

1 **Diversity of viruses and viroids in the rhizosphere of common bean cultivars**
2 **differing in resistance to the fungal root pathogen *Fusarium oxysporum***

3
4 Lucas P P Braga^{1*} (ORCID: 0000-0003-2789-7252), Andrew J Tanentzap¹ (ORCID: 0000-0002-2883-1901), Benjamin
5 Lee^{2,3} (ORCID: 0000-0002-7133-8397), Siu Mui Tsai⁴ (ORCID: 0000-0002-3733-6312), Jos M Raaijmakers^{5,6}(ORCID: 000-
6 0003-1608-6614), Rodrigo Mendes⁷ (ORCID: 0000-0002-9817-4118) and Lucas W Mendes⁴ (ORCID: 0000-0003-0980-7006)

7
8 ¹Ecosystems and Global Change Group, Department of Plant Sciences, University of Cambridge, Cambridge CB2 3EA,
9 United Kingdom

10 ²National Center for Biotechnology Information, National Library of Medicine, National Institutes of Health, Bethesda,
11 MD 20894, USA

12 ³Nuffield Department of Medicine, University of Oxford, Oxford OX3 7BN, UK

13 ⁴Cell and Molecular Biology Laboratory, Center for Nuclear Energy in Agriculture (CENA), University of Sao Paulo,
14 Piracicaba, SP 13416-000, Brazil

15 ⁵Department of Microbial Ecology, Netherlands Institute of Ecology, Wageningen, The Netherlands.

16 ⁶Institute of Biology, Leiden University, Leiden, The Netherlands.

17 ⁷Embrapa Meio Ambiente, Jaguariuna, SP 18020-000, Brazil

18
19 *corresponding author

20 E-mail: lb863@cam.ac.uk (LPPB)

21
22
23 *Abstract*

24 The rhizosphere microbiome plays a key role in plant protection against soil-borne pathogens. Plant
25 breeding for resistance against soil-borne pathogens can alter the rhizosphere microbiome.
26 However, most studies have focused on bacterial and fungal communities, leaving the role of the
27 virus and viroids unassessed. Here, we tested the influence of resistance breeding on the
28 composition of rhizosphere viruses and viroids. By analyzing metatranscriptomes from the
29 rhizosphere of common bean (*Phaseolus vulgaris*) cultivars with varying resistance to the soil-
30 borne pathogen *Fusarium oxysporum*, we recovered sequences representing 78 and 23 novel
31 populations of viruses and viroids, respectively. We compared the abundances of these infectious
32 agents across the different cultivars and found that the *Fusarium*-resistant cultivar harbored >1.2
33 times more viroids and a more different composition of viroids and viruses than less resistant plants.
34 Given their role in interfering with host metabolism and their potential influence on plant-fungi
35 associations, our study suggests that changes in the rhizosphere infectome are an important
36 consideration in breeding for resistance against soil-borne pathogens.

37
38 *Key words*

39 rhizosphere microbiome; plant-microbe interactions; infectome; food security

40

41 The rhizosphere is the first line of defense against soil-borne pathogens (Mendes et al.,
42 2013), from which plants are able to recruit protective microbes when they are attacked by
43 pathogens (Berendsen et al., 2012). Recent studies have shown that plant breeding can change the
44 composition of the rhizosphere microbiome (Mendes et al., 2018; Wei and Jousset, 2017). To date,
45 however, rhizosphere microbiome studies have almost exclusively focused on bacterial and fungi,
46 with little attention given to other microbiome members including protists, viruses, and viroids. The
47 latter two microbiome members have the potential to affect plant-mycorrhizal interactions in the
48 context of disease (Andika et al., 2017; Wei et al., 2019). For example, viral infections can convert a
49 phytopathogenic fungi into a beneficial endophyte (Zhang et al., 2020), whilst viroids have been
50 experimentally demonstrated to reduce the growth and virulence of different phytopathogenic fungi,
51 including *Fusarium* (Wei et al., 2020, 2019). However, how the composition of rhizosphere viruses
52 and viroids differ between disease susceptible and resistant plants remains unassessed.

53 Here, we tested the hypothesis that the composition of viruses and viroids in the rhizosphere
54 microbiome of the common bean (*Phaseolus vulgaris*) differed between cultivars that were resistant
55 versus susceptible to a soil-borne pathogen. To this end, we analyzed the RNA sequences obtained
56 from the rhizosphere metatranscriptomes of three common bean cultivars that span a gradient of
57 disease susceptibility to the widespread, root pathogenic fungus *Fusarium oxysporum*. These
58 cultivars were either resistant (cultivar IAC Milenio (Carbonell et al., 2014)), moderately resistant
59 (cultivar BRS Estilo (Melo et al., 2010)), or susceptible (cultivar IAC Alvorada (Carbonell et al.,
60 2008)). To simulate realistic field conditions for rhizosphere selection of plant-microbe interactions,
61 the plants were not infected with *Fusarium* in the experiment, as artificial infections interfere with
62 the natural process of root colonization by soil-borne microbes. Metatranscriptomes were obtained
63 from the rhizosphere of three replicates from each of the three cultivars grown in pots under
64 controlled greenhouse conditions. Plants were harvested at the early flowering stage, which is most
65 representative for our studies because rhizosphere microbial communities converge once they reach
66 this stage (Chaparro et al., 2014).

67 To recover viral sequences, metatranscriptomes were quality filtered and assembled with
68 IDBA-UD (Peng et al., 2012). Contigs (>3,000bp) were then screened with VirSorter2 (Guo et al.,
69 2021), Seeker (Auslander et al., 2020) and DeepVirFinder (Ren et al., 2017). These analyses
70 resulted in 251 sequences predicted as viruses that clustered into 155 viral operational taxonomic
71 units (vOTUs), *i.e.* sharing >95% average nucleotide identity across 80% of the length of the
72 shorter contig (Roux and Emerson, 2022). Only sequences classified by at least two of these tools
73 were considered in further analyses. The vOTUs were further quality controlled following the

74 standard operational procedure using CheckV (Nayfach et al., 2021), including annotations of
75 encoded functional domains (Supplementary Material and Methods). A total of 78 sequences were
76 subsequently considered as bona fide viral sequences. Half of these sequences were predicted to be
77 medium- or high-quality genomes, with 32% expected to be >90% complete genomes
78 (Supplementary Table 1). Forty-two sequences were further confirmed as RNA viruses based on the
79 presence of viral RNA-dependent RNA polymerase (RdRp) identified with Palmscan (Edgar et al.,
80 2022). Based on their RdRp sequences (*i.e.*, palmprints), vOTUs 54 and 57 represented variants
81 from the same clade. The same was true for vOTUs 63 and 64. All the other RNA virus sequences
82 were inferred to represent distinct species (Supplementary table 1). Taxonomic classifications and
83 host predictions were inferred based on sequence similarity against the NCBI Virus database
84 (Hatcher et al., 2017).

85 The viral RNA genomes were found to represent novel populations closely related with
86 viruses infecting plants, phytopathogenic fungi, insects, invertebrates or rhizobacteria. They were
87 classified as Leviviricetes (26.92%), Picornavirales (7.69%), Sobemovirus (2.56%), Tombusviridae
88 (2.56%), Totiviridae (2.56%), Endornaviridae (2.56%), including two *Phaseolus vulgaris*
89 Alphaendornaviruses (PvEVs), Amalgaviridae (1.28%), Partiviridae (1.28%), Reovirales (1.28%),
90 and other reference Riboviria viruses (5%) still unclassified at higher taxonomic ranks. The two
91 genomes classified as PvEV were predicted to be high-quality (>90% completeness) and produced
92 whole genome alignments with 100% coverage and $\geq 97\%$ identity against reference PvEV
93 genomes.

94 To recover viroid sequences, the assembled contigs (>300bp) were screened with Vdsearch,
95 a tool tailored to identify viroid covalently closed circular RNAs (Lee et al., 2022). We found 23
96 viroid-like sequences, hereafter referred to as viroids for simplicity (Supplementary Table 2).
97 Twelve were symmetric, containing one ribozyme per polarity, and 11 were asymmetric, containing
98 a ribozyme only in one polarity. All but one of the symmetric sequences contained well described
99 autocatalytic hammerhead ribozymes (HHRs), with HHR3 being the predominant form among
100 them. The symmetric viroid sequence that was the exception contained a twister ribozyme (twister-
101 P1), which has been recently described (Roth et al., 2014), and is less commonly distributed in
102 nature as the HHR pattern (Lee et al., 2022; Roth et al., 2014). Among the asymmetric sequences,
103 HHRs were also predominant, and one of them matched the twister-P1 motif. Generally, viroids
104 had >70% of nucleotides self-paired and several even had perfect rod-shaped conformations. The
105 size and structure of the identified sequences all matched expected viroid-like patterns (Lee et al.,
106 2022; Roth et al., 2014).

107 We then compared the abundances of viruses and viroids between the cultivars and found
108 differences in their composition in the rhizosphere (Figs. 1 and 2). We found that resistance
109 breeding was positively correlated with the total abundance of viroids in the rhizosphere. Viroids
110 were >1.2-times more abundant, on average, in the *Fusarium*-resistant cultivar compared to the
111 susceptible ones ($p < 0.05$; Fig. 1b). This effect was not detected for the total fraction of viral
112 sequences (Fig. 1a). Nevertheless, the abundance of individual viral populations was influenced by
113 plant resistance to *Fusarium*, with most of the changes being observed when comparing resistant
114 against susceptible cultivars ($p < 0.05$; Fig. 2). Most vOTUs were related with uncultivated viruses
115 that were first detected in Chinese soils (Supplementary Table 1), including the rhizosphere (Chen
116 et al., 2022). The differences in the abundance of vOTUs were observed in all pairwise
117 comparisons, but greater impacts were detected comparing the resistant against the susceptible
118 cultivar ($p < 0.05$; Fig. 2). Similarly, individual populations of viroids also diverged significantly
119 when comparing the *Fusarium*-resistant cultivar against the moderately susceptible and susceptible
120 cultivars ($p < 0.05$; Fig. 2). Although the total abundance of viroids was greater in the resistant
121 cultivar (Fig. 1b), three viroid populations were enriched in the more susceptible cultivars (Fig. 2).
122 These results highlight that viral and viroid diversity in the rhizosphere may be driven by different
123 mechanisms, likely arising from the many possible trophic interactions between plants and their
124 microbiomes.

125 To explore the consequences of resistance breeding for the community composition of
126 viruses and viroids in the rhizosphere, we performed a co-occurrence analysis for each cultivar. This
127 analysis allowed us to assess the stability of rhizosphere interactions under resistance breeding and
128 identify keystone taxa (Freeman et al., 1991; Salavaty et al., 2020), which are typically considered
129 to be disproportionately important for the network (Röttjers and Faust, 2018). We estimated the co-
130 occurrence networks only using pairwise correlations between viruses and viroids that were
131 statistically significant when correcting for multiple comparisons for each virus and viroid (see
132 Methods). We found that the number of correlations between viruses and viroids in the rhizosphere
133 of resistant cultivars was higher than for other cultivars, with nearly twice as many correlations as
134 the susceptible cultivars (Fig. 3; $p < 0.001$). From the network, we extracted topological features
135 that described the stability of co-occurrence patterns, such as betweenness centrality and degree
136 scores (Supplementary Table 3). Based on these metrics, the rhizosphere of resistant cultivars was
137 more stable than the other cultivars, as it was composed of nodes with significantly higher values of
138 both betweenness centrality and degrees (Fig. 4; $p < 0.05$). Moreover, the identity of keystone viruses
139 and viroids was completely altered in response to resistance breeding (Supplementary Table S3).
140 Most keystone taxa represent novel viral populations, and some included members from the

141 Leviviricetes and Picornavirales, which are groups that infect prokaryotes and eukaryotes (including
142 plants), respectively. Compared to the other genotypes, the much lower betweenness centrality
143 scores in the susceptible cultivar suggests absence of keystone nodes in this network
144 (Supplementary Table 3).

145 Overall, 94% and 95% of the associations found in the resistance network were absent from
146 the moderately resistant and the susceptible cultivars, respectively. These results consistently
147 support the finding that resistance breeding altered the composition of viruses and viroids in the
148 rhizosphere. Resistance against soil-borne pathogens led to more unique, complex, and stable
149 interactions between rhizosphere viruses and viroids (Figs. 3 and 4). This pattern mirrors that
150 observed for rhizosphere bacterial communities analyzed in these systems (Mendes et al., 2018) and
151 elsewhere, where more complex networks have been proposed to represent communities that are
152 better able to resist pathogen invasions (Mallon et al., 2015; Wei et al., 2015).

153 Here we found two lines of evidence that crop breeding for resistance against a specific
154 fungal pathogen was also associated with large changes in the rhizosphere-associated “infectome”,
155 that is, the collection of infectious agents composed of viruses and viroids. First, more resistant
156 plants generally harbored more viroids and had altered infectome composition (Figs 1 and 2).
157 Second, co-occurrence patterns dramatically changed across the gradient of disease resistance, with
158 resistant cultivars showing evidence of having more stable infectomes (Figs. 3 and 4). Plant traits
159 can influence the rhizosphere infectome by selecting microbial hosts from the soil stock and also by
160 releasing infectious agents replicated in their cells to the rhizosphere. For example, we found that
161 the core infectome in the resistant cultivars had more active bacteriophages than the other cultivars,
162 and the recovery of complete PvEVs genomes from the rhizosphere in our experiment further
163 confirms that viruses produced in plant cells can be released by the roots. The same mechanism can
164 apply to viroids, where their release into the rhizosphere is facilitated by their accumulation in root
165 cells (Góra-Sochacka et al., 2019; Wang et al., 2011). Furthermore, plant viruses and viroids can be
166 transmitted vertically (Matsushita et al., 2018; Mutuku et al., 2018), so, in addition to the soil stock
167 (horizontal transmission), the rhizosphere infectome can be influenced by seed-borne infectious
168 agents (vertical transmission) (Johnston-Monje et al., 2021; Simonin et al., 2022). Therefore, plant
169 genotype should affect rhizosphere infectome composition and that may alter the interactions
170 between plants and their soil-borne pathogens.

171 Our study outlines the importance of considering changes in the rhizosphere infectome when
172 breeding for resistance against soil-borne pathogens. Plant pathogens represent a significant threat
173 to crop production, contributing, on average, to 11-30% of global yield losses (van Esse et al.,
174 2020). Resistance breeding is one of the most important and sustainable strategies to protect against

175 pathogens. However, resistance breeding is challenging given the complex arms-race dynamics
176 involving plant-pathogen interactions, and often has short-term durability due to pathogen evolution
177 (McDonald and Linde, 2002; Nelson et al., 2018). It is important to explore further the direction of
178 causality between the rhizosphere infectome and plant protection against soil-borne pathogens. For
179 example, some viruses and viroids may be able to infect phytopathogens or influence the
180 composition of the rhizomicrobiome, both of which may confer protection to plants against
181 colonizing pathogens. At the same time, the composition of these viruses and viroids can also be
182 influenced by the plant genotype, that determines the recruitment of specific bacteria and fungi.
183 Hence, bidirectional causality may also be considered in this case. In our system, the mechanisms
184 determining the differences in infectome composition still needs to be determined. Nevertheless, we
185 provide evidence suggesting that a better understanding of the role of viruses and viroids in the
186 rhizosphere, as well as their response to plant breeding against soil-borne pathogen, are an
187 important consideration for breeding programs aimed at improving food security.

188

189 **Acknowledgements**

190 We thank Prof. John Carr from the Plant Virology Group, Department of Plant Sciences, University
191 of Cambridge for helpful comments provided on an initial draft. LPPB and LWM thank FAPESP
192 (grant numbers: 2014/03217-3; 2015/00251-9; 2018/19247-0; 2019/24097-0; 2019/16043-7). LWM
193 also thanks Coordenação de Aperfeiçoamento de Pessoal de Nível Superior (CAPES
194 88887.185941/2018-00), and Conselho Nacional de Desenvolvimento Científico e Tecnológico
195 (CNPq 408191/2018-0; 307670/2021-0).

196

197 **Author contribution**

198 LPPB, SMT, JOS, RM and LWM designed the research; LPPB and LWM performed the research.
199 LPPB, BL and AJT analyzed the data; LPPB and AJT wrote the manuscript. All authors read and
200 approved the final manuscript.

201

202 **Data availability**

203 The metatranscriptomes used for this analysis are available at the MG-RAST server ([http://v4-
204 web.metagenomics.anl.gov](http://v4-web.metagenomics.anl.gov)) under the project ‘Common Bean Rhizosphere Metatranscriptome’
205 (mgp20659). Assembled virus and viroid sequences are publicly available on PATRIC server in the
206 workspace named RhizoB2023.

207

208 **Conflict of interest**

209 The authors declare that they have no conflict of interest.

210

211 **References**

212 Andika, I.B., Wei, S., Cao, C., Salaipeh, L., Kondo, H., Sun, L., 2017. Phytopathogenic fungus

213 hosts a plant virus: A naturally occurring cross-kingdom viral infection. *Proc. Natl. Acad. Sci.*

214 U. S. A. 114, 12267–12272. <https://doi.org/10.1073/pnas.1714916114>

215 Auslander, N., Gussow, A.B., Benler, S., Wolf, Y.I., Koonin, E. V, 2020. Seeker: alignment-free

216 identification of bacteriophage genomes by deep learning. *Nucleic Acids Res.* 48, e121–e121.

217 <https://doi.org/10.1093/nar/gkaa856>

218 Berendsen, R.L., Pieterse, C.M.J., Bakker, P.A.H.M., 2012. The rhizosphere microbiome and plant

219 health. *Trends Plant Sci.* 17, 478–486. <https://doi.org/10.1016/j.tplants.2012.04.001>

220 Carbonell, S.A.M., Chiorato, A.F., Bolonhezi, D., Barros, V.L.N.P. de, Borges, W.L.B., Ticelli, M.,

221 Gallo, P.B., Finoto, E.L., Santos, N.C.B. dos, 2014. “IAC Milênio” - Common bean cultivar

222 with high grain quality. *Crop Breed. Appl. Biotechnol.* 14, 273–276.

223 <https://doi.org/10.1590/1984-70332014v14n4c44>

224 Carbonell, S.A.M., Chiorato, A.F., Ito, M.F., Perina, E.F., Gonçalves, J.G.R., Souza, P.S., Gallo,

225 P.B., Ticelli, M., Colombo, C.A., Azevedo Filho, J.A., 2008. IAC-Alvorada and IAC-

226 Diplomata: new common bean cultivars. *Crop. Breed. Appl. Biotechnol.* 8, 163–166.

227 <https://doi.org/10.12702/1984-7033.v08n02a10>

228 Chaparro, J.M., Badri, D. V, Vivanco, J.M., 2014. Rhizosphere microbiome assemblage is affected

229 by plant development. *ISME J.* 8, 790–803. <https://doi.org/10.1038/ismej.2013.196>

230 Chen, Y.-M., Sadiq, S., Tian, J.-H., Chen, X., Lin, X.-D., Shen, J.-J., Chen, H., Hao, Z.-Y., Wille,

231 M., Zhou, Z.-C., Wu, J., Li, F., Wang, H.-W., Yang, W.-D., Xu, Q.-Y., Wang, W., Gao, W.-H.,

232 Holmes, E.C., Zhang, Y.-Z., 2022. RNA viromes from terrestrial sites across China expand

233 environmental viral diversity. *Nat. Microbiol.* 7, 1312–1323. [https://doi.org/10.1038/s41564-](https://doi.org/10.1038/s41564-022-01180-2)

234 [022-01180-2](https://doi.org/10.1038/s41564-022-01180-2)

235 Edgar, R.C., Taylor, J., Lin, V., Altman, T., Barbera, P., Meleshko, D., Lohr, D., Novakovsky, G.,

236 Buchfink, B., Al-Shayeb, B., Banfield, J.F., de la Peña, M., Korobeynikov, A., Chikhi, R.,

237 Babaian, A., 2022. Petabase-scale sequence alignment catalyses viral discovery. *Nature* 602,

238 142–147. <https://doi.org/10.1038/s41586-021-04332-2>

239 Freeman, L.C., Borgatti, S.P., White, D.R., 1991. Centrality in valued graphs: A measure of

240 betweenness based on network flow. *Soc. Networks* 13, 141–154.

241 [https://doi.org/10.1016/0378-8733\(91\)90017-N](https://doi.org/10.1016/0378-8733(91)90017-N)

242 Góra-Sochacka, A., Więsyk, A., Fogtman, A., Lirski, M., Zagórski-Ostoja, W., 2019. Root

243 Transcriptomic Analysis Reveals Global Changes Induced by Systemic Infection of *Solanum*
244 *lycopersicum* with Mild and Severe Variants of Potato Spindle Tuber Viroid. *Viruses* 11, 992.
245 <https://doi.org/10.3390/v11110992>

246 Guo, J., Bolduc, B., Zayed, A.A., Varsani, A., Dominguez-Huerta, G., Delmont, T.O., Pratama,
247 A.A., Gazitúa, M.C., Vik, D., Sullivan, M.B., Roux, S., 2021. VirSorter2: a multi-classifier,
248 expert-guided approach to detect diverse DNA and RNA viruses. *Microbiome* 9, 37.
249 <https://doi.org/10.1186/s40168-020-00990-y>

250 Hatcher, E.L., Zhdanov, S.A., Bao, Y., Blinkova, O., Nawrocki, E.P., Ostapchuck, Y., Schäffer,
251 A.A., Brister, J.R., 2017. Virus Variation Resource – improved response to emergent viral
252 outbreaks. *Nucleic Acids Res.* 45, D482–D490. <https://doi.org/10.1093/nar/gkw1065>

253 Johnston-Monje, D., Gutiérrez, J.P., Lopez-Lavalle, L.A.B., 2021. Seed-Transmitted Bacteria and
254 Fungi Dominate Juvenile Plant Microbiomes. *Front. Microbiol.* 12.

255 Lee, B.D., Neri, U., Roux, S., Wolf, Y.I., Camargo, A.P., Krupovic, M., Simmonds, P., Kyrpides, N.,
256 Gophna, U., Dolja, V. V, Koonin, E. V, 2022. A vast world of viroid-like circular RNAs
257 revealed by mining metatranscriptomes. *bioRxiv* 2022.07.19.500677.
258 <https://doi.org/10.1101/2022.07.19.500677>

259 Mallon, C.A., Elsas, J.D. van, Salles, J.F., 2015. Microbial Invasions: The Process, Patterns, and
260 Mechanisms. *Trends Microbiol.* 23, 719–729. <https://doi.org/10.1016/j.tim.2015.07.013>

261 Matsushita, Y., Yanagisawa, H., Sano, T., 2018. Vertical and Horizontal Transmission of
262 Pospiviroids. *Viruses* 10, 706. <https://doi.org/10.3390/v10120706>

263 McDonald, B.A., Linde, C., 2002. PATHOGEN POPULATION GENETICS, EVOLUTIONARY
264 POTENTIAL, AND DURABLE RESISTANCE. *Annu. Rev. Phytopathol.* 40, 349–379.
265 <https://doi.org/10.1146/annurev.phyto.40.120501.101443>

266 Melo, L.C., Peloso, M.J. Del, Pereira, H.S., Faria, L.C. de, Costa, J.G.C. da, Díaz, J.L.C., Rava,
267 C.A., Wendland, A., Abreu, Â. de F.B., 2010. BRS Estilo: common bean cultivar with Carioca
268 grain, upright growth and high yield potential. *Crop Breed. Appl. Biotechnol.* 10, 377–379.
269 <https://doi.org/10.1590/S1984-70332010000400015>

270 Mendes, L.W., Raaijmakers, J.M., de Hollander, M., Mendes, R., Tsai, S.M., 2018. Influence of
271 resistance breeding in common bean on rhizosphere microbiome composition and function.
272 *ISME J.* 12, 212–224. <https://doi.org/10.1038/ismej.2017.158>

273 Mendes, R., Garbeva, P., Raaijmakers, J.M., 2013. The rhizosphere microbiome: significance of
274 plant beneficial, plant pathogenic, and human pathogenic microorganisms. *FEMS Microbiol.*
275 *Rev.* 37, 634–663. <https://doi.org/https://doi.org/10.1111/1574-6976.12028>

276 Mutuku, J.M., Wamonje, F.O., Mukeshimana, G., Njuguna, J., Wamalwa, M., Choi, S.-K., Tungadi,

277 T., Djikeng, A., Kelly, K., Domelevo Entfellner, J.-B., Ghimire, S.R., Mignouna, H.D., Carr,
278 J.P., Harvey, J.J.W., 2018. Metagenomic Analysis of Plant Virus Occurrence in Common Bean
279 (*Phaseolus vulgaris*) in Central Kenya. *Front. Microbiol.* 9, 2939.
280 <https://doi.org/10.3389/fmicb.2018.02939>

281 Nayfach, S., Camargo, A.P., Schulz, F., Eloë-Fadrosh, E., Roux, S., Kyrpides, N.C., 2021. CheckV
282 assesses the quality and completeness of metagenome-assembled viral genomes. *Nat.*
283 *Biotechnol.* 39, 578–585. <https://doi.org/10.1038/s41587-020-00774-7>

284 Nelson, R., Wiesner-Hanks, T., Wisser, R., Balint-Kurti, P., 2018. Navigating complexity to breed
285 disease-resistant crops. *Nat. Rev. Genet.* 19, 21–33. <https://doi.org/10.1038/nrg.2017.82>

286 Peng, Y., Leung, H.C.M., Yiu, S.M., Chin, F.Y.L., 2012. IDBA-UD: a de novo assembler for single-
287 cell and metagenomic sequencing data with highly uneven depth. *Bioinformatics* 28, 1420–
288 1428. <https://doi.org/10.1093/bioinformatics/bts174>

289 Ren, J., Ahlgren, N.A., Lu, Y.Y., Fuhrman, J.A., Sun, F., 2017. {VirFinder}: a novel k-mer based
290 tool for identifying viral sequences from assembled metagenomic data. *Microbiome* 5, 69.

291 Roth, A., Weinberg, Z., Chen, A.G.Y., Kim, P.B., Ames, T.D., Breaker, R.R., 2014. A widespread
292 self-cleaving ribozyme class is revealed by bioinformatics. *Nat. Chem. Biol.* 10, 56–60.
293 <https://doi.org/10.1038/nchembio.1386>

294 Röttjers, L., Faust, K., 2018. From hairballs to hypotheses—biological insights from microbial
295 networks. *FEMS Microbiol. Rev.* 42, 761–780. <https://doi.org/10.1093/femsre/fuy030>

296 Roux, S., Emerson, J.B., 2022. Diversity in the soil virosphere: to infinity and beyond? *Trends*
297 *Microbiol.* 30, 1025–1035. <https://doi.org/https://doi.org/10.1016/j.tim.2022.05.003>

298 Salavaty, A., Ramialison, M., Currie, P.D., 2020. Integrated value of influence: an integrative
299 method for the identification of the most influential nodes within networks. *Patterns* 1, 100052.
300 <https://doi.org/10.1016/j.patter.2020.100052>

301 Segata, N., Izard, J., Waldron, L., Gevers, D., Miropolsky, L., Garrett, W.S., Huttenhower, C., 2011.
302 Metagenomic biomarker discovery and explanation. *Genome Biol.* 12, R60.
303 <https://doi.org/10.1186/gb-2011-12-6-r60>

304 Simonin, M., Briand, M., Chesneau, G., Rochefort, A., Marais, C., Sarniguet, A., Barret, M., 2022.
305 Seed microbiota revealed by a large-scale meta-analysis including 50 plant species. *New*
306 *Phytol.* 234, 1448–1463. <https://doi.org/10.1111/nph.18037>

307 van Esse, H.P., Reuber, T.L., van der Does, D., 2020. Genetic modification to improve disease
308 resistance in crops. *New Phytol.* 225, 70–86. <https://doi.org/https://doi.org/10.1111/nph.15967>

309 Wang, Y., Shibuya, M., Taneda, A., Kurauchi, T., Senda, M., Owens, R.A., Sano, T., 2011.
310 Accumulation of Potato spindle tuber viroid-specific small RNAs is accompanied by specific

311 changes in gene expression in two tomato cultivars. *Virology* 413, 72–83.
312 <https://doi.org/10.1016/j.virol.2011.01.021>

313 Wei, S., Bian, R., Andika, I.B., Niu, E., Liu, Q., Kondo, H., Yang, L., Zhou, H., Pang, T., Lian, Z.,
314 Liu, X., Wu, Y., Sun, L., 2020. Reply to Serra et al.: Nucleotide substitutions in plant viroid
315 genomes that multiply in phytopathogenic fungi. *Proc. Natl. Acad. Sci.* 117, 10129–10130.
316 <https://doi.org/10.1073/pnas.2001670117>

317 Wei, S., Bian, R., Andika, I.B., Niu, E., Liu, Q., Kondo, H., Yang, L., Zhou, H., Pang, T., Lian, Z.,
318 Liu, X., Wu, Y., Sun, L., 2019. Symptomatic plant viroid infections in phytopathogenic fungi.
319 *Proc. Natl. Acad. Sci.* 116, 13042–13050. <https://doi.org/10.1073/pnas.1900762116>

320 Wei, Z., Jousset, A., 2017. Plant Breeding Goes Microbial. *Trends Plant Sci.* 22, 555–558.
321 <https://doi.org/10.1016/j.tplants.2017.05.009>

322 Wei, Z., Yang, T., Friman, V.-P., Xu, Y., Shen, Q., Jousset, A., 2015. Trophic network architecture of
323 root-associated bacterial communities determines pathogen invasion and plant health. *Nat.*
324 *Commun.* 6, 8413. <https://doi.org/10.1038/ncomms9413>

325 Zhang, H., Xie, J., Fu, Y., Cheng, J., Qu, Z., Zhao, Z., Cheng, S., Chen, T., Li, B., Wang, Q., Liu,
326 X., Tian, B., Collinge, D.B., Jiang, D., 2020. A 2-kb Mycovirus converts a pathogenic fungus
327 into a beneficial endophyte for brassica protection and yield enhancement. *Mol. Plant* 13,
328 1420–1433. <https://doi.org/https://doi.org/10.1016/j.molp.2020.08.016>

329

330

331

332 **Figure captions**

333

334 **Figure 1 – Abundance of viral and viroid sequences in common bean cultivars differing in**
335 **resistance to the fungal root pathogen *Fusarium oxysporum*.** Boxplots show the relative
336 abundance of (a) viral and (b) viroid sequences in the rhizosphere metatranscriptomes of *P. vulgaris*
337 cultivars that are either resistant, moderately resistant or susceptible to *F. oxysporum*. Different
338 letters indicate statistically significant differences between cultivars according to a linear model
339 ($p < 0.05$). Horizontal lines denote medians with boxes spanning inter-quartile range and whiskers
340 extending to minimum and maximum values.

341

342 **Figure 2 - Composition of viral and viroid communities in common bean cultivars differing in**
343 **resistance to the fungal root pathogen *Fusarium oxysporum*.** Taxonomic classification of viral
344 populations was inferred based on similarity searches against the NCBI Virus database (Hatcher et

345 al., 2017), and the best hits were used to infer putative hosts for the recovered viral sequences.
346 Viroids were classified according to the ribozyme domains identified in both plus and minus strands
347 using Vdsearch (Lee et al., 2022). Italics denote sequences confirmed as RNA viruses and viroids
348 from those representing transcripts of DNA viruses or incomplete RNA virus genomic sequence not
349 encoding sufficient information for confident classification (see Supplementary Material and
350 Methods and Supplementary Table 1). Taxonomy of viruses and ribozyme domains of viroids are
351 indicated between parentheses (see Supplementary Tables 1 and 2). For symmetric ribozymes,
352 semicolons separate identifications of different strands. HHR: hammerhead ribozyme. Populations
353 of viruses and viroids that respond to resistant breeding were detected by pairwise comparison of
354 differential abundances among *P. vulgaris* cultivars with different levels of susceptibility to *F.*
355 *oxysporum*. We used the effect size estimated from linear discriminant analysis (LEfSE) to detect
356 populations of viruses and viroids that were statistically different among cultivars (see
357 Supplementary Material). Relative abundances were obtained by normalizing read counts by
358 sequence length and total abundances using the LEfSE software according to default parameters
359 (Segata et al., 2011). * denotes populations that statistically differ in abundance between cultivars
360 ($p < 0.05$).

361
362 **Figure 3 - Potential rhizosphere-associated virus-viroid infectome.** Co-occurrence analysis
363 detected strong positive associations between viral (ellipse) and viroid (triangle) populations.
364 Associations (*i.e.* edges connecting nodes) were only visualized if the strength of a Spearman rank
365 correlation between virus and viroid populations was > 0.99 or < -0.99 , which was statistically
366 significant when adjusted for the multiple comparisons calculated for each population ($p = 0.0004$).
367 Nodes (indicate populations of viruses and viroids) with the top-10 highest betweenness centrality
368 across all three networks, *i.e.* keystone populations, were scaled in size to represent their importance
369 from greater (largest node) to smallest (Supplementary Table 3). Italicized labels denote sequences
370 confirmed as RNA viruses and viroids from either DNA or unclassified viruses (see Supplementary
371 Material and Methods and Supplementary Table 1). Taxonomy of viruses and ribozyme domains of
372 viroids were indicated where possible between parentheses (see Supplementary Tables 1 and 2).
373 HHR: hammerhead ribozyme; na: polarity without ribozyme.

374
375 **Figure 4 - Infectome stability increased with disease resistance.** Boxplots show the (a)
376 betweenness centrality and (b) degree of nodes from the networks in Fig. 3. This analysis was
377 performed using the nodes with the top-10 highest betweenness centrality and degree (see
378 Supplementary Table 3). Different letters indicate statistically significant differences between

379 cultivars according to a linear model ($p < 0.05$). Horizontal lines denote medians with boxes
380 spanning inter-quartile range and whiskers extending to minimum and maximum values.