

Rothamsted Research Harpenden, Herts, AL5 2JQ

Telephone: +44 (0)1582 763133 Web: http://www.rothamsted.ac.uk/

Rothamsted Repository Download

A - Papers appearing in refereed journals

Reid, T. E., Kavamura, V. N., Abadie, M., Torres-Ballesteros, A., Pawlett, M., Clark, I. M., Harris, J. and Mauchline, T. H. 2021. Inorganic Chemical Fertilizer Application to Wheat Reduces the Abundance of Putative Plant Growth-Promoting Rhizobacteria. *Frontiers in Microbiology.* 12 (article), p. 642587. https://doi.org/10.3389/fmicb.2021.642587

The publisher's version can be accessed at:

- https://doi.org/10.3389/fmicb.2021.642587
- https://www.frontiersin.org/articles/10.3389/fmicb.2021.642587/full#h4

The output can be accessed at:

https://repository.rothamsted.ac.uk/item/983vz/inorganic-chemical-fertilizer-applicationto-wheat-reduces-the-abundance-of-putative-plant-growth-promoting-rhizobacteria.

© 11 March 2021, Please contact library@rothamsted.ac.uk for copyright queries.

22/03/2021 11:46

repository.rothamsted.ac.uk

library@rothamsted.ac.uk



Inorganic chemical fertilizer application reduces putative plant growth-promoting rhizobacteria in wheat

- 1 Tessa E. Reid¹², Vanessa N. Kavamura¹, Maïder Abadie¹, Adriana Torres-Ballesteros¹, Mark
- 2 Pawlett², Ian M. Clark¹, Jim Harris² and Tim H. Mauchline^{1*}
- 3 ¹Sustainable Agriculture Sciences, Rothamsted Research, West Common, Harpenden, AL5 2JQ, UK
- 4 ²Cranfield Soil and Agrifood Institute, Cranfield University, College Road, Cranfield, Bedford,
- 5 MK43 0AL, UK
- 6 *Correspondence:
- 7 Tim Mauchline
- 8 tim.mauchline@rothamsted.ac.uk

9 Keywords: rhizosphere, rhizoplane, fertilizer, microbiome, bacteria

10 Abstract

11 The profound negative effect of inorganic chemical fertilizer application on rhizobacterial diversity has been well documented using 16S rRNA gene amplicon sequencing and predictive metagenomics. 12 13 We aimed to measure the function and relative abundance of readily culturable putative plant growth-14 promoting rhizobacterial (PGPR) isolates from wheat root soil samples under contrasting inorganic 15 fertilization regimes. We hypothesized that putative PGPR abundance will be reduced in fertilized relative to unfertilized samples. Triticum aestivum cv. Cadenza seeds were sown in a nutrient 16 depleted agricultural soil in pots treated with and without Osmocote® fertilizer containing nitrogen-17 18 phosphorous-potassium (NPK). Rhizosphere and rhizoplane samples were collected at flowering 19 stage (10 weeks) and analyzed by culture-independent (CI) amplicon sequence variant (ASV) 20 analysis of rhizobacterial DNA as well as culture -dependent (CD) techniques. Rhizosphere and 21 rhizoplane derived microbiota culture collections were tested for plant growth-promoting traits using 22 functional bioassays. In general, fertilizer addition decreased the proportion of nutrient-solubilizing 23 bacteria (nitrate, phosphate, potassium, iron and, zinc) isolated from rhizocompartments in wheat 24 whereas salt tolerant bacteria were not affected. A 'PGPR' database was created from isolate 16S 25 rRNA gene sequences against which total amplified 16S rRNA soil DNA was searched, identifying 1.52% of total community ASVs as culturable PGPR isolates. Bioassays identified a higher 26 27 proportion of PGPR in non-fertilized samples (rhizosphere (49%) and rhizoplane (91%)) compared to 28 fertilized samples (rhizosphere (21%) and rhizoplane (19%)) which constituted approximately 1.95% and 1.25% in non-fertilized and fertilized total community DNA, respectively. The analyses of 16S 29 30 rRNA genes and deduced functional profiles provide an in-depth understanding of the responses of 31 bacterial communities to fertilizer; our study suggests that rhizobacteria that potentially benefit plants 32 by mobilizing insoluble nutrients in soil are reduced by chemical fertilizer addition. This knowledge 33 will benefit the development of more targeted biofertilization strategies.

34 1 Introduction

- 35 Since anthropogenic plant domestication began ca.19,000 years ago, edible plants e.g. cereals have
- 36 been extensively bred (Lev-Yadun et al., 2000, Tanno and Willcox, 2006). However, current high-

- 37 yielding dwarf crop varieties rely on unsustainable levels of inorganic nitrogen and phosphorous
- fertilizers, pesticides and other chemical inputs which are environmentally harmful (Rees et al., 2013,
- 39 Van Grinsven et al., 2013). Wheat is the third most cultivated cereal in the world; the FAO predicts
- 40 that by 2050 the global population will reach 9.73 billion meaning food production must be
- 41 accordingly increased by 50 % (FAO, 2017). By 2027, demand for wheat will increase to 833 million
- 42 tons, which is 10 % above the annual current production (OECD/FAO, 2018).

43 Soil microbial communities influence plant growth, health and resource use efficiency, especially the

- 44 subset that coexist and are selected to form the root microbiome (Berendson et al., 2012, Mendes et
- al., 2013, Schlaeppi and Bulgarelli, 2015, Mauchline and Malone, 2017). A gradient of intimacy
 between plant roots and microbes extends away from the root: plant influence over the microbial
- 40 between plant roots and incrobes extends away from the root. plant influence over the incrobes 47 community increases nearer the root surface. Root surface microbes are said to inhabit the
- 47 rhizoplane, and those in soil closely associated with the root, the rhizosphere (Hiltner, 1904, Zhang et
- 49 al., 2017). Rhizosphere and rhizoplane microorganisms can benefit crop plants in several ways
- 50 including improved plant nutritional status and protection against biotic and abiotic stresses
- 51 (Bloemberg and Lugtenberg, 2001, Turner et al., 2013, Choudhary et al., 2016, Ahkami et al., 2017),
- 52 so are termed plant growth-promoting rhizobacteria (PGPR) (Kloepper and Schroth, 1978).
- 53 Inoculating plants with PGPR can stimulate crop growth, forming the basis for the biofertilizer
- 54 industry providing green alternatives to synthetic fertilizers and agrochemicals (Backer et al., 2018).
- 55 Understanding the effect of agricultural practices, such as fertilization regime, on PGPR populations
- 56 is essential to optimize microbiome function in the sustainable intensification of agriculture
- 57 (Hartmann et al., 2015).
- 58 To date, microbial community studies have focused on taxonomic composition, but the functional
- 59 potential of the microbiome may be more important to ensure key functions for holobiont fitness (Bai
- 60 et al., 2015, Lemanceau et al., 2017). With advances in next-generation sequencing technologies, the
- 61 wheat microbiome has mostly been defined based on CI methods; host genotype (Mahoney et al.,
- 62 2017), fertilization regime (Kavamura et al., 2018, Chen et al., 2019), land management and seed
- 63 load (Kavamura et al., 2019), irrigation (Mavrodi et al., 2018), growth stage (Chen et al., 2019) and
- 64 dwarfing (Kavamura et al., 2020) all affect the rhizosphere community structure. However, little has
- been done to link taxonomic structure of the wheat microbiome to its functional ability.
- 66 Using CI and CD methods, we studied the effect of chemical fertilizer on putative PGPR abundance
- 67 in the commercial wheat variety, Cadenza, from a low input agricultural soil depleted in most
- nutrients, in which beneficial microorganisms are important to sustain crop production. We
- 69 hypothesized that the abundance of rhizobacteria with plant growth-promoting traits would be
- 70 reduced for fertilized relative to unfertilized wheat due to differences in plant nutrient status.
- 71 Addition of NPK would mean that plants no longer need to interact with beneficial rhizobacteria to
- 72 provide nutrients to sustain growth. Our aim was to characterize culturable bacteria with plant
- 73 growth-promoting traits; determine their abundance within culturable communities; and characterize
- 74 CI and CD 16S rRNA gene DNA to assess the impact of the widely used NPK fertilizer on putative
- 75 PGPR populations. This was achieved by creating isolate libraries from each soil sample and
- subjecting them to a range of bioassays which test key traits in nutrient acquisition to establish the
- abundance of isolates with beneficial traits.16S rRNA gene sequences from isolates were used to
- 78 create a 'PGPR' database against which total CI amplified 16S rRNA soil DNA was searched in
- 79 order to determine the relative abundance of culturable PGPR within total community DNA.

80 2 Materials and methods

81 2.1 Soil collection, experimental setup, and harvesting

- 82 We evaluated the rhizosphere and rhizoplane soil from wheat grown with and without NPK fertilizer.
- 83 Soil was collected from Stackyard bare-fallow soil mine (LATLONG 52.000293N, -0.614308E), a
- 84 well-draining sandy loam soil from the Rothamsted Research experimental farm at Woburn,
- 85 Bedfordshire (UK). The soil is a Cottenham series (CATT et al., 1980) classified as a Cambric
- 86 Arenosol (FAO), chosen to reduce the legacy effect of prior cropping systems. Soil was sieved (2
- 87 mm mesh), mixed thoroughly, and stored at 4 °C in polythene bags prior to use. Triticum aestivum
- 88 cv. Cadenza seeds were surface sterilized (70% ethanol, 10 min; 1.5 % active chlorine, 1 h; 5 x rinse,
- 89 sterile distilled water (SDW); overnight imbibition, sterile water, 4 °C) before germination on filter
- 90 paper. Seedlings were planted (1x seedling/pot; 9x9x10 cm pots, ~500 g soil) with and without NPK
- 91 granules [15% N, 9% P₂O₅, 11% K₂O, 2% MgO with micro-nutrients (B, Cu, Fe, Mn, Mo, Zn);
- 92 Osmocote, UK] (~2.5 g per pot). Four replicate pots were prepared for each treatment. Plants were
- 93 grown in a glasshouse (20 °C, 16 h/day light regime) and watered daily with tap water.
- 94 Pots were harvested at the start of flowering (Zadoks growth stage 61; ten weeks post germination)
- 95 (Zadoks et al., 1974), resulting in 8 rhizosphere samples and 8 root samples. Height (from soil
- 96 surface to head of longest stem) was measured, then soil was gently tipped from the pot onto a fresh
- 97 polythene bag. Loose soil was discarded and non-rhizospheric soil carefully removed. Roots were
- 98 vigorously shaken in a bag to release tightly attached soil (i.e. rhizosphere) and mixed to
- 99 homogenize. The root system was excised, cut vertically in half and placed in sterile 10 ml vials for
- 100 subsequent rhizoplane work. One half was frozen (-20 °C) for soil DNA extraction and the other
- 101 stored (4 °C) for culture work. Around 5 g of rhizosphere soil and 1 g of root was collected per plant.
- 102 The remainder of the plant was dried (80 °C, 24 h) and dry foliar plant biomass measured.

103 2.2 **Isolation of bacteria**

- To obtain a library of rhizospheric bacteria, 1 g of each rhizosphere soil sample was diluted 10-fold 104
- 105 (SDW) and shaken vigorously for 10 min using a shaker. To increase the diversity and number of
- 106 culturable isolates returned in this study, rhizosphere samples were plated onto both 10TSA and an
- 107 additional 7 agar types (Supplementary Table S1) (Bai et al., 2015). Soil suspensions were serially
- diluted and 100 µl of final dilution spread on agar, (6 replicates per agar type). Different dilutions 108
- 109 were plated depending on agar type (Supplementary Table S2) and incubated (25 °C) for 4 days.
- 110 Individual colonies were picked and inoculated in 500 µl tryptone soya broth (TSB) (Oxoid,
- 111 Basingstoke, UK) (1/10th concentration) in deep well 96-well plates (Supplementary Fig. S1) and 112
- incubated (25 °C, 2 days). For rhizoplane-colonizing bacteria, root samples were weighed and 900 µl
- 113 SDW was added for every 0.1 g root. Samples were shaken vigorously for 10 min using a shaker, 114
- serially diluted, plated onto 10TSA and incubated (25 °C, 4-6 days). Individual colonies were picked 115 and inoculated in 500 µl TSB (1/10th conc.) (96-well plates, 25 °C, 2 days) prior to functional
- 116 analysis.
- 117 In addition, once colonies had been hand-picked from agar plates the remaining microbial biomass
- 118 was resuspended in 5 ml SDW using a sterile spreader and transferred to a 50 ml centrifuge tube.
- 119 Suspensions from technical replicates of the same agar (Supplementary Fig. S2) were combined and
- 120 each sample vortexed (10 min, high speed) to ensure homogeneity. Sub-samples of each were stored
- 121 (2 ml Eppendorf tube, -20°C) for genomic DNA extraction.

122 2.3 **Bioassays for plant growth-promoting traits**

123 **2.3.1 Bioassay inoculation**

- 124 Plant growth-promoting functions were tested using previously established bioassays. A sterile 48-
- 125 prong inoculating manifold was used to spot individual inoculated isolates from the 96-well plate
- 126 liquid cultures onto agar (2x technical replicates per 96-well plate). Assays were incubated (25 °C, 5-
- 127 7 days); positive isolates were counted per sample for each functional assay.

128 2.3.2 Hydrolyzation of casein

- 129 Casein agar is used to detect peptide bond hydrolyzing microorganisms (Frazier and Rupp, 1928).
- 130 Isolate cultures were spot inoculated onto agar supplemented with skimmed milk powder as the
- 131 casein source. Casein agar (Hardy Diagnostics, Santa Maria, CA, USA): 5% skimmed milk powder,
- 132 0.5% pancreatic digest of casein, 0.25% yeast extract, 0.1% D-glucose, 1.25% agar. Hydrolyzing
- 133 isolates produced a clear halo in the surrounding medium.

134 2.3.3 Solubilization of insoluble phosphate, potassium and zinc

- 135 Isolate cultures were spot inoculated onto agar plates containing: tricalcium phosphate as an insoluble
- 136 phosphate source (Pikovskaya, 1948); potash feldspar (Bath potters, UK) as an insoluble potassium
- source (Zhang and Kong, 2014); and zinc oxide as an insoluble zinc source (HiMedia M2023)
- 138 (Subba Rao, 1977). Pikovskayas agar (Pikovskaya, 1948): 0.05% yeast extract, 1% D-glucose, 0.5%
- $139 \qquad Ca_{3}(PO_{4})_{2}, \ 0.05\% \ (NH_{4})_{2}SO_{4}, \ 0.02\% \ KCl, \ 0.01\% \ MgSO_{4}\bullet 7H_{2}O, \ 0.00001\% \ MnSO_{4}\bullet H_{2}O, \ 0.000001\% \ MnSO_{4}\bullet H_{2}O, \ 0.0000000\% \ MnSO_{4}\bullet H_{2}O, \ 0.000000\% \ MnSO_{4}\bullet H_{2}O, \ 0.00000\% \ MnSO_{4}\bullet H_{2}O, \ 0.00000\% \ MnSO_{4}\bullet H_{2}O, \ 0.00000\% \ MnSO_{4}\bullet H_{2}O, \ 0.0000\% \ MnSO_{4}\bullet H_{2}O, \ 0.0000\% \ MnSO_{4}\bullet H_{2}O, \ 0.0000\% \ MnSO_{4}\bullet H_{2}O, \ 0.000\% \ MnSO_{4}\bullet H_{2}O,$
- 140 FeSO₄•7H₂O, 1.5% agar. Aleksandrov agar (Aleksandrov et al., 1967): 0.05% MgSO₄•7H₂O, 0.01%
- 141 CaCO₃, 0.2% potash feldspar, 0.5% D-glucose, 0.0005% FeCl₃•6H₂O, 0.2% Ca₃(PO₄)₂, 2% agar, pH
- 142 7.0-7.2. Zinc solubilizing agar (Subba Rao, 1977): 1% D-glucose, 0.1% (NH₄)₂SO₄, 0.02% KCl,
- 143 0.01% K₂HPO₄, 0.02% MgSO₄•7H₂O, 0.1% ZnO, 1.5% agar. The plates were incubated at 25 °C for
- 144 5-7 days and observed for the formation of halo zone around the colonies.

145 **2.3.4 Production of siderophores**

- 146 Iron solubilization was tested using agar containing chrome azurol S (CAS) and
- 147 hexadecyltrimethylammonium bromide (HDTMA) which form a blue color complex with ferric iron;
- a color change to orange is observed when a strong iron chelator such as a siderophore removes iron
- 149 from the dye complex (Schwyn and Neilands, 1987, Louden et al., 2011). The medium was prepared
- as outlined in (Louden et al., 2011). Iron solubilization was denoted as either 'positive' or 'negative'
- 151 based on the presence, or absence of an orange halo surrounding the colony.

152 2.3.5 Salt tolerance

- 153 *In vitro* screening of the isolates tolerance to salt stress was tested by culturing strains on 10TSA
- 154 supplemented with 5% (w/v) sodium chloride (NaCl). 10TSA with no additional NaCl was included
- as a control.

156 2.3.6 Statistical analyses for culture-dependent work

- 157 Statistical differences in the frequency of positive vs. negative isolates (n=376) between non-
- 158 fertilized and fertilized wheat were performed in R 3.6.1 (http://www.r-project.org) using the
- 159 'chisq.test' function. Box plots were created in GraphPad Prism version 8 for Mac (San Diego, CA:
- 160 GraphPad Software, Inc). This software was also used to calculate two-way analysis of variance
- 161 (ANOVA) and pair-wise t-tests with Šidák correction for bacterial abundance and absolute
- abundance of nutrient-solubilizing isolates. Data were first normalized by logarithmic transformation.
- 163 Normality was confirmed by quantile-quantile normality plots and Shapiro-Wilk test; homogeneity of
- variances was confirmed by residuals versus fits plots and Spearman's test for heteroscedasticity.

165 **2.4 DNA analysis**

166 2.4.1 Mixed culture DNA extraction and quantitation

- 167 Each mixed culture sample was subjected to Sigma GenElute Bacterial Genomic DNA extraction kit
- 168 using the lysozyme utilizing Gram-positive bacterial preparation method to ensure lysis of both
- 169 Gram-positive and Gram-negative cells, according to the manufacturer's instructions. DNA purity
- 170 and concentrations were established by NanoDrop spectrophotometry (Thermo Scientific,
- 171 Wilmington, DE, United States), and a Qubit 2.0 Fluorimeter using the dsDNA HS assay kit (Thermo
- 172 Scientific), respectively.

173 2.4.2 Soil DNA Extraction and Quantitation

- 174 For each sample, total soil DNA was extracted from approximately 0.25 g homogenized soil (Qiagen
- 175 DNeasy PowerSoil DNA isolation kit (Venlo, Netherlands)), according to the manufacturer's
- 176 instructions using the MP Biomedicals FastPrep-24 machine twice (30 s, 5.5 m s⁻¹). DNA
- 177 concentrations and purity were determined as above.

178 **2.4.3 Amplicon library preparation and sequencing**

- 179 To assess the impact of fertilizer on microbial community composition, bacterial 16S rRNA gene
- amplicons were subjected to Illumina® sequencing using the MiSeq platform. Amplicons (~460 bp)
- spanning the V3-V4 hypervariable region of the 16S rRNA gene were produced using primers 341F
- 182 (5'-CCTACGGGAGGCAGCAG-3') and 806R (5'-GGACTACHVGGGTWTCTAAT-3')
- 183 (Klindworth et al., 2013). Rhizosphere DNA was sent to Novogene (HK) (Wan Chai, Hong Kong)
- 184 for 2 x 250 bp paired-end sequencing on a MiSeq instrument. Rhizoplane and bacterial samples were
- 185 sequenced in-house (2 x 300 bp paired-end sequencing) on a MiSeq instrument; see Supplementary
- 186 Methods for full details. Amplicon preparation followed the protocol of Kozich et al. (Kozich et al., 2012)
- 187 2013).

188 2.4.4 Processing of 16S rRNA gene amplicon sequence data

- 189 Demultiplexing of raw sequences was performed by CASAVA data analysis software (Illumina).
- 190 Paired-end sequences were merged using the vsearch merge_pairs function (Rognes et al., 2016) then
- 191 filtered, de-replicated, and denoised to identify ASVs using the DADA2 1.2 (Callahan et al., 2016)
- 192 pipeline with Quantitative Insights into Microbial Ecology (QIIME2) (version 2018.11.0) default
- 193 parameters (Bolyen et al., 2019). The resulting ASV table retained high quality nonchimeric reads
- and was used to build a phylogenetic tree using the align-to-tree-mafft-fasttree command in QIIME2.
- 195 Taxonomy was assigned using the SILVA132 database (Quast et al., 2012, Yilmaz et al., 2013). All
- 196 non-bacterial ASVs were removed for further analysis.

197 2.4.5 Colony PCR for identification of rhizobacterial isolates

- 198 To identify individual rhizobacterial isolates, amplicons (~1500 bp) spanning almost the full length
- 199 of the 16S rRNA gene were produced using primers fD1 (5'-AGAGTTTGATCCTGGCTCAG-3')
- and rD1 (5'-AAGGAGGTGATCCAGCC-3'). From a total of 1504 rhizobacterial isolates (94 isolates
- 201 per rhizosphere sample; 94 isolates per rhizoplane sample), 541 isolates were sequenced to gain a
- 202 representative population of species present in non-fertilized and fertilized wheat. Amplicons were
- 203 produced by colony PCR and sent to Eurofins Genomics Germany for purification and Sanger
- 204 sequencing; see Supplementary Methods for full details. Amplicon sequences were processed in
- 205 Geneious Prime version 2020.1.1; taxonomically assigned using the SILVA Alignment,

- 206 Classification and Tree (ACT) service (www.arb-silva.de/act); and deposited in NCBI GenBank (for
- 207 individual accession numbers see Supplementary Data).

2.4.6 Isolate database creation 208

- 209 The resulting 541 16S rRNA gene sequences and corresponding taxonomy were used to create
- QIIME2 taxonomy and ASV files to identify whether isolates matched major ASVs within the 16S 210
- 211 rRNA gene amplicon dataset. The classify-consensus-blast command in QIIME2 was used at 100%
- 212 sequence identity to search the 16S rRNA gene amplicon sequences against the isolate database.
- 213 Secondly, a 'PGPR' database was created which only included isolate sequences identified as
- 214 'putative PGPR' (as they were found to be positive for at least one functional trait) to identify the 215
- relative abundance of potentially plant beneficial isolates within CI and CD amplicon datasets. ASVs
- 216 identified as 'Bacteria' were considered rhizobacterial isolates.

217 **2.5** Data visualization and statistical analyses

218 2.5.1 Total 16S rRNA gene dataset

219 The resulting ASV table was analyzed in R 3.6.1 using Phyloseq (v1.30.0) (available at

- 220 https://joey711.github.io/phyloseq/) (McMurdie and Holmes, 2013). Amplicon sequencing data were
- 221 normalized using DESeq2 to account for differences in sequencing bias (Love et al., 2014), except
- 222 for alpha diversity analysis, which was calculated by normalizing sequence number to minimum
- 223 sample size (8554) by random subsampling. The subsampling of sequences still yielded sufficient
- 224 resolution of bacterial communities, as suggested by rarefaction curve analysis (Fig. S3). Two-way 225 type III ANOVA was performed using the R function 'aov' with fertilizer and rhizocompartment as
- 226 factors, to determine the dominant factor contributing to variation in means for alpha diversity data.
- 227 Normality was confirmed by quantile-quantile normality plots and the Shapiro-Wilk test;
- 228 homogeneity of variances was confirmed by residuals versus fits plots and the Levene's test (R
- 229 package: car (v3.0-6)). Beta diversity was determined by principle Coordinate Analysis (PCoA)
- 230 which was employed on weighted UniFrac distance matrices using the 'ordinate' function in the
- 231 Phyloseq package; significantly different clusters were determined using 'adonis' with the 232 'betadisper' test to check for equal variance (R package: vegan (v2.5.6)) (Oksanen et al., 2019).
- 233 Phylum level community composition was investigated by relative abundance of normalized data,
- 234 after removal of bacterial ASVs only classified to Kingdom level and ASVs assigned as
- 235 'environmental samples' for visualization purposes. Unique and shared ASVs were determined in
- 236 Excel. To identify ASVs preferentially associated with fertilization and vice versa, the differential
- relative abundances (fold changes) of ASVs between the different groups were determined. Low 237
- 238 abundance ASVs with less than 3 counts in <20% of the samples were removed. This was performed
- individually for each data set with the DeSeq2 package, using the Wald significance test and the 239
- 240 Benjamini-Hochberg *p* value correction. All graphs were rendered in Prism 8.

241 2.5.2 Isolate and PGPR 16S rRNA gene dataset

242 The resulting isolate ASV table and PGPR ASV table were analyzed using Phyloseq (as described

- 243 above), normalized using DESeq2 and transformed to relative abundances. Heatmaps were created in
- 244 Excel. ASVs identified as 'Bacteria' were considered rhizobacterial isolates or putative PGPR; the
- 245 remaining ASVs were unassigned. To identify whether isolates matched ASVs preferentially
- 246 associated with fertilization and vice versa, the differential relative abundances (fold changes) of
- 247 ASVs between the different groups were determined, as described above. Statistical differences
- 248 between mean putative PGPR abundance between treatments were assessed using two-way ANOVA
- 249 and pair-wise t-tests with Šidák correction. Normality was confirmed by quantile-quantile normality

- 250 plots and Shapiro-Wilk test; homogeneity of variances was confirmed by residuals versus fits plots
- and Spearman's test for heteroscedasticity. Box plots were created in Prism 8. 251

3 252 **Results**

253 3.1 Plant phenotypical data

- 254 Fertilizer addition increased aerial biomass of wheat from 1.27 ± 0.32 g to 4.11 ± 0.95 (Welch's two-
- 255 sample t-test: t=-5.645, df=3.67, p=0.006) (Supplementary Fig. S4). There were no statistical
- 256 differences in mean height of non-fertilized vs. fertilized wheat plants (p>0.05) (Supplementary Fig.
- 257 S4).

3.2 258 Rhizobacterial community composition in culture -independent and -dependent 259 communities

- 260 Amplicon-based analysis of the V3-V4 region of the 16S rRNA gene generated a total of 902,187
- 261 sequences from 16 CI samples (median 50,658 sequences per sample) and 279,558 sequences from
- 262 16 CD samples (median 17,235 sequences per sample). Filtering, denoising, and removal of chimeras
- 263 resulted in 521,098 (CI) and 206,960 (CD) high-quality sequences, retaining 58% and 70% of initial
- 264 reads, respectively. The number of sequences per sample ranged from 20,809 to 49,203 (CI) and
- 12,623 to 24,165 (CD). One CD sample was removed due to low sequence number (<100). ASV 265
- 266 analysis using the SILVA132 database generated 4,879 ASVs from CI DNA and 426 ASVs from CD
- 267 DNA (after removal of ASVs that were not classified as bacteria (archaeal, eukaryote, metagenome,
- 268 unassigned)). The CD approach retrieved 4.9% of ASVs from the CI total community; 244 (4.9%)
- 269 ASVs were found using both CI and CD methods indicating that 182 (3.6%) ASVs detected by the
- 270 CD method, were absent from the CI DNA dataset (Fig. 1).

271 3.3 Fertilizer treatment and niche effects on rhizobacterial community diversity

- 272 Rhizobacterial community beta-diversity, as measured by weighted UniFrac distances, was
- 273 influenced by both rhizocompartment and fertilizer. PCoA of CI communities showed clustering of
- 274 samples by rhizocompartment along the first principle coordinate axis (PC1) and clustering by
- 275 fertilization along the second principle coordinate axis (PC2) (Fig. 2A, CI). Two-way permutational
- 276 analysis of variance (PERMANOVA) indicated that both rhizocompartment and fertilizer effect were
- 277 significant in CI rhizobacterial communities, as well as their interaction (Supplementary Table S3).
- 278 Rhizocompartment accounted for 49% of the variance (p = 0.001) and fertilizer accounted for 24% of
- 279 the variance (p = 0.001). The two-way PERMANOVA of CD rhizobacterial community beta
- 280 diversity indicated a significant effect of rhizocompartment (20% of variance, p = 0.002), whereas 281
- the effect of fertilization was weaker, although still statistically significant (13% of variance, p =282 0.035), but the interaction was not significant (Supplementary Table S4). PCoA of the CD
- 283
- rhizobacterial community revealed that samples also clustered by rhizocompartment along PC1 (Fig. 284 2A, CD), whereas there was some overlap between treatment groups along PC2, consistent with the
- 285 small effect size in the PERMANOVA analysis.
 - 286 Rhizobacterial CI community alpha diversity, as measured by the Shannon diversity index, was
 - 287 consistent across rhizocompartments but lower in samples from fertilized wheat (Fig. 2B, CI). Two-
 - 288 way type III ANOVA indicated that the effect of fertilizer was significant (p = 0.0024), while the
 - 289 effects of rhizocompartment and interaction were not (Supplementary Table S5). Rhizobacterial CD
 - 290 communities showed lower alpha diversity compared to CI communities (Fig. 2B, CD), with
 - 291 fertilizer and rhizocompartment causing less change in variation (p>0.05) (Supplementary Table S6).

292 3.4 Comparison of isolation media in assessing the influence of fertilizer on rhizosphere 293 bacterial communities

294 In total, 894 bacterial ASVs were identified from 63 mixed culture samples (4 biological replicates

- 295 from 8 agar-types for non-fertilized and fertilized wheat rhizosphere samples (1 outlier removed)). 296 The use of 7 additional agar types, as well as 10TSA, retrieved 8.6% of CI ASVs compared to 4.2%
- 297 from just 10TSA.
- 298 Effect of fertilizer was more apparent when a larger number of agar types were used to isolate
- 299 rhizobacteria. Overall, mean alpha diversity was greater in samples from non-fertilized wheat (2.95 \pm
- 300 0.31) compared to fertilized wheat (2.66 ± 0.31) (d.f=1, F=21, p<0.0001) however, there were no
- 301 statistical differences between individual means for each agar-type (d.f=7, F=3.6, p>0.05) (Fig. 3A).
- 302 Furthermore, fertilizer was the dominant factor contributing to variation in beta diversity
- 303 (PERMANOVA, F=40, r²=0.35. p=0.001), accounting for 61.7% variation along PC1 compared to 304
- 16.7% variation along PC2 as caused by agar-type (PERMANOVA, F=2.6, r²=0.16, p=0.004) (Fig. 305 3B), with no significant interaction. The relative abundance of different taxonomic groups in mixed
- 306 cultures shifted from non-fertilized wheat plants and fertilized wheat plants (Fig. 3C). Most notable,
- 307 was the higher abundance of Actinobacteria in the rhizosphere of fertilized wheat plants across all
- 308 media types compared to a higher abundance of Proteobacteria in the rhizosphere of non-fertilized
- 309
- wheat plants.
- 310 Agar type had minimal effect on bacterial diversity within treatment groups. There were no statistical
- 311 differences in mean alpha diversity between different agar types for a given sample from either non-
- 312 fertilized or fertilized wheat. Furthermore, PCoA showed no distinct groupings between agar type for
- 313 non-fertilized wheat (Supplementary Fig. S5A) (PERMANOVA, F=1.1, r²=0.24, p=0.38) however,
- fertilized wheat samples from TWYE agar formed a clear grouping compared to the other agar types 314
- 315 (Supplementary Fig. S5B). With TWYE samples present, media type significantly affected bacterial
- community structure (PERMANOVA, F=11.9, r²=0.29, p=0.001). However, when TWYE samples 316
- 317 were removed from PCoA, agar type had no significant effect on bacterial community structure
- 318 (PERMANOVA, F=0.86, r²=0.056, p=0.59).

319 3.5 Effect of fertilizer on abundance of culturable rhizobacteria with plant growth-promoting 320 traits

- 321 Based on previous evidence of fertilization altering the structure of wheat rhizosphere bacterial
- 322 communities (Kavamura et al., 2018), we hypothesized that addition of fertilizer would reduce,
- 323 specifically, the presence of putative plant growth-promoting rhizobacteria.
- 324 In general, rhizobacteria that tested positive for solubilization of plant macronutrients: organic N 325 (casein), inorganic phosphate ($Ca_3(PO_4)_2$) and potassium (potash feldspar), and plant micronutrients: 326 iron (FeCl₃ \cdot 6H₂O) and zinc (ZnO), had a statistically higher relative abundance in isolate libraries 327 cultured from non-fertilized wheat samples compared to fertilized wheat samples (Fig. 4A and 4B) 328 (Supplementary Table S9). However, there was no significant difference in the relative abundance of 329 salt-tolerant rhizobacteria in non-fertilized wheat samples compared to fertilized wheat samples (Fig. 4B) (Supplementary Table S9). Relative abundance of nutrient solubilizing isolates were greater in 330 rhizosphere (49.2 \pm 13%; two-tailed chi-square test: X² = 116, p<0.0001, d.f = 1) and rhizoplane 331 332 $(90.7 \pm 9\%; X^2 = 389, p < 0.0001, d.f = 1)$ samples from non-fertilized wheat compared to fertilized
- 333 wheat $(21.5 \pm 2\%)$ and $19.1 \pm 14\%$ from rhizosphere and rhizoplane, respectively) (Fig. 4C).

- 334 Absolute abundance of bacteria isolated from the rhizoplane (mean log CFU counts.g soil⁻¹: $8.84 \pm$
- 335 0.34) was higher compared to the rhizosphere of wheat (mean log CFU counts.g soil⁻¹: 6.70 ± 0.05)
- (two-way ANOVA: F=18.3, d.f=1, p<0.0001) whereas fertilizer addition had no significant effect on 336
- 337 rhizobacterial abundance (p>0.05) (Fig. 5A). In comparison, absolute abundance of nutrient-
- 338 solubilizing bacteria isolated from rhizocompartments in wheat were statistically higher from 339
- rhizoplane samples (F=113, d.f=1, p<0.0001) and were also statistically higher in non-fertilized 340 compared to fertilized wheat samples (F=20.7, d.f=1, p=0.0007) (Fig. 5B). Post-hoc multiple
- 341 comparison tests with Šidák correction showed differences in means in rhizosphere (log CFU
- 342 counts.g soil⁻¹: 8.18 ± 0.08 and 7.24 ± 0.67 in non-fertilized and fertilized wheat, respectively)
- 343 (p=0.0289) and rhizoplane (mean log CFU counts.g soil⁻¹: 6.12 ± 0.09 and 5.37 ± 0.27 in non-
- 344 fertilized and fertilized wheat, respectively) (p=0.0075) samples. However, there were no statistical
- 345 differences between individual assays for absolute abundance of isolates from non-fertilized vs.
- 346 fertilized wheat (Supplementary Fig. S6).

347 3.6 Identification of culturable isolates within culture-independent and -dependent amplicon 348 datasets

349 An isolate database was curated from 541 isolates (275 from non-fertilized wheat; 266 from fertilized

350 wheat) which consisted of a total of 27 genera (Fig. 6) (Supplementary data S1). Rhizobacterial

351 isolates that displayed growth-promoting abilities were identified as being mostly Bacillus species

352 (48%) in the rhizosphere and *Pseudomonas* (50%) in the rhizoplane of non-fertilized wheat (Fig.

353 6A). For fertilized wheat plants the majority of isolates were also identified as *Bacillus* (52%) in the

- 354 rhizosphere and Allorhizobium-Neorhizobium-Pararhizobium-Rhizobium (48%) in the rhizoplane
- 355 (Fig. 6A).

356 In total, 96 (1.92%) isolate bacterial ASVs were also identified as being present in the total

357 community amplicon 16S rRNA gene dataset from this work. The remaining 4,906 ASVs could not 358 be assigned to any culturable isolates from this work; 88 (1.84%) bacterial ASVs were identified in

359 the CI amplicon dataset and 58 (13.6%) bacterial ASVs were identified in the CD amplicon dataset

360 (Fig. 6B). Comparatively, at ninety-nine percent sequence identity, 246 (4.5%) isolate ASVs were

361 classified as bacteria from 5456 ASVs. However, to increase accuracy of isolate identification, one

362 hundred percent sequence identity was used. Overall, 23 genera were identified in the CI and CD

363 amplicon datasets, when searched against the isolate database; no ASVs were classified as

364 Rhodococcus, Fictibacillus, Paraburkholderia and Agrobacterium.

365 The PGPR isolate database identified 76 ASVs (1.52%) as PGPR within the CI and CD communities

366 (Fig. 6C). Overall, relative abundance of PGPR isolates were relatively low (<5%) however, there

was a statistically higher mean abundance of PGPR in non-fertilized CI samples (0.019 ± 0.006) 367

compared to fertilized CI samples (0.012 ± 0.002) (two-way ANOVA: F=22.7, df=1, p=0.0005) (Fig. 368

369 7). Compartment also contributed to difference in means and was statistically higher in the

- 370 rhizosphere (0.020 ± 0.006) compared to the rhizoplane (0.013 ± 0.003) (two-way ANOVA: F=14.7,
- 371 df=1, p=0.0024). There was no significant interaction with fertilization regime. Post-hoc multiple

comparison tests with Šidák correction showed differences in means in rhizosphere (0.024 ± 0.002 372

and 0.016 ± 0.004 in non-fertilized and fertilized wheat, respectively) (p=0.0009) but not in 373

374 rhizoplane (0.015 ± 0.003 and 0.011 ± 0.003 in non-fertilized and fertilized wheat, respectively)

375 (p>0.05) samples.

376 Major ASVs within wheat rhizobacterial communities 3.7

- 377 Differential abundance analysis identified ASVs that were highly associated with non-fertilized
- 378 wheat compared to fertilized wheat in rhizosphere and the rhizoplane samples. Overall: 54 ASVs
- 379 (3.5% of all ASVs identified in CI rhizosphere samples); 115 ASVs (3.5% of all ASVs identified in
- CI rhizoplane samples); 17 ASVs (6.4% of all ASVs identified in CD rhizosphere samples); and 16
- 381 ASVs (6.0% of all ASVs identified in CD rhizoplane samples) were differentially abundant between
- non-fertilized and fertilized samples (Supplementary Table S7 and S8). Six genera (15 ASVs) were
- enriched in non-fertilized samples (p<0.01) and they included members of the Proteobacteria
- 384 (46.97%), Firmicutes (9.09%) and Actinobacteria (7.58%) (Fig. 8). Conversely, nineteen genera (36
- ASVs) were enriched in fertilized samples and they included members of the Proteobacteria (49.26%), Actinobacteria (31.62%), Bacteroidetes (10.29%) and Firmicutes (4.41%) (Fig. 8). In
- (49.26%), Actinobacteria (31.62%), Bacteroidetes (10.29%) and Firmicutes (4.41%) (Fig. 8). In
 particular 9 ASVs identified as *Pseudomonas* were enriched in non-fertilized samples compared to
- fertilized samples where 4 ASVs identified as *Catenulispora*, *Leifsonia* and *Rhodanobacter* were
- 389 enriched (Fig. 8).
- 390 Key ASVs that were differentially abundant in both the amplicon dataset and isolate dataset were
- 391 identified (p<0.01). They included: *ASV_3448_Pseudomonas*, *ASV_1275_Pseudomonas*, *and*
- 392 ASV_4785_Pseudomonas in non-fertilized wheat samples and ASV_1051_Rhizobium,
- 393 ASV_4593_Rhizobium, ASV_4049_Pedobacter, ASV_1557_Leifsonia, ASV_1818_Rhodanobacter,
- 394 ASV_1979_Rhodanobacter, ASV_4187_Paraburkholderia and ASV_2089_Lysobacter in fertilized
- 395 wheat samples (Fig. 8). Four ASVs (ASV_4593, ASV_4049, ASV_1979, ASV_4187) were
- 396 differentially more abundant in fertilized wheat samples in CI and CD amplicon datasets and CI and
- 397 CD isolate datasets.

398 4 Discussion

- 399 We hypothesized that the addition of chemical fertilizer would reduce putative PGPR populations in
- 400 wheat. We found that the abundance of rhizobacteria with acquisitional traits for key plant nutrients
- 401 (endogenous nitrogen, phosphate, potassium, iron and zinc mobilization) were significantly reduced
- 402 in wheat grown in soils treated with NPK fertilizer.
- 403 We combined both culture-independent and -dependent methods to study the impact of fertilizer on 404 microbiome community composition and diversity. Our CI results confirmed previous studies 405 showing that fertilizer alters community structure and reduces bacterial alpha diversity in the root 406 environment (Jorquera et al., 2014, Zhu et al., 2016, Cui et al., 2018, Kavamura et al., 2018, Lian et 407 al., 2018, Chen et al., 2019, Pagé et al., 2019, Liang et al., 2020). Our CD results support this as beta diversity was influenced and alpha diversity reduced by fertilizer. We decided to analyze CI 408 409 rhizosphere and rhizoplane datasets together despite their having been sequenced using different 410 approaches because, whilst inter-sequencing center variation can be significant (Schloss et al., 2011), 411 treatment effect consistently outweighs run variation (Wen et al., 2017). Thus, we acknowledge that 412 compartment effect (in CI samples) could be partially due to bias in sequencing run; however, it is 413 unlikely only due to this given the high percentage variability in beta-diversity, and previous 414 evidence that different soil compartments have distinct microbial compositions (van der Heijden and 415 Schlaeppi, 2015). Additionally, our main aim was to study the effect fertilizer had on rhizobacterial 416 diversity which is distinct in both compartments. Finally, we have previously found that fertilizer 417 application reduces microbial species richness in the rhizosphere (Kavamura et al., 2018) and when re-examining the dataset from this study there is also a reduction in species richness in the bulk soil 418 419 of plots receiving high levels of inorganic N fertilizer, but this effect is exacerbated in the 420 rhizosphere. Therefore, we conclude that despite fertilizer also influencing bacterial community

421 structure in bulk soil (Chen et al., 2016, Ding et al., 2016, Francioli et al., 2016, Soman et al., 2017,

422 Dai et al., 2020, Kumar et al., 2018) it also has a profound effect on the rhizo-microbiome.

423 We tested how much the use of multiple agar types increased the percentage of total community 424 DNA retrieved when compared to commonly used 10TSA only. The agar types were selected from 425 Bai et al. (2015) which characterized extensive culture collections isolated from Arabidopsis leaf and 426 root microbiomes and demonstrated that the majority of leaf- and root-dwelling microbes were 427 amenable to culture. Whilst Bai et al. used colony picking, as well as limiting dilution and cell 428 sorting to purify bacterial isolates we were more interested in mixed culture taxonomy that resulted 429 from the use of different isolation media, similar to the method used in Kavamura et al. (2019). In fact, the use of seven additional agar types increased the percentage of ASVs retrieved twofold 430 431 compared to 10TSA only which, considering 10TSA retrieved half the ASVs from all agar types 432 combined, supports its representability as an isolation medium. We reported a higher percentage of 433 culturable ASVs (4.2%) retrieved in total community DNA, in contrast to Stefani et al. (2015) and 434 Kavamura et al. (2019) who retrieved 2.4% and 2.2%, respectively, using similar isolation methods. 435 Both studies analyzed 16S rRNA gene datasets by clustering sequences into operational taxonomic 436 units; the increased percentage retrievability which we report could be due to improved taxonomic 437 resolution from ASV analysis (Fierer et al., 2017). Additionally, we found that agar type had little 438 effect on the diversity and composition of rhizobacterial isolates cultured from soil. We conclude that 439 this is likely due to the agar types used being less selective, not genera-specific and similar in 440 composition which would explain the lack of diversity yielded. It would be interesting in future work 441 to test microbial composition isolated from agar with similar conditions as found in soil, such as soil

442 extract, root exudate and plant extract media.

443 Putative PGPR were characterized using a variety of functional bioassays to test a representative 444 population of the culturable rhizo-microbiome. We found a clear difference in relative abundance of 445 nutrient-solubilizing bacteria isolated from rhizosphere and rhizoplane samples between fertilized and non-fertilized wheat. There was a marked reduction in both relative and absolute abundance of 446 447 nutrient solubilizing bacteria in fertilized samples. We hypothesized that this would be the case since 448 fertilized plants and microorganisms can utilize easily available NPK source and do not need to 449 solubilize NPK. Indeed, key enzymes involved in microbial solubilization of P, alkaline 450 phosphatases, were shown to be strongly decreased by P fertilization in the rhizosphere (Spohn and 451 Kuzyakov, 2013) which suggests that fertilizer reduces hydrolytic enzyme-producing 452 microorganisms or enzyme production in organisms capable of such function. The role of 453 fertilization on soil enzymatic activities has been investigated in detail over the last 40 years 454 (Bautista-Cruz and Ortiz Hernandez, 2015) where increasing evidence suggests that chemical 455 fertilization can inhibit or slow down synthesis of hydrolytic enzymes. However, linking enzyme 456 production to individual microbiome members or groups is particularly challenging (Sergaki et al., 2018). Our study suggests that genera such as *Bacillus*, *Pseudomonas*, *Rhizobium* and *Streptomyces* 457 458 are producers of hydrolytic enzymes in soil. Of course, this study does not exclusively show that the 459 culturable rhizobacteria with plant growth-promoting traits contributed to plant growth, and it is 460 possible that the bacteria were releasing nutrients for their own consumption. However, spatial differentiation of microbes in the rhizosphere has been demonstrated to reduce plant-microbe 461 462 competition as much as possible (Marschner et al., 2011). Additionally, taxonomically and 463 functionally similar bacteria to those we isolated in this study have been shown to increase plant 464 growth when inoculated in soils (Assainar et al., 2018, Masters-Clark et al., 2020, Wang et al., 2020, 465 Wilkinson, 2020).

466 We hypothesized that there is a host selection process for nutrient-solubilizing bacteria, driven by poor nutrient availability conditions and that fertilizer reduces this selection as wheat can utilize the 467 468 readily available nutrients in soil and no longer need to interact with beneficial bacteria. Our results show a higher abundance of nutrient-solubilizing rhizobacteria in the rhizoplane, a compartment 469 more intimately associated with the plant host than the rhizosphere, which could suggest a plant 470 471 mediated selection process. Alternatively, the competition for nutrients might be heightened in the 472 rhizoplane as compared to the rhizosphere, and nutrient-solubilizing organisms could be under a 473 stronger selection when nutrients are depleted. We also found bacteria with known plant growth-474 promoting properties such as Paenibacillus, Streptomyces and Pseudomonas to be more abundant in 475 root-associated soil from non-fertilized wheat (Vejan et al., 2016, Liu et al., 2019). However, it is unclear why fertilizer addition would inhibit root colonization by these bacteria. It is possible that 476 477 rhizobacteria are less able to metabolize primary nutrients in the form presented in agricultural fertilizers than other members of the soil microbiome. If this is the case, it would follow that they are 478 also less competitive in this environment and this would be reflected in their lower abundance. 479 480 Pseudomonas, for example, colonize plants through chemotaxis into the rhizosphere along a gradient 481 of root exudates, followed by surface association and migration on the rhizoplane to ultimately form a bacterial biofilm, which would explain their increased abundance in the rhizoplane. In addition, 482 483 many *Pseudomonas* spp. produce enzymes and other signaling molecules such as lipopolysaccharides 484 to successfully colonize the plant rhizosphere and manipulate plants by activating symbiotic pathways (Oldroyd, 2013). It has been shown that nutrient starvation triggers plants to activate 485 symbiotic pathways with bacteria (Zipfel and Oldroyd, 2017), so addition of fertilizer could mean 486 plants no longer need to activate such pathways and thus no longer interact with beneficial bacteria, 487 488 such as Pseudomonas. Chen et al. 2019 showed that the order Pseudomonadales in rhizosphere 489 samples responded negatively to organic acid released by wheat in response to N fertilization (Chen 490 et al., 2019) which correlate with our results that show a reduced abundance of *Pseudomonas* in soil 491 samples from fertilized wheat and suggest that organic acid release by wheat as a response to 492 fertilizer addition indirectly inhibits selection and colonization of *Pseudomonas* of the root system. 493 The higher abundance of pseudomonads was more apparent in culturable rhizobacterial communities. 494 Other non-culturable species may play just as important a role but are not as amenable to study.

495 Reducing environmental and financial costs of conventional agriculture requires novel management 496 and breeding strategies to shift current high input to more sustainable biological methods. Soil microbiome manipulation promises to contribute to more environmentally benign agriculture by 497 498 promoting plant growth and suppressing pathogenic microorganisms (Mauchline and Malone, 2017) and show promise in reducing chemical fertilizer application without influencing crop growth 499 (Assainar et al., 2018, Wang et al., 2020). Our work provides a binary method to determine 500 501 abundance of bacteria with beneficial traits in soil samples. Furthermore, we endeavored to link 502 individual isolates cultured from soil samples to total soil community DNA. Culturable bacteria with 503 plant growth-promoting traits are invaluable to the commercialization of biostimulants for sustainable 504 agriculture (Backer et al., 2018). Therefore, establishing their abundance within total soil DNA will 505 be useful to determine the overall impact that bioinoculants have on the microbiome as well as to determine optimal inoculation dose. However, first we must understand plant host evolutionary and 506 507 domestication history to identify plant traits linked to microbial recruitment by wild relatives (Perez-Jaramillo et al., 2016). Significant knowledge gaps limit our understanding of the soil microbiome. 508 509 The field needs to move beyond simple descriptions of community diversity to identify patterns in 510 this complexity and recognize when that complexity is important (Lemanceau et al., 2017). This will 511 enable us to make soil microbiome research of practical utility to human undertakings, towards a cooperative relationship with terrestrial ecosystems instead of our current one-sided and often self-512 513 destructive relationship.

- 514 This study contributes to our understanding of the impact of fertilizer on wheat rhizobacteria and
- 515 supports previous studies showing the deleterious effect of chemical fertilizer on plant rhizobacteria,
- 516 particularly through highlighting the greater abundance of putative PGPR in unfertilized plants. It is
- 517 assumed that wild relatives have co-evolved with the microbial community of native soils, selecting
- 518 microbes beneficial to growth and health. Here, we show the probability that wheat plants can select 519 growth-promoting bacteria to their roots to establish mutually beneficial associations and that
- 519 grown-promoting bacteria to their roots to establish mutually beneficial associations and that 520 chemical fertilizer reduces this selection. We propose a culture-dependent method to characterize the
- 521 functional ability of the microbiome, and link this to culture-independent total soil DNA. We hope
- 522 that this work contributes to the shift from simple microbiome studies on taxonomic characterization
- 523 to conceptual framework analysis identifying and explaining patterns in the soil microbiome in
- 524 agriculture and natural systems (Harris, 2009).

525 **5** Conflict of Interest

526 The authors declare that the research was conducted in the absence of any commercial or financial 527 relationships that could be construed as a potential conflict of interest.

528 6 Data Availability Statement

The raw sequences analyzed for this study can be found in the NCBI Sequence Read Archive (SRA),
 accession PRJNA625513 and in NCBI Genbank, accessions MT354024 - MT354564.

531 **7** Author Contributions

- TR, TM, IC, and VK: designed the experiments. TR, VK, and MA performed the experiments and
 collected the data. TR analyzed the data with input from AT, VK, and MA for bioinformatic
- analyses. TR wrote the manuscript. All co-authors edited and commented on the manuscript.

535 8 Funding

- 536 This work was supported by the Bilateral BBSRC-Embrapa grant on "Exploitation of the rhizosphere 537 microbiome for sustainable wheat production" (BB/N016246/1); "Optimization of nutrients in soil-538 plant systems: How can we control nitrogen cycling in soil?" (BBS/E/C/00005196) and "S2N – Soil 539 to matritism. Work marked a 1 = 0 atimizing antipier and acade in the soil about historeration.
- 539 to nutrition Work package 1 O ptimizing nutrient flows and pools in the soil-plant-biota system" 540 (DDS (G/00) (210) We also a share the Lemma A arised tend Trust for further a DDD
- 540 (BBS/E/C/000I0310). We also acknowledge the Lawes Agricultural Trust for funding a PhD
- 541 studentship for T. E Reid.

542 9 Acknowledgments

- 543 The authors would like to thank Ahmed Abdullah and Jess Evans for input with statistical analysis.
- 544 **10** Supplementary Material
- 545 The Supplementary Material for this article can be found online

546 **11 References**

Ahkami, A.H., Allen White, R., Handakumbura, P.P.and Jansson, C. (2017). Rhizosphere
engineering: Enhancing sustainable plant ecosystem productivity. *Rhizosphere*. 3, 233-243.
doi: 10.1016/j.rhisph.2017.04.012

- Aleksandrov, V.G., Blagodyr, R.N.and Ilev, I.P. (1967). Liberation of phosphoric acid from apatite
 by silicate bacteria. *Mikrobiolohichnyi Zhurnal (Kiev)*. 29, 111-114.
- Assainar, S.K., Abbott, L.K., Mickan, B.S., Whiteley, A.S., Siddique, K.H.M.and Solaiman, Z.M.
 (2018). Response of Wheat to a Multiple Species Microbial Inoculant Compared to Fertilizer
 Application. *Front. Plant. Sci.*, 9. doi: 10.3389/fpls.2018.01601
- Backer, R., Rokem, J.S., Ilangumaran, G., Lamont, J., Praslickova, D., Ricci, E., et al. (2018). Plant
 Growth-Promoting Rhizobacteria: Context, Mechanisms of Action, and Roadmap to
 Commercialization of Biostimulants for Sustainable Agriculture. *Front Plant Sci.* 9, 1473.
 doi: 10.3389/fpls.2018.01473
- Bai, Y., Muller, D.B., Srinivas, G., Garrido-Oter, R., Potthoff, E., Rott, M., et al. (2015). Functional
 overlap of the Arabidopsis leaf and root microbiota. *Nature*. 528, 364-369. doi:
 10.1038/nature16192
- Bautista-Cruz, A.and Ortiz Hernandez, Y. (2015). Hydrolytic soil enzymes and their response to
 fertilization: A short review. *Comunicata Scientiae*. 6, 255-262. doi: 10.14295/CS.v6i3.962
- Berendson, P.L., Pieterse, C.M.and Bakker, P.A. (2012). The rhizosphere microbiome and plant
 health. *Trends Plant Sci.*, 17, 478-486.
- Bloemberg, G.V.and Lugtenberg, B.J. (2001). Molecular basis of plant growth promotion and
 biocontrol by rhizobacteria. *Curr. Opin. Plant Biol.*, 4, 343-350.
- Bolyen, E., Rideout, J.R., Dillon, M.R., Bokulich, N.A., Abnet, C.C., Al-Ghalith, G.A., et al. (2019).
 Reproducible, interactive, scalable and extensible microbiome data science using QIIME 2. *Nat. Biotechnol.*, 37, 852-857. doi: 10.1038/s41587-019-0209-9
- Callahan, B.J., McMurdie, P.J., Rosen, M.J., Han, A.W., Johnson, A.J.and Holmes, S.P. (2016).
 DADA2: High-resolution sample inference from Illumina amplicon data. *Nat. Methods.* 13, 581-583. doi: 10.1038/nmeth.3869
- 574 CATT, J.A., WEIR, A.H., NORRISH, R.E., RAYNER, J.H., KING, D.W., HALL, D.G.M., et al.
 575 1980. *The Soils of Woburn Experimental Farm. III.*
- 576 Chen, C., Zhang, J., Lu, M., Qin, C., Chen, Y., Yang, L., et al. (2016). Microbial communities of an
 577 arable soil treated for 8 years with organic and inorganic fertilizers. *Biol. Fertil. Soils.* 52,
 578 455-467. doi: 10.1007/s00374-016-1089-5
- 579 Chen, S., Waghmode, T.R., Sun, R., Kuramae, E.E., Hu, C.and Liu, B. (2019). Root-associated
 580 microbiomes of wheat under the combined effect of plant development and nitrogen
 581 fertilization. *Microbiome*. 7, 136. doi: 10.1186/s40168-019-0750-2
- 582 Choudhary, D.K., Kasotia, A., Jain, S., Vaishnav, A., Kumari, S., Sharma, K.P., et al. (2016).
 583 Bacterial-Mediated Tolerance and Resistance to Plants Under Abiotic and Biotic Stresses. J.
 584 Plant Growth Regul., 35, 276-300. doi: 10.1007/s00344-015-9521-x
- Cui, X., Zhang, Y., Gao, J., Peng, F.and Gao, P. (2018). Long-term combined application of manure
 and chemical fertilizer sustained higher nutrient status and rhizospheric bacterial diversity in
 reddish paddy soil of Central South China. *Sci. Rep.*, 8, 16554. doi: 10.1038/s41598-01834685-0
- Dai, Z., Liu, G., Chen, H., Chen, C., Wang, J., Ai, S., et al. (2020). Long-term nutrient inputs shift
 soil microbial functional profiles of phosphorus cycling in diverse agroecosystems. *ISME J*.
 14, 757-770. doi: 10.1038/s41396-019-0567-9

- 592 Ding, J., Jiang, X., Ma, M., Zhou, B., Guan, D., Zhao, B., et al. (2016). Effect of 35 years inorganic
 593 fertilizer and manure amendment on structure of bacterial and archaeal communities in black
 594 soil of northeast China. *Appl. Soil. Ecol.*, 105, 187-195. doi: 10.1016/j.apsoil.2016.04.010
- 595 FAO. (2017). The future of food and agriculture Trends and challenges. Rome.
- Fierer, N., Brewer, T.and Choudoir, M. 2017. Lumping versus splitting is it time for microbial
 ecologists to abandon OTUs? <u>http://fiererlab.org/2017/05/02/lumping-versus-splitting-is-it-</u>
 <u>time-for-microbial-ecologists-to-abandon-otus/</u> [accessed October 19 2020].
- Francioli, D., Schulz, E., Lentendu, G., Wubet, T., Buscot, F.and Reitz, T. (2016). Mineral vs.
 Organic Amendments: Microbial Community Structure, Activity and Abundance of
 Agriculturally Relevant Microbes Are Driven by Long-Term Fertilization Strategies. *Front. Microbiol.*, 7. doi: 10.3389/fmicb.2016.01446
- Frazier, W.C.and Rupp, P. (1928). Studies on the proteolytic bacteria of milk I. aApplied Soil
 Ecology. medium for the direct isolation of caseolytic milk bacteria. J. Bacteriol., 16, 57-63.
- Harris, J. (2009). Soil Microbial Communities and Restoration Ecology: Facilitators or Followers?
 Science. 325, 573. doi: 10.1126/science.1172975
- Hartmann, M., Frey, B., Mayer, J., Mäder, P.and Widmer, F. (2015). Distinct soil microbial diversity
 under long-term organic and conventional farming. *ISME J.* 9, 1177-1194. doi:
 10.1038/ismej.2014.210
- Hiltner, L. (1904). Uber neuere Erfahrungen und Probleme auf dem Gebiete der Bodenbakteriologie
 unter besonderden berucksichtigung und Brache. Arb. Dtsch. Landwirtsch. Gesellschaft. 98,
 59-78.
- Jorquera, M.A., Martínez, O.A., Marileo, L.G., Acuña, J.J., Saggar, S.and Mora, M.L. (2014). Effect
 of nitrogen and phosphorus fertilization on the composition of rhizobacterial communities of
 two Chilean Andisol pastures. *World J. Microbiol. Biotechnol.* 30, 99-107. doi:
 10.1007/s11274-013-1427-9
- Kavamura, V.N., Hayat, R., Clark, I.M., Rossmann, M., Mendes, R., Hirsch, P.R., et al. (2018).
 Inorganic Nitrogen Application Affects Both Taxonomical and Predicted Functional Structure of Wheat Rhizosphere Bacterial Communities. *Front. Microbiol.*, 9, 1074. doi: 10.3389/fmicb.2018.01074
- Kavamura, V.N., Robinson, R.J., Hayat, R., Clark, I.M., Hughes, D., Rossmann, M., et al. (2019).
 Land Management and Microbial Seed Load Effect on Rhizosphere and Endosphere Bacterial
 Community Assembly in Wheat. *Front. Microbiol.*, 10. doi: 10.3389/fmicb.2019.02625
- Kavamura, V.N., Robinson, R.J., Hughes, D., Clark, I., Rossmann, M., Melo, I.S.d., et al. (2020).
 Wheat dwarfing influences selection of the rhizosphere microbiome. *Sci. Rep.*, 10, 1452. doi: 10.1038/s41598-020-58402-y
- Klindworth, A., Pruesse, E., Schweer, T., Peplies, J., Quast, C., Horn, M., et al. (2013). Evaluation of
 general 16S ribosomal RNA gene PCR primers for classical and next-generation sequencingbased diversity studies. *Nucleic Acids Res.*, 41, e1. doi: 10.1093/nar/gks808
- Kloepper, J.and Schroth, M.N. (1978). Plant growth-promoting rhizobacteria on radishes. IV
 international conference on plant pathogenic bacteria. *France*. 2, 879-882.
- Kozich, J.J., Westcott, S.L., Baxter, N.T., Highlander, S.K.and Schloss, P.D. (2013). Development of
 a dual-index sequencing strategy and curation pipeline for analyzing amplicon sequence data

- on the MiSeq Illumina sequencing platform. *Appl. Environ. Microbiol.*, 79, 5112-5120. doi:
 10.1128/AEM.01043-13
- Kumar, U., Kumar Nayak, A., Shahid, M., Gupta, V.V.S.R., Panneerselvam, P., Mohanty, S., et al.
 (2018). Continuous application of inorganic and organic fertilizers over 47 years in paddy soil
 alters the bacterial community structure and its influence on rice production. *Agric. Ecosyst. Environ.*, 262, 65-75. doi: 10.1016/j.agee.2018.04.016
- Lemanceau, P., Blouin, M., Muller, D.and Moenne-Loccoz, Y. (2017). Let the Core Microbiota Be
 Functional. *Trends Plant Sci.*, 22, 583-595. doi: 10.1016/j.tplants.2017.04.008
- 642 Lev-Yadun, S., Gopher, A.and Abbo, S. (2000). The cradle of agriculture. *Science*. 288, 1602.
- Lian, T., Yu, Z., Liu, J., Li, Y., Wang, G., Liu, X., et al. (2018). Rhizobacterial community structure
 in response to nitrogen addition varied between two Mollisols differing in soil organic carbon. *Sci. Rep.*, 8, 12280. doi: 10.1038/s41598-018-30769-z
- Liang, R., Hou, R., Li, J., Lyu, Y., Hang, S., Gong, H., et al. (2020). Effects of Different Fertilizers
 on Rhizosphere Bacterial Communities of Winter Wheat in the North China Plain. *Agronomy*.
 10, 93. doi: 10.3390/agronomy10010093
- Liu, X., Li, Q., Li, Y., Guan, G.and Chen, S. (2019). Paenibacillus strains with nitrogen fixation and
 multiple beneficial properties for promoting plant growth. *PeerJ.* 7, e7445-e7445. doi:
 10.7717/peerj.7445
- Louden, B.C., Haarmann, D.and Lynne, A.M. (2011). Use of blue agar CAS assay for siderophore
 detection. *J. Microbiol. Biol. Educ.*, 12, 51-53.
- Love, M.I., Huber, W.and Anders, S. (2014). Moderated estimation of fold change and dispersion for
 RNA-seq data with DESeq2. *Genome Biol.*, 15, 550. doi: 10.1186/s13059-014-0550-8
- Mahoney, A.K., Yin, C.and Hulbert, S.H. (2017). Community Structure, Species Variation, and
 Potential Functions of Rhizosphere-Associated Bacteria of Different Winter Wheat (Triticum aestivum) Cultivars. *Front Plant Sci.* 8, 132. doi: 10.3389/fpls.2017.00132
- Marschner, P., Crowley, D.and Rengel, Z. (2011). Rhizosphere interactions between microorganisms
 and plants govern iron and phosphorus acquisition along the root axis model and research
 methods. *Soil Biol. Biochem.*, 43, 883-894. doi: 10.1016/j.soilbio.2011.01.005
- Masters-Clark, E., Shone, E., Paradelo, M., Hirsch, P.R., Clark, I.M., Otten, W., et al. (2020).
 Development of a defined compost system for the study of plant-microbe interactions. *Sci. Rep.*, 10, 7521. doi: 10.1038/s41598-020-64249-0
- Mauchline, T.H.and Malone, J.G. (2017). Life in earth the root microbiome to the rescue? *Curr. Opin. Microbiol.*, 37, 23-28. doi: 10.1016/j.mib.2017.03.005
- Mavrodi, D.V., Mavrodi, O.V., Elbourne, L.D.H., Tetu, S., Bonsall, R.F., Parejko, J., et al. (2018).
 Long-Term Irrigation Affects the Dynamics and Activity of the Wheat Rhizosphere
 Microbiome. *Front. Plant. Sci.*, 9. doi: 10.3389/fpls.2018.00345
- McMurdie, P.J.and Holmes, S. (2013). phyloseq: An R Package for Reproducible Interactive
 Analysis and Graphics of Microbiome Census Data. *PLoS One.* 8, e61217. doi:
 10.1371/journal.pone.0061217
- Mendes, R., Garbeva, P.and Raaijmakers, J.M. (2013). The rhizosphere microbiome: significance of
 plant beneficial, plant pathogenic, and human pathogenic microorganisms. *FEMS Microbiol. Rev.*, 37, 634-663. doi: 10.1111/1574-6976.12028

- 676 OECD/FAO. (2018). OECD-FAO Agricultural Outlook 2018-2027.
- Oksanen, J., G., B., Friendly, M., Kindt, R., Legendre, P., McGlinn, D., et al. (2019). vegan:
 Community Ecology Package. R Package Version 2.5-6.
- Oldroyd, G.E.D. (2013). Speak, friend, and enter: signalling systems that promote beneficial
 symbiotic associations in plants. *Nat. Rev. Microbiol.*, 11, 252-263. doi: 10.1038/nrmicro2990
- Pagé, A.P., Tremblay, J., Masson, L.and Greer, C.W. (2019). Nitrogen- and phosphorus-starved
 Triticum aestivum show distinct belowground microbiome profiles. *PLoS One*. 14, e0210538.
 doi: 10.1371/journal.pone.0210538
- Perez-Jaramillo, J.E., Mendes, R.and Raaijmakers, J.M. (2016). Impact of plant domestication on
 rhizosphere microbiome assembly and functions. *Plant Mol. Biol.*, 90, 635-644. doi:
 10.1007/s11103-015-0337-7
- Pikovskaya, R.I. (1948). Mobilization of phosphorus in soil in connection with the vital activity of
 some microbial species *Mikrobiologiya*. 17, 362-370.
- Quast, C., Pruesse, E., Yilmaz, P., Gerken, J., Schweer, T., Yarza, P., et al. (2012). The SILVA
 ribosomal RNA gene database project: improved data processing and web-based tools.
 Nucleic Acids Res., 41, D590-D596. doi: 10.1093/nar/gks1219
- Rees, R.M., Baddeley, J.A., Bhogal, A., Ball, B.C., Chadwick, D.R., Macleod, M., et al. (2013).
 Nitrous oxide mitigation in UK agriculture. *Soil Sci. Plant Nutr.*, 59, 3-15. doi:
 10.1080/00380768.2012.733869
- Rognes, T., Flouri, T., Nichols, B., Quince, C.and Mahé, F. (2016). VSEARCH: a versatile open source tool for metagenomics. *PeerJ*. 4, e2584.
- 697 Schlaeppi, K.and Bulgarelli, D. (2015). The plant microbiome at work. *Mol. Plant. Microbe Interact.*,
 698 28, 212-217. doi: 10.1094/MPMI-10-14-0334-FI
- Schloss, P.D., Gevers, D.and Westcott, S.L. (2011). Reducing the effects of PCR amplification and
 sequencing artifacts on 16S rRNA-based studies. *PLoS One*. 6, e27310-e27310. doi:
 10.1371/journal.pone.0027310
- Schwyn, B.and Neilands, J.B. (1987). Universal chemical assay for the detection and determination
 of siderophores. *Anal. Biochem.*, 160, 47-56. doi: 10.1016/0003-2697(87)90612-9
- Sergaki, C., Lagunas, B., Lidbury, I., Gifford, M.L.and Schafer, P. (2018). Challenges and
 Approaches in Microbiome Research: From Fundamental to Applied. *Front Plant Sci.* 9,
 1205. doi: 10.3389/fpls.2018.01205
- Soman, C., Li, D., Wander, M.M.and Kent, A.D. (2017). Long-term fertilizer and crop-rotation
 treatments differentially affect soil bacterial community structure. *Plant Soil*. 413, 145-159.
 doi: 10.1007/s11104-016-3083-y
- Spohn, M.and Kuzyakov, Y. (2013). Distribution of microbial- and root-derived phosphatase
 activities in the rhizosphere depending on P availability and C allocation Coupling soil
 zymography with 14C imaging. *Soil Biol. Biochem.*, 67, 106-113. doi:
 10.1016/j.soilbio.2013.08.015
- 714 Subba Rao, N.S. 1977. Soil microorganisms and plant growth, New Delhi, Oxford & IBH Pub. Co.
- Tanno, K.and Willcox, G. (2006). How fast was wild wheat domesticated? *Science*. 311, 1886. doi:
 10.1126/science.1124635

717 Turner, T., Ramakrishnan, K., Walshaw, J., Heavens, D., Alston, M., Swarbreck, D., et al. 2013. 718 Comparative metatranscriptomics reveals kingdom level changes in the rhizosphere 719 microbiome of plants. ISME J. 720 van der Heijden, M.G.A. and Schlaeppi, K. (2015). Root surface as a frontier for plant microbiome 721 research. Proc. Natl. Acad. Sci. U. S. A., 112, 2299-2300. doi: 10.1073/pnas.1500709112 722 Van Grinsven, H.J.M., Spiertz, J.H.J., Westhoek, H.J., Bouwman, A.F.and Erisman, J.W. (2013). 723 Nitrogen use and food production in European regions from a global perspective. J, Agric, 724 Sci, 152, 9-19. doi: 10.1017/s0021859613000853 725 Vejan, P., Abdullah, R., Khadiran, T., Ismail, S.and Nasrulhaq Boyce, A. (2016). Role of Plant 726 Growth Promoting Rhizobacteria in Agricultural Sustainability-A Review. Molecules (Basel, 727 Switzerland). 21, 573. doi: 10.3390/molecules21050573 728 Wang, J., Li, R., Zhang, H., Wei, G.and Li, Z. (2020). Beneficial bacteria activate nutrients and 729 promote wheat growth under conditions of reduced fertilizer application. BMC Microbiol., 20, 730 38. doi: 10.1186/s12866-020-1708-z 731 Wen, C., Wu, L., Qin, Y., Van Nostrand, J.D., Ning, D., Sun, B., et al. (2017). Evaluation of the 732 reproducibility of amplicon sequencing with Illumina MiSeq platform. PLoS One. 12, 733 e0176716-e0176716. doi: 10.1371/journal.pone.0176716 734 Widdig, M., Schleuss, P.-M., Weig, A.R., Guhr, A., Biederman, L.A., Borer, E.T., et al. (2019). 735 Nitrogen and Phosphorus Additions Alter the Abundance of Phosphorus-Solubilizing Bacteria 736 and Phosphatase Activity in Grassland Soils. Front. Environ. Sci., 7. doi: 737 10.3389/fenvs.2019.00185 738 Wilkinson, M. (2020). E ct of Plant Growth Promoting Bacteria on the Growth of Wheat Seedlings 739 Subjected to Phosphate Starvation. J. Agron., 10. doi: 10.3390/agronomy10070978 740 Yilmaz, P., Parfrey, L.W., Yarza, P., Gerken, J., Pruesse, E., Quast, C., et al. (2013). The SILVA and "All-species Living Tree Project (LTP)" taxonomic frameworks. Nucleic Acids Res., 42, 741 742 D643-D648. doi: 10.1093/nar/gkt1209 743 Zadoks, J.C., Chang, T.T.and Konzak, C.F. (1974). A decimal code for the growth stages of cereals. 744 Weed Res., 14, 415-421. doi: 10.1111/j.1365-3180.1974.tb01084.x 745 Zhang, C.and Kong, F. (2014). Isolation and identification of potassium-solubilizing bacteria from 746 tobacco rhizospheric soil and their effect on tobacco plants. Appl. Soil. Ecol., 82, 18–25. doi: 747 10.1016/j.apsoil.2014.05.002 748 Zhang, R., Vivanco, J.M.and Shen, Q. (2017). The unseen rhizosphere root-soil-microbe interactions 749 for crop production. Curr. Opin. Microbiol., 37, 8-14. doi: 10.1016/j.mib.2017.03.008 Zhu, S., Vivanco, J.M.and Manter, D.K. (2016). Nitrogen fertilizer rate affects root exudation, the 750 751 rhizosphere microbiome and nitrogen-use-efficiency of maize. Appl. Soil. Ecol., 107, 324-752 333. doi: 10.1016/j.apsoil.2016.07.009 753 Zipfel, C.and Oldroyd, G.E.D. (2017). Plant signalling in symbiosis and immunity. Nature. 543, 328-754 336. doi: 10.1038/nature22009 755 Figure 1. Rhizobacterial taxonomic composition in culture-independent and -dependent 756 communities of wheat grown in soils with and without fertilizer addition. Venn diagram showing 757 the number and proportion of unique ASVs (at 97% similarity) in (A) culture-independent and (B)

- 758 culture-dependent communities and (C) shared ASVs detected with both methods. Pie charts
- correspond to the percentage of bacterial phyla and classes of Proteobacteria assigned to each ASV.

760 Figure 2. Culture-independent (CI) and culture-dependent (CD) bacterial community diversity

in the rhizosphere and rhizoplane of wheat grown in soils with and without fertilizer addition.

- 762 (A) PCoA plots of bacterial composition based on weighted UniFrac distances for CI and CD
- 763 communities at ASV level. The percentage shown in each axis corresponds to the proportion of 764 available diverging each axis corresponds to the proportion of 764
- variation explained. (B) Alpha diversity estimates at ASV level for rhizosphere and rhizoplane
 bacterial communities in non-fertilized and fertilized wheat; with median (line) and hinges at first
- and third quartiles (25th and 75th percentiles). Significant differences as determined by two-way type
- 767 III ANOVA are shown by '**' for p<0.01 between treatment groups. Symbols represent rhizosphere
- 768 (open circles) and rhizoplane (closed circles) samples from non-fertilized (red) and fertilized (blue)
- 769 wheat.

770 Figure 3. Influence of different culture-agar on bacterial community diversity and structure in

771 the rhizosphere of wheat grown in soils with and without fertilizer. (A) Alpha diversity estimates

- at ASV level for rhizosphere bacterial communities grown on 8 agar types with median (line) and
- hinges at first and third quartiles (25th and 75th percentiles). Significant differences as determined by
- two-way type III ANOVA are shown by '**' for p<0.01 between treatment groups. (B) PCoA plot of
- bacterial community composition based on weighted UniFrac distances at ASV level, colored by
- 776 fertilizer treatment. Symbols represent the isolation media that bacteria were cultured on from
- rhizosphere samples: TSA (10th conc.) (circles), TSA (squares), TYG (up-triangles), YEM (down-
- triangles), M408 (diamond), M715 (hexagon), FM (plus), TWYE (cross). (C) Average relative
- abundances of bacterial phyla within the bacterial 16S V3-V4 sequences. Identifications are based on
- the SILVA database for prokaryotes.

781 Figure 4. Relative abundance of culturable rhizobacteria with plant growth-promoting traits

782 isolated from wheat grown in soils with and without fertilizer. (A) Nitrate-, phosphate-,

potassium-, iron-, and zinc-solubilization as determined by casein, PVK, AVK, CAS, and zinc
 carbonate agar, respectively. Casein, phosphate, potassium and zinc solubilization are indicated by

- carbonate agar, respectively. Casein, phosphate, potassium and zinc solubilization are indicated by
 clear halos surrounding the colony whereas orange halos indicate iron solubilization. Salt tolerance as
- determined by 10TSA supplemented with 5% NaCl. Box plots show relative abundance of **(B)**
- solubilizing isolates and salt tolerant isolates and (C) relative abundance of PGPR isolates, as
- determined by functional bioassays; with median (line) and hinges at first and third quartiles (25th
- and 75th percentiles). Each point represents an isolate library (n=94) derived from rhizosphere (open
- circles) and rhizoplane (closed circles) samples. Single colonies were isolated from different non-
- selective agar and 10TSA respectively and inoculated in TSB (1/10th conc.) in a 96-well plate; sterile
- TSB ($1/10^{\text{th}}$ conc.) in 2x wells were left uninoculated to act as a negative control. Significant
- differences as determined by chi-squared tests are shown by '*' and '****' for p<0.05 and p<0.0001

794 Figure 5. Effect of chemical fertilizer (NPK) on absolute abundance of culturable bacteria

- 795 isolated from the rhizosphere and rhizoplane of wheat grown in low nutrient soil. (A) Absolute
- abundance (log CFU counts.g soil-1; CFU is colony-forming units) of culturable rhizobacteria
- isolated from soil samples on 10TSA. (B) Absolute abundance (log CFU counts.g soil-1) of nutrient
- solubilizing rhizobacteria as determined by functional bioassays. Significant differences as
 determined by post-hoc multiple comparison tests with Šidák correction are shown by '*' a
- determined by post-hoc multiple comparison tests with Šidák correction are shown by '*' and '**' for p < 0.05 and p < 0.01 respectively.
- 800 for p<0.05 and p<0.01, respectively.

- 801 Figure 6. Heatmaps representing abundance and associated functional ability of bacterial
- 802 isolates from rhizosphere (RS) and rhizoplane (RP) samples from non-fertilized (NF) and
- 803 fertilized (F) wheat. (A) The full region of the 16S rRNA gene was amplified and sequenced for
- 804 each rhizobacterial isolate. Identifications are based on the SILVA database for prokaryotes. Grey
- indicates relative abundance of genera in each sample (no. of isolates per sample shown below
 columns). Red indicates relative abundance of positively solubilizing isolates from total number of
- isolates sequenced (541). 'n' shows number of genera identified from total number of isolates
- solve isolates sequenced (341). If shows number of general identified from total number of isolates sequenced. (**B**) All culturable rhizobacterial isolate sequences and (**C**) plant growth-promoting
- rhizobacteria (PGPR) isolate sequences were used to create a database with which the culture-
- 810 independent (CI) and culture-dependent (CD) amplicon datasets were searched against using blast at
- 811 100 percent sequence identity.

812 Figure 7. Box plots showing relative abundance of ASVs identified as putative plant growth-

- 813 promoting rhizobacteria (PGPR) in culture-independent and -dependent isolate datasets. A
- 814 PGPR database was created from 16S rRNA gene sequences from culturable bacterial isolates with
- 815 acquisitional traits for key plant nutrients. Each point represents the proportion of ASVs that were
- 816 identified as Bacteria in CI and CD datasets, with median (line) and hinges at first and third quartiles
- 817 (25th and 75th percentiles).. Significant differences as determined by post-hoc multiple comparison
- tests with Šidák correction are shown by '*' and '**' for p<0.05 and p<0.01, respectively.

819 Figure 8. ASVs that significantly differ in abundance in non-fertilized wheat vs. fertilized

- 820 wheat. Differentially abundant ASVs detected by DESeq2 at a significance level of $p_{adjusted} < 0.05$
- 821 which were found to be enriched in (A) culture-independent (CI) and (B) culture-dependent (CD)
- 822 rhizosphere (open circles) and rhizoplane (closed circles) communities in non-fertilized and fertilized
- 823 wheat. ASVs depicted in bold were also detected in the isolate dataset. Only ASVs classified to
- genus level are pictured; for full list see supplementary material.