTRIBUTIONS

NB, MvdH and KS designed the experiments. NB performed the experiment, did the

649 molecular work and analyzed the data. JCW, VS, AD and KS contributed to data

analysis. NB, LB, MvdH and KS wrote the manuscript. All authors approved the final

651 manuscript.

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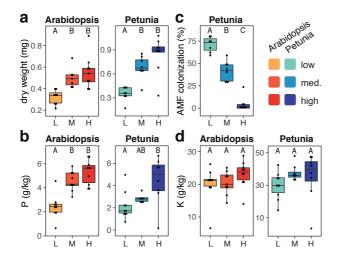
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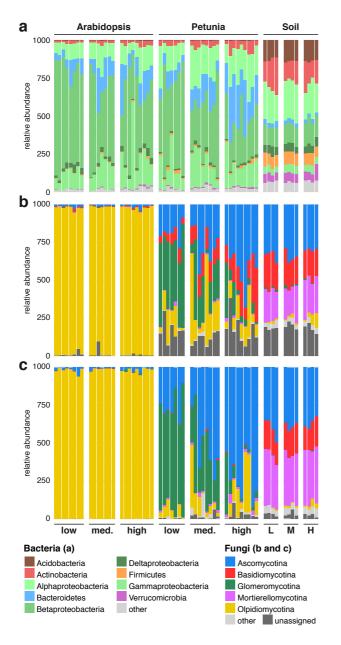
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1 2

# Figure 1 | Effectiveness of manipulated phosphate levels on plant growth, leaf nutrient levels and levels of AMF root colonization

5 Arabidopsis (reddish colors, see legend) and Petunia (blueish colors) were grown at low (L), 6 medium (M) and high (H, increasing hue) levels of P availability and basic plant parameters 7 were recorded to confirm that the experimental setup. Parameters included (a) above-ground 8 plant biomass, (b) leaf phosphorus levels, (c) Petunia root colonization by arbuscular 9 mycorrhizal fungi (AMF) and (d) leaf potassium levels. A linear model was used to test for 10 effects of P availability for panels (a) (log-transformed data), (b) and (d) and a guasibinomial generalized linear model for panel (c). Different letters indicate significant pairwise 11 12 differences among sample groups (P < 0.05, Tukey HSD).

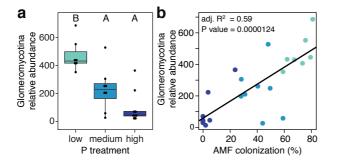


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#### 15 Figure 2 | Taxonomic profiles of microbial communities at phylum level

16 (a) Bacteria profiles were obtained using MiSeq sequencing while fungal profiles were

- 17 determined using (b) MiSeq and (c) SMRT sequencing. Phyla with relative abundances lower
- 18 than 1% were summarized with 'other'. Levels of P-availability are indicated with low (L),
- 19 medium (med.; M) or high (H).



20 21

#### 22 Figure 3 | Abundance of AMF in Petunia roots

23 (a) Quantification of AMF based on the relative abundance of Glomeromycotina sequences in

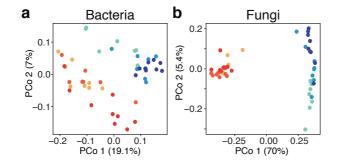
24 the microbiota profiles. Relative abundances were calculated from total sum normalized data.

25 A quasibinomial generalized linear model was used to test for effects due to P availability.

26 Different letters indicate significant pairwise differences between sample groups (P < 0.05,

27 Tukey HSD). This data was correlated (b) with the levels of AMF root colonization as measured

in the same samples by microscopy (data presented in Fig. 1c).

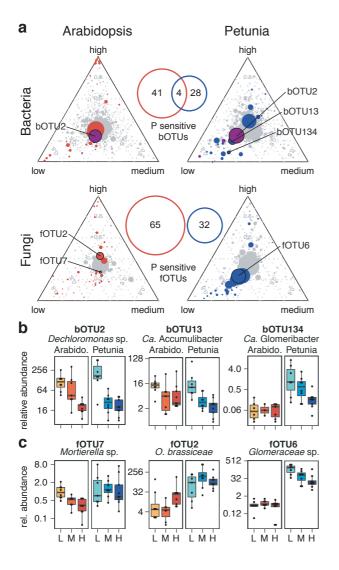


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31 Figure 4 | Effects of plant species and P-levels on community composition

Unconstrained ordinations with PCoA using Bray-Curtis dissimilarities were performed on the bacterial and (b) fungal communities associated with roots. Samples were colored following the color scheme defined in **Fig. 1** (Arabidopsis and Petunia with reddish and blueish colors, respectively, and the increasing P availability (low, medium to high) are marked with

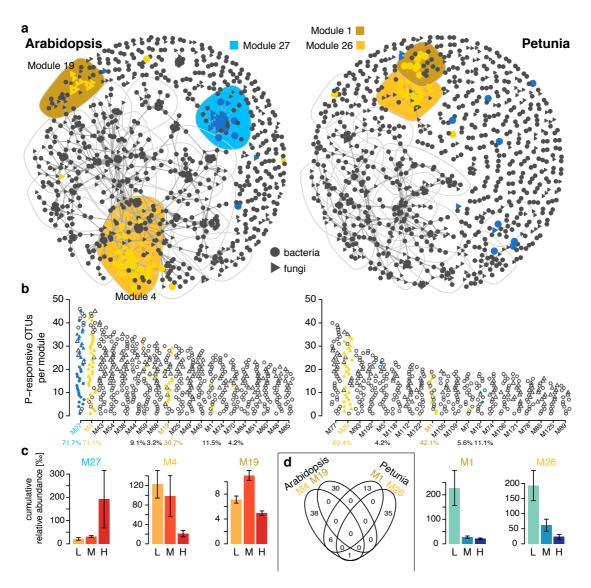
36 increasing hue.



37 38

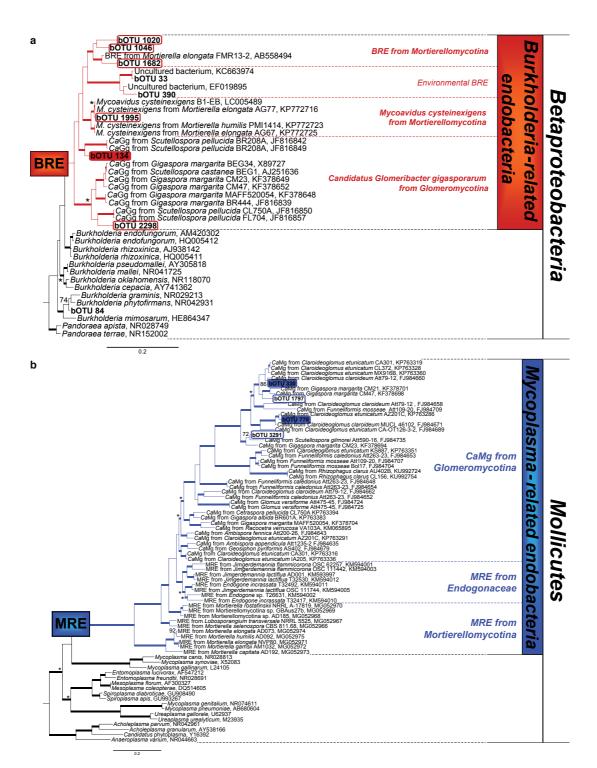
#### 39 Figure 5 | Identifying phosphate sensitive microbes

40 P sensitive OTUs (differentially abundant between low and high P conditions) were separately 41 identified for the bacteria and fungi, both in Arabidopsis and Petunia (edgeR analysis, high vs 42 low P, FDR < 0.05). (a) The ternary plots depict individual OTUs (in circles), sized by their 43 relative abundance, and the position of the OTUs in the triangle reflects their proportional abundance in low, medium and high P samples. P sensitive OTUs are colored in red 44 45 (Arabidopsis), blue (Petunia) or purple (found in both species) and non-affected OTUs are colored in gray. The number of P sensitive OTUs and their overlap between species is given 46 47 with the venn diagrams. Panels b and c illustrate the relative abundances (per milles) of a few 48 representative P sensitive bacterial and fungal OTUs in low (L), medium (M) and high (H) P 49 conditions (They are also indicated in the ternary plots).



50 51

52 Figure 6 | Microbial co-occurrence patterns along the gradient of plant-available phosphate 53 (a) Co-occurrence networks visualize the significant positive pairwise correlations ( $\rho > 0.7, P < 0.$ 54 0.001; indicated by links between OTUs) between bacteria (circles) and fungi (triangles) OTUs in Arabidopsis and Petunia root communities. P sensitive OTUs, which are abundant under 55 56 low and high P conditions, are colored in yellow and blue, respectively. The twenty network 57 modules comprising highest numbers of OTUs are rimmed with grey lines with the modules containing high proportions of P-responsive OTUs being shaded in yellow and blue. (b) Top 58 59 twenty most populated modules, ranked by decreasing numbers of OTUs (bOTUs in circles; 60 fOTUs as triangles) with low and high P sensitive OTUs being colored in yellow and blue, 61 respectively. Percentages below the x-axis report the proportion of P sensitive OTUs present in each module. (c) Cumulative relative abundance (as permilles) of all bacteria and fungi OTUs 62 63 in the P sensitive modules in low (L), medium (M) and high (H) P conditions. The cumulative 64 relative abundance indicates the overall response of the microbes in the P sensitive modules. 65 (d) Number and overlap of OTUs in the low P sensitive modules of Arabidopsis and Petunia 66 are shown with the venn diagram.



67 68

# Figure 7 | Phylogenetic placement of endobacteria OTUs from candidates identified by the clustering approach

71 Simplified trees summarizing the confirmed Burkholderia-related endobacteria (BRE, a) and 72 Mollicutes-related endobacteria (MRE, b); the detailed tree is available as Fig. S6. (a) Four 73 candidate BRE OTUs cluster within two clades encompassing BRE sequences from 74 Mortierellomycotina fungi. In detail, bOTU 1995 is sister to the type strain of Mycoavidus 75 cysteinexigens, whereas bOTUs 1020, 1046 and 1682 cluster with an undescribed BRE hosted in Mortierella elongata. Two bOTUs (134 and 2298) cluster within two clades encompassing 76 77 Candidatus Glomeribacter gigasporarum (CaGg) sequences retrieved from Scutellospora 78 pellucida (Glomeromycotina). Two bOTUs (33 and 390) cluster within a new BRE clade,

79 together with putative environmental BRE sequences. (b) Four candidate MRE OTUs cluster 80 within different clades encompassing *Candidatus* Moeniiplasma glomeromycotorum (*Ca*Mg) 81 sequences from Glomeromycotina fungi. In detail, bOTUs 330 and 778 cluster with CaMg hosted in several strains of Claroideoglomus spp., whereas bOTUs 1797 and 3291 cluster with 82 83 CaMg hosted in several strains of Gigaspora margarita and Scutellospora pellucida. The trees 84 show the topology obtained with the Bayesian method. Branches with Bayesian posterior 85 probabilities (BPP)  $\geq$  0.95 and ML bootstrap support values  $\geq$  70 are thickened; asterisks (\*) indicate branches with BPP  $\geq$  0.95 but ML bootstrap support values <70; ML bootstrap support 86 87 values ≥70 are shown for branches having BPP <0.95. Sequences generated in this study are 88 in bold.