

1 **Investigation of Systemic Granulomatosis in cultured meagre, *Argyrosomus regius*, using clinical**
2 **metagenomics**

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15

16 **ABSTRACT**

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18 Systemic granulomatosis is a peculiar disease of unknown etiology affecting meagre, *Argyrosomus*
19 *regius*, an important aquaculture fish species. Several pathogenic microorganisms have been suggested
20 as causative agents. In this study, we have applied amplicon metagenomics of the 16S rRNA gene in
21 kidneys of fish exhibiting different health states, ranging from apparently healthy to kidneys with
22 calcification. Comparison of the kidney microbiomes of the different fish groups showed that all fish had
23 similar bacterial communities. Linear discriminant analysis effect size revealed only three OTUs

24 significantly enriched in the sick individuals, with no known granuloma-causing species being present
25 among them, reinforcing the hypothesis of a non-infectious cause of the disease in this fish species.

26

27 **Keywords:** 16S rRNA amplicon sequencing, metagenomics, granuloma, meagre, microbiome, lesion

28

29 **Highlights**

- 30 • No known granuloma-causing species identified in calcified meagre kidneys
- 31 • Non-infectious cause of Systemic Granulomatosis in *Argyrosomus regius*
- 32 • Potential for clinical metagenomics to identify pathogens in fish

33

34 **1. INTRODUCTION**

35 Meagre, *Argyrosomus regius*, is one of the most promising fish species for the expansion and
36 diversification of the Mediterranean aquaculture since it is a fast grower especially in comparison to
37 gilthead seabream and European seabass, the two species which currently dominate marine
38 aquaculture production in the Mediterranean, and it has excellent flesh quality widely appreciated by
39 the consumers (Duncan et al., 2013). Meagre is very well adapted in the rearing process and is very
40 resilient to infectious diseases. However, this species is affected by a condition known as Systemic
41 Granulomatosis (SG) that seems to affect almost all farmed populations throughout the Mediterranean
42 (Ghittino et al., 2004; Katharios et al., 2011; Manuali et al., 2005). It is a disease of unknown etiology
43 manifested by the presence of multiple granulomas in all soft tissues. The most affected organ is the
44 kidney, however in severe cases granulomas can be found literally everywhere including the brain and
45 the eyes. As the disease progresses, granulomas may become necrotic and calcified rendering the fish
46 unacceptable for the consumer. The disease is not directly linked to mortalities, however affected

47 organs eventually contribute to reduced rearing performance of the fish. The severity of granulomatosis
48 varies between years and rearing locations (Katharios, personal observations).

49 A granuloma is an organized collection of inflammatory cells. Typically, the granuloma consists
50 of macrophages which are tightly arranged to wall-off the causative agent from the healthy tissue. These
51 macrophages are also called histiocytes, or epithelioid cells due to their morphological resemblance to
52 epithelial cells. Granulomas can have both infectious and non-infectious etiology (Ramakrishnan, 2012;
53 Shah et al., 2017). Relevant to human pathology, the most extensively studied are the infectious
54 granulomas especially those caused by Mycobacteria, while non-infectious granulomas are present in
55 diseases which are considered metabolic, autoimmune or of unknown mechanism like Crohn's disease,
56 sarcoidosis, and Granulomatosis with Polyangiitis (formerly Wegener's granulomatosis) and because of
57 the absence of an adequate animal model, are difficult to study. One of the criteria that often leads
58 pathologists to assume an infectious origin of a granuloma is the presence of necrosis (Aubry, 2012).
59 This is because necrosis is induced by the toxicity of the invoking agent (usually pathogenic bacteria)
60 leading to macrophage death (Ramakrishnan, 2012), whereas in foreign-body granulomas, sarcoidosis
61 and Crohn's disease there is no necrotic area inside the granuloma. An exception to this rule is
62 Granulomatosis with Polyangiitis, a rare non-infectious systemic disorder characterized by vascular
63 inflammation leading to necrotizing granulomas (Lutalo and D'Cruz, 2014). However, even in the case of
64 granulomatous diseases once considered to be of non-infectious etiology like Whipple's disease and cat
65 scratch disease, recent developments have revealed an infectious causative agent, the bacteria
66 *Tropheryma whipplei* for the former and *Bartonella henselae* for the latter (Ramakrishnan, 2012).

67 Metagenomic Next Generation Sequencing (mNGS) has revolutionized microbial ecology over
68 the past two decades since being a culture-independent technique it can be used to reveal the true
69 microbial diversity otherwise missed when using conventional cultivation methods (Handelsman, 2004).
70 Metagenomics have been extensively used in environmental microbiology, biotechnology and have

71 become the gold standard for gut microbiome research (Wang et al., 2015). The use of metagenomics in
72 clinical practice, especially for identifying pathogens within patient's samples, is an emerging and highly
73 promising application (Brown et al., 2018; Chiu and Miller, 2019; Huang et al., 2020). It is particularly
74 relevant in cases where the pathogen is not cultivable, "protected" in lesions surrounded by fibrous
75 tissue, and not readily visible in histopathology. It has also been applied in several studies assessing the
76 gut microbiome of cultured and wild fish (e.g. Burtseva et al., 2021; Yukgehnaish et al., 2020).

77 Both infectious and non-infectious etiologies have been hypothesized regarding the systemic
78 granulomatosis affecting meagre. Initially it was linked to fungal infection (Manuali et al., 2005) and
79 later to infection caused by *Nocardia* sp. (Elkesh et al., 2013). The latest research points rather to a
80 nutritional imbalance (Katharios et al., 2011; Kotzamanis et al., 2018; Ruiz García et al., 2019; Ruiz et al.,
81 2019; Tsertou et al., 2020). We have recently challenged the "infectious" etiology of the disease
82 (Tsertou et al., 2018), which is fueled by incidental findings of granuloma-inducing bacterial pathogens
83 like *Nocardia* sp. (Elkesh et al., 2013; Tsertou et al., 2018) and *Mycobacterium marinum* (Avsever et al.,
84 2014; Timur et al., 2015) in fish cultured in the open sea. Nevertheless, the histopathological picture of
85 the disease with the necrosis centrally located in meagre's granuloma cannot exclude entirely the
86 possibility of a "cryptic" pathogen which is both invisible in the histological sections and not cultivable.
87 Therefore, the aim of this study was to use metagenomic Next Generation Sequencing directly in DNA
88 extracted from kidney samples of meagre at three health states (a) healthy with no visible granulomas,
89 (b) SG-affected and (c) kidneys with calcification, in order to investigate the presence of pathogens
90 known to cause granulomas and to compare the microbiome in these three states. To our knowledge,
91 this is the second clinical application of mNGS in fish lesions as a tool for disease diagnosis in
92 aquaculture.

93

94 2. MATERIALS AND METHODS

95 **2.1 Fish samples**

96 All experimental procedures and handling that include the use of animals were conducted at the
97 Hellenic Center of Marine Research (HCMR) licensed facility (EL91-BIOexp-04) under the protocol
98 255.325 approved by the regional veterinary authority, which is the competent agency according to the
99 Directive 2010/63/EU. The fish used in this study were obtained by the meagre broodstock maintained
100 at the facilities of the Institute of Marine Biology, Biotechnology and Aquaculture (IMBBC), HCMR, Crete,
101 Greece and they were exclusively reared in tanks in inland facilities using borehole seawater (salinity:
102 35‰, pH: 7.5, T: 19.0 ± 1.0°C). In total, 27 fish with average body weight 28.90 ± 9.17 g and average
103 total length 13.72 ± 1.40 cm were euthanized with an overdose of anesthetic (Benzoak® Vet). Following
104 dissection, internal organs were visually examined. Samples from kidneys were removed, snap-frozen in
105 liquid nitrogen and stored at -80°C until analysis. In addition, fresh squash preparations of each sample
106 were examined and evaluated under a microscope for the presence of granulomas. For the visual
107 evaluation of granulomas, a modification of a semi-quantitative ordinal-scale scoring system was used,
108 which is described in detail in Tsertou et al. (2020). The evaluation of the kidney samples revealed 7
109 samples that did not have granulomas (health state: healthy/healthy with no visible granulomas,
110 samples with prefix “O”), 10 samples with granulomas visible macroscopically or microscopically (health
111 state: sick/SG-affected, samples with prefix “KOK”) and 10 samples with tissue calcification (health state:
112 sick/kidneys with calcification, samples with prefix “ASB”).

113

114 **2.2 DNA extraction, PCR amplification and 16S rRNA sequencing**

115 DNA was extracted from the kidney samples using the NucleoSpin Tissue kit
116 (MACHEREY- NAGEL), as recommended by the manufacturer. The quality of the extracted DNA was
117 evaluated by gel electrophoresis.

118 PCR amplification was performed targeting the V3–V4 region of the 16S rRNA gene using the
119 bacterial primer pair 341F (5'-CCTACGGGNGGCWGCAG-3') (Herlemann et al., 2011; Klindworth et al.,
120 2013) and the revised 805RB (5'-GACTACNVGGGTATCTAATCC-3') (Apprill et al., 2015; Pavloudi et al.,
121 2017). The Two-Step PCR Approach was used for this study, as described in Pavloudi et al. (2017).
122 Briefly, the first-step PCR was performed with the aforementioned primers containing a universal 5' tail
123 as specified in the Nextera library protocol from Illumina. The resulting PCR amplicons (~531 bp) were
124 purified using Agencourt AMPure XP magnetic beads (Beckman Coulter, Brea, CA, USA), quantified and
125 used as templates for the second-step PCR in order to include the indexes (barcodes), as well as the
126 Illumina adaptors. Amplifications were carried out using T100 Thermal Cycler (BIORAD, Hercules, CA,
127 USA). Again, the resulting PCR amplicons (~600 bp) were purified and quantified, mixed in equimolar
128 amounts and sequenced using a MiSeq Reagent Kit v3 (2 × 300-cycles) at the IMBBC (HCMR). The PCR
129 negative control sample (blank) was also sequenced, so that possible contamination during the library
130 preparation could be assessed.

131 All the raw sequence files of this study were submitted to the European Nucleotide Archive
132 (ENA) (Cummins et al., 2022) with the study accession number PRJEB43864 (available at
133 <http://www.ebi.ac.uk/ena/data/view/PRJEB43864>).

134

135 **2.3 Bioinformatics and Statistical analysis**

136 Raw sequence reads retrieved from all the samples were processed using PEMA (version 2.1.4)
137 (Zafeiropoulos et al., 2020) using VSEARCH for the assignation of OTUs (97% cut off) (Rognes et al.,
138 2016). The detailed parameters of the PEMA processing are given in Table S1. Taxonomic assignment
139 was performed with the SILVA database (version 132) (Quast et al., 2013). PEMA analyses were
140 supported by the IMBBC High Performance Computing system (Zafeiropoulos et al., 2021).

141 Similarity matrices between samples were generated using the Bray–Curtis coefficient,
142 calculated based on the relative abundances of the OTUs, and the Jaccard coefficient, calculated based
143 on the presence and absence of OTUs at each sample. Afterwards, non-metric multidimensional scaling
144 (nMDS) was used to visualize the relationship between the samples. An upset plot was created, as an
145 alternative to the Venn Diagram, to illustrate all the possible logical relations between the three health
146 states. LEfSe was used to estimate which microbiome attributes differ significantly by health state.

147 The phyloseq (version 1.36) (McMurdie and Holmes, 2013), microbiomeMarker (version 1.0.2)
148 (Cao, 2022), ggplot2 (version 3.3.5) (Wickham, 2016) and ComplexUpset (version 1.3.3) (Krassowski,
149 2020; Lex et al., 2014) packages were used in R (version 4.1.1) (R Core Team, 2021) for the creation of
150 bar charts, for the nMDS and PERMANOVA, simper, upset plot and for the linear discriminant analysis
151 (LDA) effect size (LEfSe).

152 In addition, analysis was carried out using Geneious software (v9.1, Biomatters, Auckland,
153 Australia) following the metagenomic analysis workflow for each state of granulomas (healthy,
154 granulomas, calcification). Briefly, reads were paired, trimmed with the BBDuk plugin to remove the
155 Illumina adapters, any base below an average quality score of 30 from the ends and reads that are less
156 100bp after end-trimming Paired end reads were then merged to produce a consensus sequence for
157 each pair with chimeric reads being removed. A high stringency de-novo assembly was then carried out
158 with a minimum overlap identity of 98% in order to cluster the contigs into OTU's and then BLAST
159 searched against a local copy of the NCBI 16S microbial database. These were then used to set up a local
160 database for each group which was analyzed using the Geneious Sequence Classifier plugin. The
161 minimum overlap identity for the lowest taxonomic level (species level) was 97%. Data outputs from
162 these tools were then used for comparative analysis.

163

164 **3. RESULTS**

165 **3.1 Microbial community composition as retrieved by PEMA**

166 The results of the processing of the sequences using PEMA are shown in Table S2. Due to a low
167 number of reads, sample ASB9_OO10_3 was removed from the further analysis of the PEMA results. The
168 final number of OTUs, after removal of the OTUs that were also found on the blank sample, was 462.
169 Overall, the most abundant phyla were Proteobacteria (~40% on the average of all the samples),
170 followed by Firmicutes (~29%) and Bacteroidetes (~22%) (Figure 1).

171 Although there seem to be differences in the microbial communities between the different
172 health states, the differences are much less pronounced when the presence/absence of the OTUs is
173 considered (Figure 2).

174 The nMDS of the microbial OTUs showed that there is no difference between the sick
175 (“SG_affected” and “kidneys with calcification”) and the healthy individuals, both when the relative
176 abundances were used (Figure 3) as well as when they were constructed based on presence/absence of
177 the OTUs (Figure 4); this was also confirmed by the PERMANOVA results (F.Model = 1.3567, $p = 0.203$;
178 F.Model = 1.0661, $p = 0.302$, respectively).

179 However, there was a statistically significant grouping based on the condition of the individuals,
180 i.e., healthy, SG-affected and samples with tissue calcification (relative abundances: F.Model = 2.0155, p
181 < 0.05 ; Presence/Absence: F.Model = 1.4098, $p < 0.05$). The OTUs that contribute most to this grouping,
182 as identified by the simpler analysis, their taxonomy, as well as the significance of any given OTU's
183 contribution, are shown in Table S3. Interestingly, there was no difference between the healthy and the
184 SG affected OTUs, based on the relative abundance of the OTUs.

185 As shown in the upset plot (Figure 5), the three conditions share the majority of OTUs (178
186 OTUs). There are 59 OTUs that are shared only between the SG affected and the samples with kidney
187 calcification and 16 OTUs that are shared only between the healthy samples and those with kidney
188 calcification (Table 1).

189

190 **3.2 LefSe analysis and LDA**

191 The LefSe analysis identified 12 OTUs with significant abundance differences between the three
192 groups (Figure 6, Figure S1, Table 2); out of those OTUs, only 2 were significantly enriched in the
193 calcified samples, namely Otu124 and Otu239. When the LefSe analysis was performed using two
194 groups, i.e., healthy and sick, there were only 2 OTUs enriched in the sick samples: Otu130, Otu185 and
195 Otu229 (Figures S2-S3, Table 1).

196 As shown in Figure 7, the healthy samples and the SG affected samples were very similar, while
197 certain OTUs from the list of the 12, were lost in the calcified kidneys. This loss of OTUs is even more
198 pronounced when the healthy and sick samples are compared (Figure S4).

199

200 **3.3 Microbial community composition as retrieved by Geneious**

201 The metagenomic analysis from the Geneious software showed that the phyla with the most
202 reads were Bacteroidetes (50.1% for the healthy kidneys, 39.4% for the kidneys with granulomas and
203 63.3% for the calcified kidneys), Proteobacteria (30.4% for the healthy, 30.9% for the kidneys with the
204 granulomas and 31.9% for the kidneys with calcification) and Firmicutes (13.4% for the healthy, 26.2%
205 for the kidneys with granulomas and 1.7% for the calcified kidneys). The total reads per phylum and
206 their corresponding prevalence for each of the health state of the kidneys are presented in Table 3.

207 In the phylum Bacteroidetes, the classes with the most reads for all the health states of kidneys
208 were Flavobacteriia (76.3% for healthy samples, 75.2% for samples with granulomas and 78% for
209 calcified samples) with most abundant species *Myroides ceti*, followed by Sphingobacteriia (22%, 22.2%
210 and 20.1% for healthy kidneys, kidneys with granulomas and calcified kidneys, respectively) with
211 *Pedobacter nutrimenti* as the most abundant species.

212 Accordingly, in the phylum of Proteobacteria, the class of Gammaproteobacteria had the most
213 reads in all three groups (49% in healthy kidneys, 42.3% in kidneys with granulomas and 45% in calcified
214 kidneys) followed by the Alphaproteobacteria (38.9% in healthy, 42.2% in kidneys with granulomas and
215 43.0% in kidneys with calcification). The main representatives of Gammaproteobacteria in the healthy
216 samples were the species *Pseudomonas fildesensis* and *P. miguale*, in the samples with granulomas were
217 the species *P. fildesensis* and *P. lini* and in the samples with calcification the species *P. veronii* and *P.*
218 *migulae*. Regarding Alphaproteobacteria the main representative in all groups was *Brevudimonas*
219 *albigilva*.

220 Finally in the phylum Firmicutes the class with the most reads in all groups was Bacilli (99.1% in
221 healthy kidneys, 99.6% in kidneys with granulomas, 95.7% in calcified kidneys) with the main
222 representative the species *Anoxybacillus flavithermus* subsp. *yunnanensis*. The taxa with the most reads
223 per health state of the kidneys are presented in Table 4. It should be stated that the identification of the
224 taxa to species level is based on an approximately 600bp fragment of the 16S and therefore the
225 resolution for certain genera might not be ideal.

226 The results obtained using Geneious are in accordance with the results of PEMA processing,
227 since there is no pathogen nor any unknown bacterium lacking from the healthy tissues while being
228 highly abundant in the SG-affected and calcified tissues.

229

230 **4. DISCUSSION**

231 Due to the similarities between the healthy and the SG affected samples, it can be suggested
232 that there is no apparent bacterial species that drives the onset of the systemic granulomatosis. The
233 principal bacterial species that have been identified as agents causing chronic and necrotizing
234 granulomas in fish and shellfish belong to the genera *Francisella* (Birkbeck et al., 2011), *Mycobacterium*
235 (Jacobs et al., 2009), *Nocardia* (Martínez-Lara et al., 2021), which were not found in our samples.

236 Pathogens of the last two genera like *Mycobacterium marinum* and *Nocardia seriolae* have been
237 associated with granulomatous diseases in meagre from Greece and Turkey (Avsever et al., 2014; Elkesh
238 et al., 2013; Timur et al., 2015; Tsertou et al., 2018). It should be noted however, that chronic infections
239 by these two pathogens are not uncommon in fish cultured in sea cages especially in fish that remain in
240 the cages for long (more than one year). The fish examined in the current study were young,
241 continuously grown in inland facilities provided with borehole water and never exposed to natural
242 seawater. Furthermore, previous extensive investigation in several stocks of meagre grown in our facility
243 using histology with special stains like Ziehl-Neelsen were always negative for these two pathogens
244 which are common suspects of granulomatous lesions verifying the results of this study. In addition,
245 apart from the aforementioned pathogens, *Edwarsiella tarda* (Miyazaki and Kaige, 1985), *Lactococcus*
246 *garvieae* (Castro et al., 2019) and *Streptococcus iniae* (Ortega et al., 2018) have also been identified as
247 etiological agents of granulomatosis, which were also not found in our samples. There was one OTU
248 classified as *Lactococcus* (Otu111) and three OTUs classified as *Streptococcus* (Otu36, Otu56, Otu287).
249 However, out of those only Otu56 was identified by the LefSe as a discriminating OTU, it was enriched in
250 the healthy samples and lost in the samples with granulomatosis; therefore, it cannot be the agent
251 causing the disease.

252 Several species of the genus *Pseudomonas* have been identified as pathological agents causing
253 granulomas in fish such as *P. plecoglossicida* (Sun et al., 2020), *P. putida* (Urku, 2021), *P. stutzeri* and *P.*
254 *oleovorans/pseudoalcaligenes* (Emam et al., 2022). There were 4 OTUs in our study that belonged to the
255 genus *Pseudomonas* (Otu3, Otu7, Otu294, Otu397) and there were found in all the three conditions. In
256 addition, none of them was included in the results of the LefSe analysis and none of them was identified
257 as one of the aforementioned species when blasted against the NCBI database, further corroborating
258 the fact that they were not responsible for the granulomatosis. On the other hand, further analysis with
259 Geneious showed that *Pseudomonas fildesensis* was present in both healthy and SG-affected fish but

260 almost absent in fish with calcification, while *Pseudomonas lini* was present in SG-affected fish with very
261 few reads obtained from the fish of the other groups and *Pseudomonas veronii* present only in fish with
262 calcification and completely absent from the other two groups. The genus of *Pseudomonas* contains 259
263 valid species and continues to expand with the addition of novel species every year (Girard et al., 2021).
264 The distinction of *Pseudomonas* species using 16S rRNA is rather challenging, especially for species
265 which are phylogenetically close like, *P. fildesensis* and *P. veronii* (Pavlov et al., 2020). Nevertheless, it
266 should be noted that none of the presumptively identified species have been previously reported as
267 pathogens nor are phylogenetically close to known pathogenic species of the genus capable of causing
268 granulomas like *P. plecoglocissida*. Until now, no pathological agents have been found to be responsible
269 for non-infectious systemic granulomatosis in meagre (Iaria et al., 2019). This is also suggested from the
270 results of our study, which further support the hypothesis of a non-infectious cause of this peculiar fish
271 disease (Tsertou et al., 2018).

272 Several studies have employed amplicon metagenomics of the 16S rRNA gene, as well as
273 shotgun metagenomics, for the assessment of microbial communities in skin mucus, stomach (Nurul et
274 al., 2019) and gut (Tyagi et al., 2019; Xing et al., 2013) of fish. The application of metagenomic analyses
275 has been increasingly applied in clinical microbiology the last years as a diagnostic tool for various
276 infectious diseases (Chiu and Miller, 2019; Forbes et al., 2018). Traditional microbiology techniques
277 applied to date are based on culturing the pathogen in the laboratory and identifying it through PCR
278 analyses using specific primers. Although these techniques are time-consuming, they are useful in case
279 the culture conditions, the sensitivity of the assays and the primers used are compatible and suitable for
280 the target microbe (Takhampunya et al., 2019). The fact that a large number of pathogens cannot be
281 isolated and cultured in the laboratory leads in many cases to the lack of identification of the causative
282 agent which is responsible for disease outbreaks, thus the development and use of techniques that are

283 independent of the culture of microorganisms is proving valuable, particularly for emerging pathogens
284 (Afshinnekoo et al., 2017; Miller et al., 2013; Mulcahy-O'Grady and Workentine, 2016).

285 To our knowledge, there has been only one other study so far where 16S rRNA high throughput
286 sequencing was used to suggest that the main causative pathogen responsible for the haemorrhagic
287 disease in turbot (*Scophthalmus maximus*) was *Edwardsiella* (Si et al., 2021). Although in this study only
288 diseased tissues were selected and there was no comparison with tissues from healthy individuals, it
289 was clear that the genus *Edwardsiella* was the most abundant in all the examined tissues. With the
290 present study, and due to the comparison between healthy and diseased individuals, we were able to
291 conclude that there was no bacterial pathogen responsible for the onset and development of systemic
292 granulomatosis in cultured meagre (*Argyrosomus regius*). This indicates the potential for further
293 applications of clinical metagenomics in fish, in an attempt to decipher whether known, or unknown,
294 pathogens are indeed the aetiological agents responsible for the onset and the progression of disease
295 or there are other causes of non-infectious nature involved.

296

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306

307 **6. CRediT author statement**

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317 **REFERENCES**

- 318 Afshinnekoo, E., Chou, C., Alexander, N., Ahsanuddin, S., Schuetz, A.N., Mason, C.E., 2017. Precision
319 Metagenomics: Rapid Metagenomic Analyses for Infectious Disease Diagnostics and Public
320 Health Surveillance. *J. Biomol. Tech. JBT* 28, 40–45. <https://doi.org/10.7171/jbt.17-2801-007>
- 321 Apprill, A., McNally, S., Parsons, R., Weber, L., 2015. Minor revision to V4 region SSU rRNA 806R gene
322 primer greatly increases detection of SAR11 bacterioplankton. *Aquat. Microb. Ecol.* 75, 129–137.
323 <https://doi.org/10.3354/ame01753>
- 324 Aubry, M.-C., 2012. Necrotizing granulomatous inflammation: what does it mean if your special stains
325 are negative? *Mod. Pathol.* 25, S31–S38. <https://doi.org/10.1038/modpathol.2011.155>
- 326 Avsever, M., Cavusoglu, C., Gunen, M., Yazicioglu, O., Eskiizmirli, S., Didinen, B., Tunaligil, S., Erdal, G.,
327 Ozden, M., 2014. The first report of *Mycobacterium marinum* isolated from cultured meagre,
328 *Argyrosomus regius*. *Bull. Eur. Assoc. Fish Pathol.* 34.
- 329 Birkbeck, T.H., Feist, S.W., Verner – Jeffreys, D.W., 2011. *Francisella* infections in fish and shellfish. *J. Fish*
330 *Dis.* 34, 173–187. <https://doi.org/10.1111/j.1365-2761.2010.01226.x>
- 331 Brown, J.R., Bharucha, T., Breuer, J., 2018. Encephalitis diagnosis using metagenomics: application of
332 next generation sequencing for undiagnosed cases. *J. Infect.* 76, 225–240.
333 <https://doi.org/10.1016/j.jinf.2017.12.014>
- 334 Burtseva, O., Kublanovskaya, A., Fedorenko, T., Lobakova, E., Chekanov, K., 2021. Gut microbiome of the
335 White Sea fish revealed by 16S rRNA metabarcoding. *Aquaculture* 533, 736175.
336 <https://doi.org/10.1016/j.aquaculture.2020.736175>
- 337 Cao, Y., 2022. microbiomeMarker: microbiome biomarker analysis toolkit.
- 338 Castro, R., Coll, J., Blanco, M. del M., Rodriguez-Bertos, A., Jouneau, L., Fernández-Garayzábal, J.F.,
339 Gibello, A., 2019. Spleen and head kidney differential gene expression patterns in trout infected

340 with *Lactococcus garvieae* correlate with spleen granulomas. *Vet. Res.* 50, 32.
341 <https://doi.org/10.1186/s13567-019-0649-8>

342 Chiu, C.Y., Miller, S.A., 2019. Clinical metagenomics. *Nat. Rev. Genet.* 20, 341–355.
343 <https://doi.org/10.1038/s41576-019-0113-7>

344 Cummins, C., Ahamed, A., Aslam, R., Burgin, J., Devraj, R., Edbali, O., Gupta, D., Harrison, P.W., Haseeb,
345 M., Holt, S., Ibrahim, T., Ivanov, E., Jayathilaka, S., Kadirvelu, V., Kay, S., Kumar, M., Lathi, A.,
346 Leinonen, R., Madeira, F., Madhusoodanan, N., Mansurova, M., O’Cathail, C., Pearce, M., Pesant,
347 S., Rahman, N., Rajan, J., Rinck, G., Selvakumar, S., Sokolov, A., Suman, S., Thorne, R., Totoo, P.,
348 Vijayaraja, S., Waheed, Z., Zyoud, A., Lopez, R., Burdett, T., Cochrane, G., 2022. The European
349 Nucleotide Archive in 2021. *Nucleic Acids Res.* 50, D106–D110.
350 <https://doi.org/10.1093/nar/gkab1051>

351 Duncan, N.J., Estévez, A., Fernández-Palacios, H., Gairin, I., Hernández-Cruz, C.M., Roo, J., Schuchardt,
352 D., Vallés, R., 2013. 17 - Aquaculture production of meagre (*Argyrosomus regius*): hatchery
353 techniques, ongrowing and market, in: Allan, G., Burnell, G. (Eds.), *Advances in Aquaculture*
354 *Hatchery Technology*, Woodhead Publishing Series in Food Science, Technology and Nutrition.
355 Woodhead Publishing, pp. 519–541. <https://doi.org/10.1533/9780857097460.3.519>

356 Elkesh, A., Kantham, K.P.L., Shinn, A.P., Crumlish, M., Richards, R.H., 2013. Systemic nocardiosis in a
357 Mediterranean population of cultured meagre, *Argyrosomus regius* Asso (Perciformes:
358 Sciaenidae). *J. Fish Dis.* 36, 141–149. <https://doi.org/10.1111/jfd.12015>

359 Emam, A.M., Haridy, M., Hossam Eldin Ahmed, N., 2022. Pathogenicity of newly emerged bacterial
360 pathogens, *Pseudomonas stutzeri* and *P. oleovorans*, in the Red Sea seabream *Diplodus noct.*
361 *Egypt. J. Aquat. Res.* 48, 169–174. <https://doi.org/10.1016/j.ejar.2022.02.001>

362 Forbes, J.D., Knox, N.C., Peterson, C.-L., Reimer, A.R., 2018. Highlighting Clinical Metagenomics for
363 Enhanced Diagnostic Decision-making: A Step Towards Wider Implementation. *Comput. Struct.*
364 *Biotechnol. J.* 16, 108–120. <https://doi.org/10.1016/j.csbj.2018.02.006>

365 Ghittino, C., Manuali, E., Latini, M., Agnetti, F., Rogato, F., Agonigi, R., Colussi, S., Prearo, M., 2004. Case
366 of systemic granulomatosis in meagre (*Argyrosomus regius*) and comparison with the
367 histological features present in gilthead seabream. *Ittiopatologia* 1, 59–67.

368 Girard, L., Lood, C., Höfte, M., Vandamme, P., Rokni-Zadeh, H., van Noort, V., Lavigne, R., De Mot, R.,
369 2021. The Ever-Expanding *Pseudomonas* Genus: Description of 43 New Species and Partition of
370 the *Pseudomonas putida* Group. *Microorganisms* 9, 1766.
371 <https://doi.org/10.3390/microorganisms9081766>

372 Handelsman, J., 2004. Metagenomics: Application of Genomics to Uncultured Microorganisms.
373 *Microbiol. Mol. Biol. Rev.* 68, 669–685. <https://doi.org/10.1128/MMBR.68.4.669-685.2004>

374 Herlemann, D.P., Labrenz, M., Jürgens, K., Bertilsson, S., Waniek, J.J., Andersson, A.F., 2011. Transitions
375 in bacterial communities along the 2000 km salinity gradient of the Baltic Sea. *ISME J.* 5, 1571–
376 1579. <https://doi.org/10.1038/ismej.2011.41>

377 Huang, J., Jiang, E., Yang, D., Wei, J., Zhao, M., Feng, J., Cao, J., 2020. Metagenomic Next-Generation
378 Sequencing versus Traditional Pathogen Detection in the Diagnosis of Peripheral Pulmonary
379 Infectious Lesions. *Infect. Drug Resist.* 13, 567–576. <https://doi.org/10.2147/IDR.S235182>

380 Iaria, C., Saoca, C., Guerrera, M.C., Ciulli, S., Brundo, M.V., Piccione, G., Lanteri, G., 2019. Occurrence of
381 diseases in fish used for experimental research. *Lab. Anim.* 53, 619–629.
382 <https://doi.org/10.1177/0023677219830441>

383 Jacobs, J.M., Stine, C.B., Baya, A.M., Kent, M.L., 2009. A review of mycobacteriosis in marine fish. *J. Fish*
384 *Dis.* 32, 119–130. <https://doi.org/10.1111/j.1365-2761.2008.01016.x>

385 Katharios, P., Kokkari, K., Papadaki, M., Papandroulakis, N., 2011. Systemic granulomas in cultured
386 meagre, *Argyrosomus regius*. Presented at the Aquaculture Europe 11, European Aquaculture
387 Society, Rhodes, Greece, pp. 537–538.

388 Klindworth, A., Pruesse, E., Schweer, T., Peplies, J., Quast, C., Horn, M., Glöckner, F.O., 2013. Evaluation
389 of general 16S ribosomal RNA gene PCR primers for classical and next-generation sequencing-
390 based diversity studies. *Nucleic Acids Res.* 41, e1. <https://doi.org/10.1093/nar/gks808>

391 Kotzamanis, Y., Kouroupakis, E., Iliia, V., Haralabous, J., Papaioannou, N., Papanna, K., Richards, R.,
392 Gisbert, E., 2018. Effects of high-level fishmeal replacement by plant proteins supplemented
393 with different levels of lysine on growth performance and incidence of systemic noninfectious
394 granulomatosis in meagre (*Argyrosomus regius*). *Aquac. Nutr.* 24, 1738–1751.
395 <https://doi.org/10.1111/anu.12814>

396 Krassowski, M., 2020. [krassowski/complex-upset](https://github.com/krassowski/complex-upset).

397 Lex, A., Gehlenborg, N., Strobel, H., Vuillemot, R., Pfister, H., 2014. UpSet: Visualization of Intersecting
398 Sets. *IEEE Trans. Vis. Comput. Graph.* 20, 1983–1992.
399 <https://doi.org/10.1109/TVCG.2014.2346248>

400 Lutalo, P.M.K., D’Cruz, D.P., 2014. Diagnosis and classification of granulomatosis with polyangiitis (aka
401 Wegener’s granulomatosis). *J. Autoimmun., Diagnostic Criteria in Autoimmune Diseases* 48–49,
402 94–98. <https://doi.org/10.1016/j.jaut.2014.01.028>

403 Manuali, E., Agnetti, F., Latini, M., Checcarelli, S., Ghittino, C., 2005. Outbreak of systemic mycosis in
404 intensively reared meagre (*Argyrosomus regius*). *Ittiopatologia* 2, 129–135.

405 Martínez-Lara, P., Martínez-Porchas, M., Gollas-Galván, T., Hernández-López, J., Robles-Porchas, G.R.,
406 2021. Granulomatosis in fish aquaculture: a mini review. *Rev. Aquac.* 13, 259–268.
407 <https://doi.org/10.1111/raq.12472>

408 McMurdie, P.J., Holmes, S., 2013. phyloseq: An R Package for Reproducible Interactive Analysis and
409 Graphics of Microbiome Census Data. PLOS ONE 8, e61217.
410 <https://doi.org/10.1371/journal.pone.0061217>

411 Miller, R.R., Montoya, V., Gardy, J.L., Patrick, D.M., Tang, P., 2013. Metagenomics for pathogen
412 detection in public health. Genome Med. 5, 81. <https://doi.org/10.1186/gm485>

413 Miyazaki, T., Kaige, N., 1985. Comparative histopathology of edwardsiellosis in fishes. Fish Pathol. 20,
414 219–227.

415 Mulcahy-O’Grady, H., Workentine, M.L., 2016. The Challenge and Potential of Metagenomics in the
416 Clinic. Front. Immunol. 7.

417 Nurul, A.N.A., Muhammad, D.-D., Okomoda, V.T., Nur, A.A.Bt., 2019. 16S rRNA-Based metagenomic
418 analysis of microbial communities associated with wild *Labroides dimidiatus* from Karah Island,
419 Terengganu, Malaysia. Biotechnol. Rep. 21, e00303. <https://doi.org/10.1016/j.btre.2019.e00303>

420 Ortega, C., García, I., Irgang, R., Fajardo, R., Tapia-Cammas, D., Acosta, J., Avendaño-Herrera, R., 2018.
421 First identification and characterization of *Streptococcus iniae* obtained from tilapia
422 (*Oreochromis aureus*) farmed in Mexico. J. Fish Dis. 41, 773–782.
423 <https://doi.org/10.1111/jfd.12775>

424 Pavludi, C., Kristoffersen, J.B., Oulas, A., Troch, M.D., Arvanitidis, C., 2017. Sediment microbial
425 taxonomic and functional diversity in a natural salinity gradient challenge Remane’s “species
426 minimum” concept. PeerJ 5, e3687. <https://doi.org/10.7717/peerj.3687>

427 Pavlov, M.S., Lira, F., Martinez, J.L., Olivares-Pacheco, J., Marshall, S.H.Y. 2020, 2020. *Pseudomonas*
428 *filidesensis* sp. nov., a psychrotolerant bacterium isolated from Antarctic soil of King George
429 Island, South Shetland Islands. Int. J. Syst. Evol. Microbiol. 70, 3255–3263.
430 <https://doi.org/10.1099/ijsem.0.004165>

431 Quast, C., Pruesse, E., Yilmaz, P., Gerken, J., Schweer, T., Yarza, P., Peplies, J., Glöckner, F.O., 2013. The
432 SILVA ribosomal RNA gene database project: improved data processing and web-based tools.
433 Nucleic Acids Res. 41, D590–D596. <https://doi.org/10.1093/nar/gks1219>

434 R Core Team, 2021. R: A language and environment for statistical computing.

435 Ramakrishnan, L., 2012. Revisiting the role of the granuloma in tuberculosis. Nat. Rev. Immunol. 12,
436 352–366. <https://doi.org/10.1038/nri3211>

437 Rognes, T., Flouri, T., Nichols, B., Quince, C., Mahé, F., 2016. VSEARCH: a versatile open source tool for
438 metagenomics. PeerJ 4, e2584. <https://doi.org/10.7717/peerj.2584>

439 Ruiz García, M.Á., Hernández-Cruz, C.M., Caballero, M.J., Fernández-Palacios, H., Saleh, R., Izquierdo, M.,
440 Betancor Quintana, M.B., 2019. Incidence of systemic granulomatosis is modulated by the
441 feeding sequence and type of enrichment in meagre (*Argyrosomus regius*) larvae. Aquac. Res.
442 50, 284–295. <https://doi.org/10.1111/are.13896>

443 Ruiz, M.A., Betancor, M.B., Robaina, L., Montero, D., Hernández-Cruz, C.M., Izquierdo, M.S., Rosenlund,
444 G., Fontanillas, R., Caballero, M.J., 2019. Dietary combination of vitamin E, C and K affects
445 growth, antioxidant activity, and the incidence of systemic granulomatosis in meagre
446 (*Argyrosomus regius*). Aquaculture 498, 606–620.
447 <https://doi.org/10.1016/j.aquaculture.2018.08.078>

448 Shah, K.K., Pritt, B.S., Alexander, M.P., 2017. Histopathologic review of granulomatous inflammation. J.
449 Clin. Tuberc. Mycobact. Dis. 7, 1–12. <https://doi.org/10.1016/j.jctube.2017.02.001>

450 Si, Y., Wen, J., Xu, Y., Roengjit, P., Wang, H., 2021. Rapid pathogen discovery in diseased turbot
451 (*Scophthalmus maximus*) using 16S rRNA high throughput sequencing. Aquac. Rep. 21, 100835.
452 <https://doi.org/10.1016/j.aqrep.2021.100835>

453 Sun, Y., Zhu, Z., Weng, S., He, J., Dong, C., 2020. Characterization of a highly lethal barramundi (*Lates*
454 *calcarifer*) model of *Pseudomonas plecoglossicida* infection. *Microb. Pathog.* 149, 104516.
455 <https://doi.org/10.1016/j.micpath.2020.104516>

456 Takhampunya, R., Korkusol, A., Pongpichit, C., Yodin, K., Rungroj, A., Chanarat, N., Promsathaporn, S.,
457 Monkanna, T., Thaloengsok, S., Tippayachai, B., Kumfao, N., Richards, A.L., Davidson, S.A., 2019.
458 Metagenomic Approach to Characterizing Disease Epidemiology in a Disease-Endemic
459 Environment in Northern Thailand. *Front. Microbiol.* 10.

460 Timur, G., Ürkü, Ç., Çanak, Ö., G. Genç, E., Erturan, Z., 2015. Systemic Mycobacteriosis Caused by
461 *Mycobacterium marinum* in Farmed Meagre (*Argyrosomus regius*), in Turkey.

462 Tsertou, M.I., Chatzifotis, S., Fontanillas, R., Cotou, E., Fountoulaki, E., Antonopoulou, E., Katharios, P.,
463 2020. The effect of dietary vitamin D3, minerals (Ca, P) and plant-protein sources in the
464 development of systemic granulomatosis in meagre (*Argyrosomus regius*, Asso, 1801).
465 *Aquaculture* 521, 735052. <https://doi.org/10.1016/j.aquaculture.2020.735052>

466 Tsertou, M.I., Smyrli, M., Kokkari, C., Antonopoulou, E., Katharios, P., 2018. The aetiology of systemic
467 granulomatosis in meagre (*Argyrosomus regius*): The “Nocardia” hypothesis. *Aquac. Rep.* 12, 5–
468 11. <https://doi.org/10.1016/j.aqrep.2018.08.002>

469 Tyagi, A., Singh, B., Billekallu Thammegowda, N.K., Singh, N.K., 2019. Shotgun metagenomics offers
470 novel insights into taxonomic compositions, metabolic pathways and antibiotic resistance genes
471 in fish gut microbiome. *Arch. Microbiol.* 201, 295–303. [https://doi.org/10.1007/s00203-018-](https://doi.org/10.1007/s00203-018-1615-y)
472 [1615-y](https://doi.org/10.1007/s00203-018-1615-y)

473 Urku, C., 2021. Isolation and characterization of *Pseudomonas putida* caused granulomas in cultured sea
474 bass (*Dicentrarchus labrax*) in Turkey. *J. Hell. Vet. Med. Soc.* 72, 2661–2668.
475 <https://doi.org/10.12681/jhvms.26748>

476 Wang, W.-L., Xu, S.-Y., Ren, Z.-G., Tao, L., Jiang, J.-W., Zheng, S.-S., 2015. Application of metagenomics in
477 the human gut microbiome. *World J. Gastroenterol.* WJG 21, 803–814.
478 <https://doi.org/10.3748/wjg.v21.i3.803>

479 Wickham, H., 2016. *ggplot2: Elegant Graphics for Data Analysis*.

480 Xing, M., Hou, Z., Yuan, J., Liu, Y., Qu, Y., Liu, B., 2013. Taxonomic and functional metagenomic profiling
481 of gastrointestinal tract microbiome of the farmed adult turbot (*Scophthalmus maximus*). *FEMS*
482 *Microbiol. Ecol.* 86, 432–443. <https://doi.org/10.1111/1574-6941.12174>

483 Yukgehnaish, K., Kumar, P., Sivachandran, P., Marimuthu, K., Arshad, A., Paray, B.A., Arockiaraj, J., 2020.
484 Gut microbiota metagenomics in aquaculture: factors influencing gut microbiome and its
485 physiological role in fish. *Rev. Aquac.* 12, 1903–1927. <https://doi.org/10.1111/raq.12416>

486 Zafeiropoulos, H., Gioti, A., Ninidakis, S., Potirakis, A., Paragkamian, S., Angelova, N., Antoniou, A., Danis,
487 T., Kaitetzidou, E., Kasapidis, P., Kristoffersen, J.B., Papadogiannis, V., Pavludi, C., Ha, Q.V.,
488 Lagnel, J., Pattakos, N., Perantinos, G., Sidirokastritis, D., Vavilis, P., Kotoulas, G., Manousaki, T.,
489 Sarropoulou, E., Tsigenopoulos, C.S., Arvanitidis, C., Magoulas, A., Pafilis, E., 2021. 0s and 1s in
490 marine molecular research: a regional HPC perspective. *GigaScience* 10, giab053.
491 <https://doi.org/10.1093/gigascience/giab053>

492 Zafeiropoulos, H., Viet, H.Q., Vasileiadou, K., Potirakis, A., Arvanitidis, C., Topalis, P., Pavludi, C., Pafilis,
493 E., 2020. PEMA: a flexible Pipeline for Environmental DNA Metabarcoding Analysis of the
494 16S/18S ribosomal RNA, ITS, and COI marker genes. *GigaScience* 9, giaa022.
495 <https://doi.org/10.1093/gigascience/giaa022>

496

FIGURE LEGENDS

Figure 1: Bar chart showing the relative abundances of the main microbial taxa, at the phylum level, at each sample.

Figure 2: Bar chart based on the presence/absence of the main microbial taxa, at the phylum level, at each sample.

Figure 3: nMDS of the similarity matrix of the samples based on the relative abundances of the microbial OTUs.

Figure 4: nMDS of the similarity matrix of the samples based on the presence/absence of the microbial OTUs.

Figure 5: Upset plot showing the number of shared and unique OTUs in the three groups.

Figure 6: The LDA scores of the enriched OTUs in each of the three health conditions.

Figure 7: Heatmap of the abundance of the LefSe identified OTUs in the three groups.

Supplementary Figure 1: The abundance of the OTUs that were identified by the LefSe, in the three health groups.

Supplementary Figure 2: The abundance of the OTUs that were identified by the LefSe, in the two health groups (healthy, sick).

Supplementary Figure 3: The LDA scores of the enriched OTUs in each of the two health conditions (healthy, sick).

Supplementary Figure 4: Heatmap of the abundance of the LefSe identified OTUs in the two groups (healthy, sick).

Figure 1

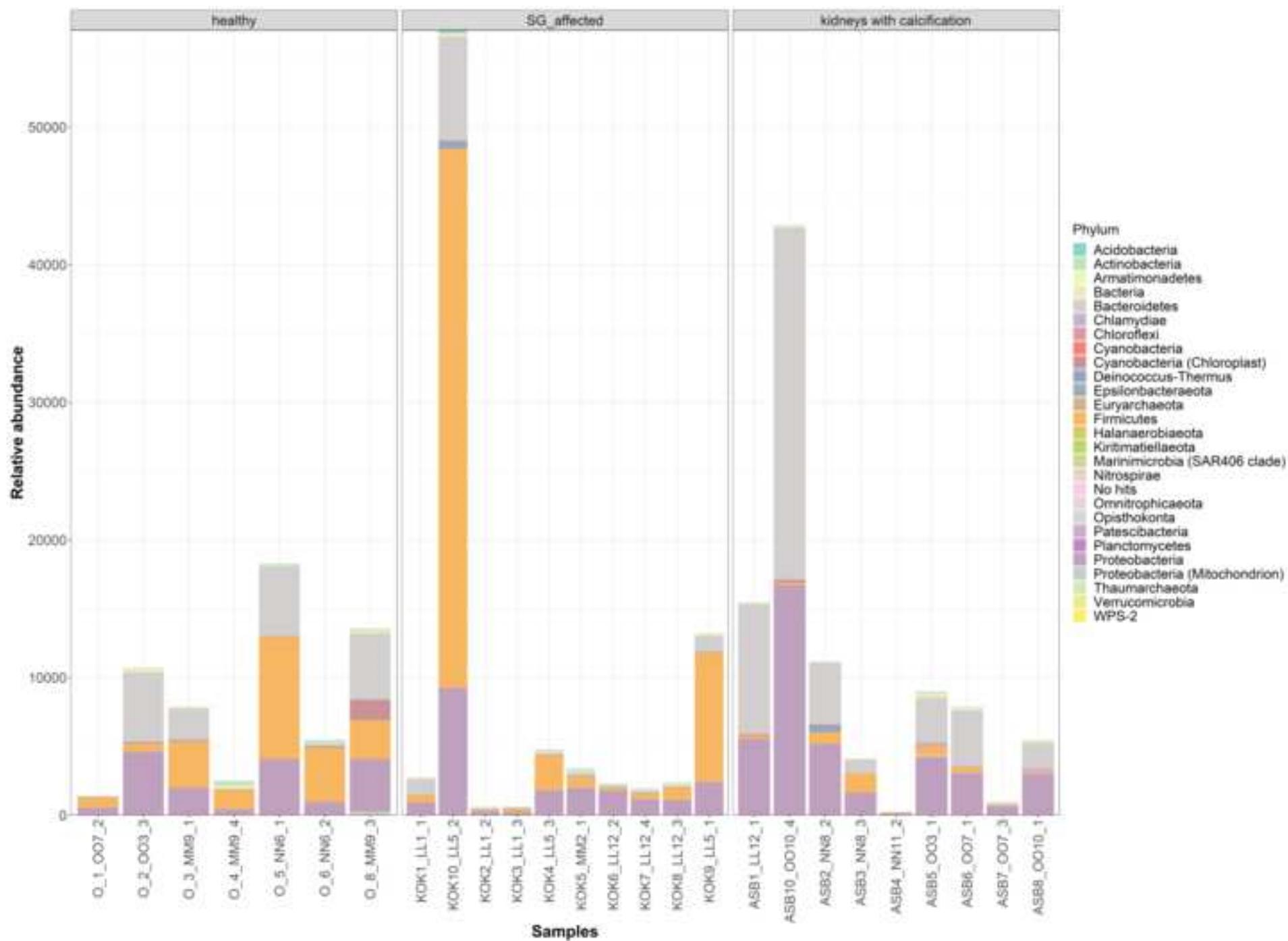
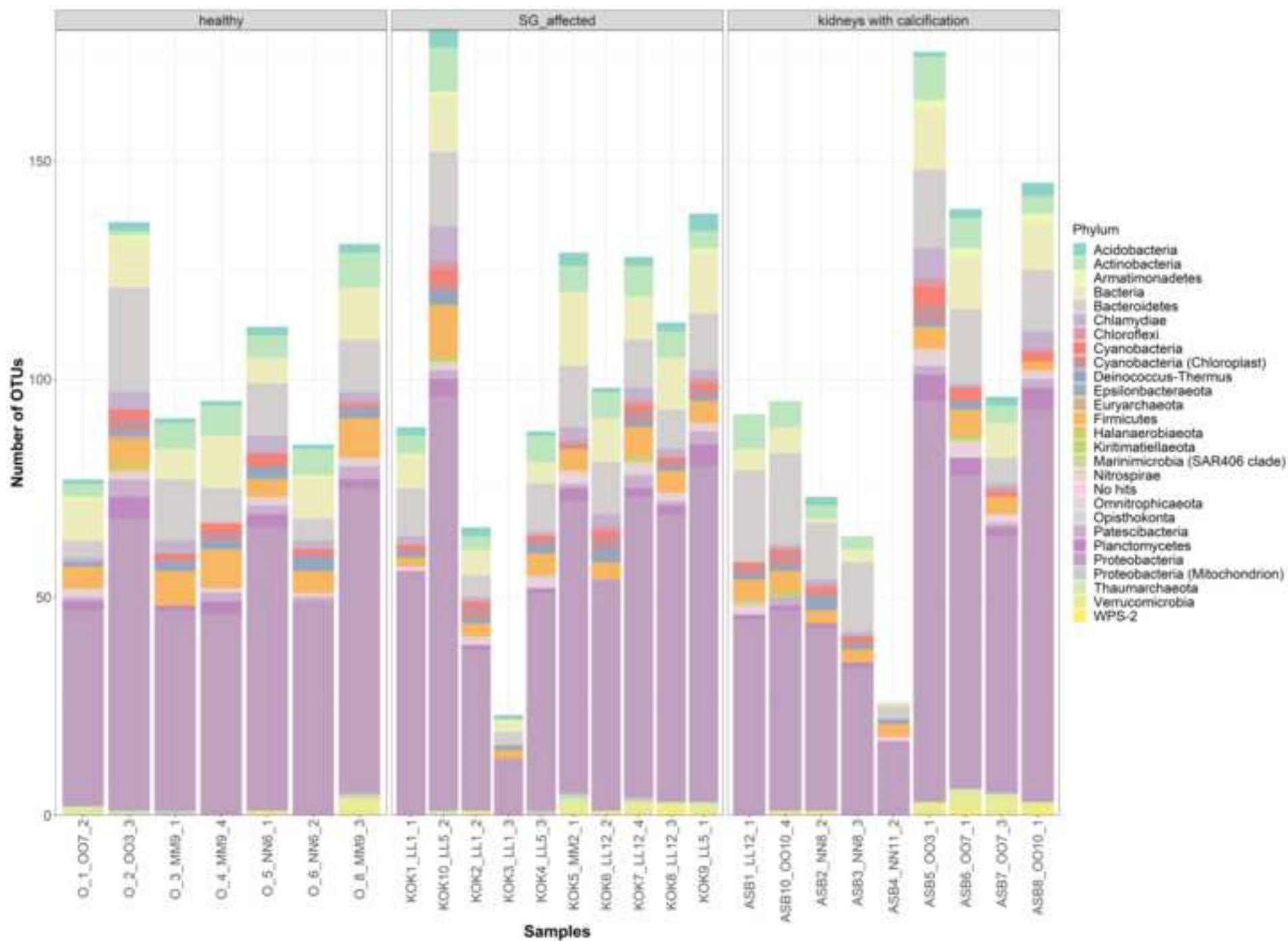
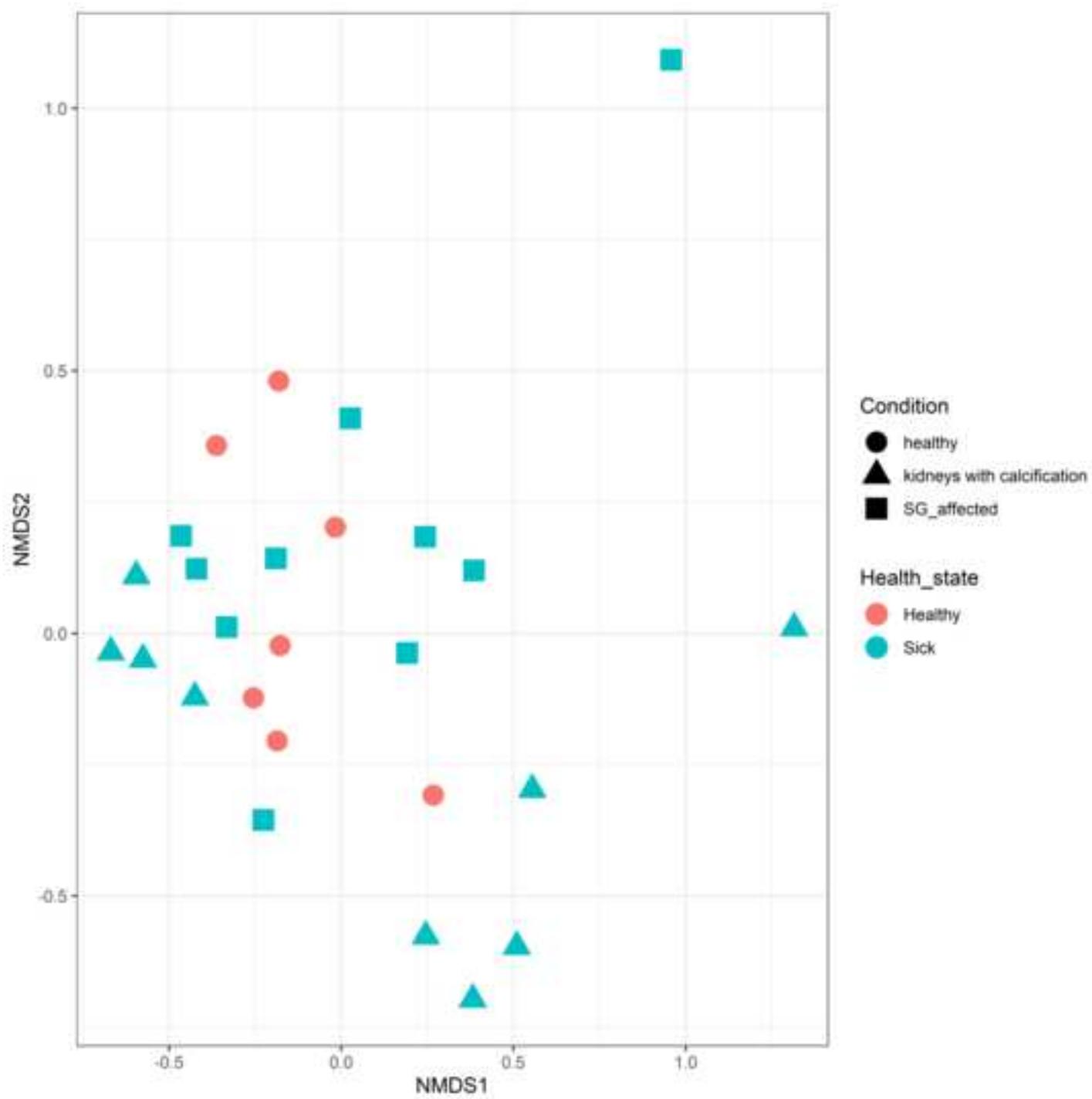
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Figure 2

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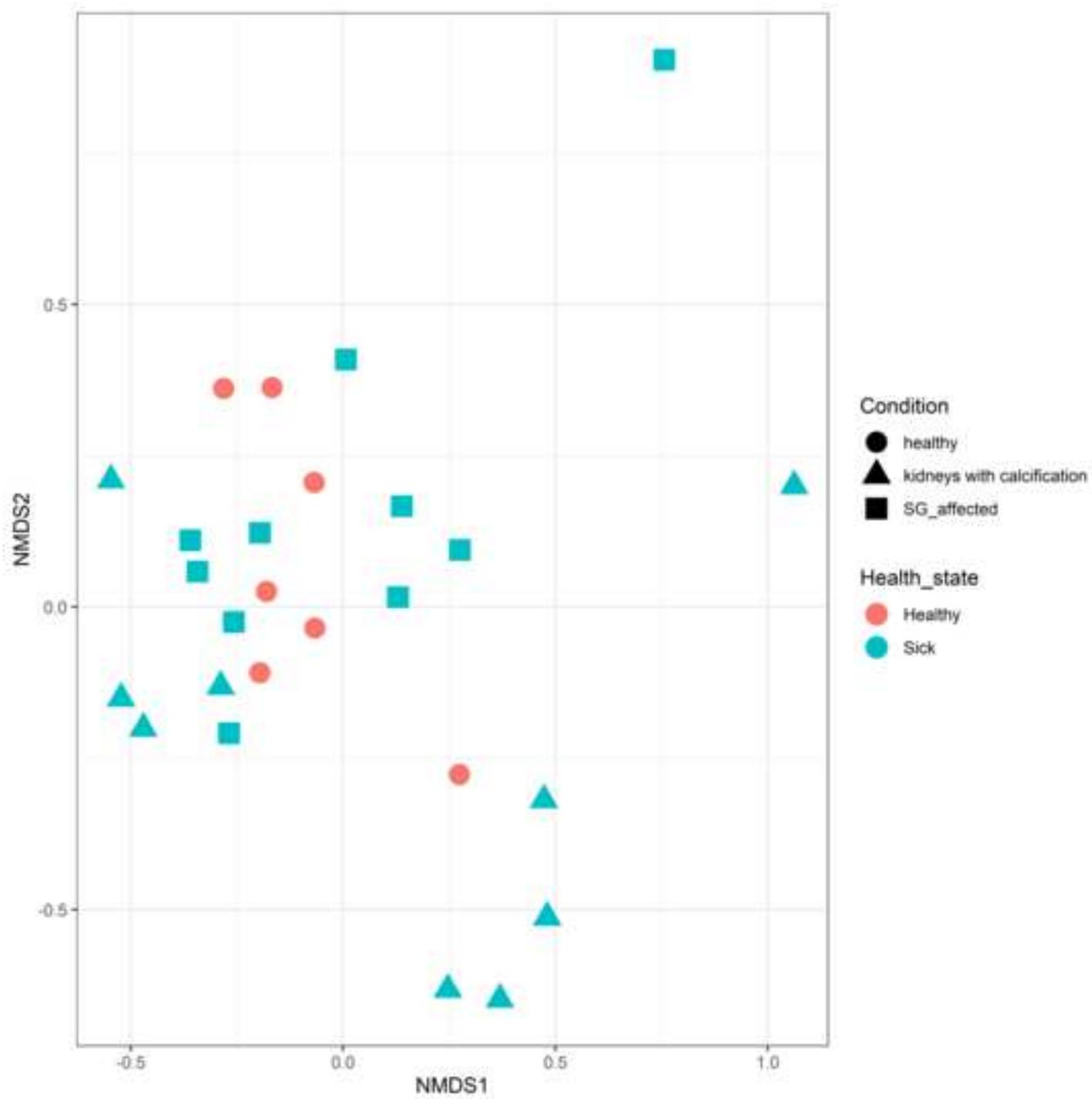
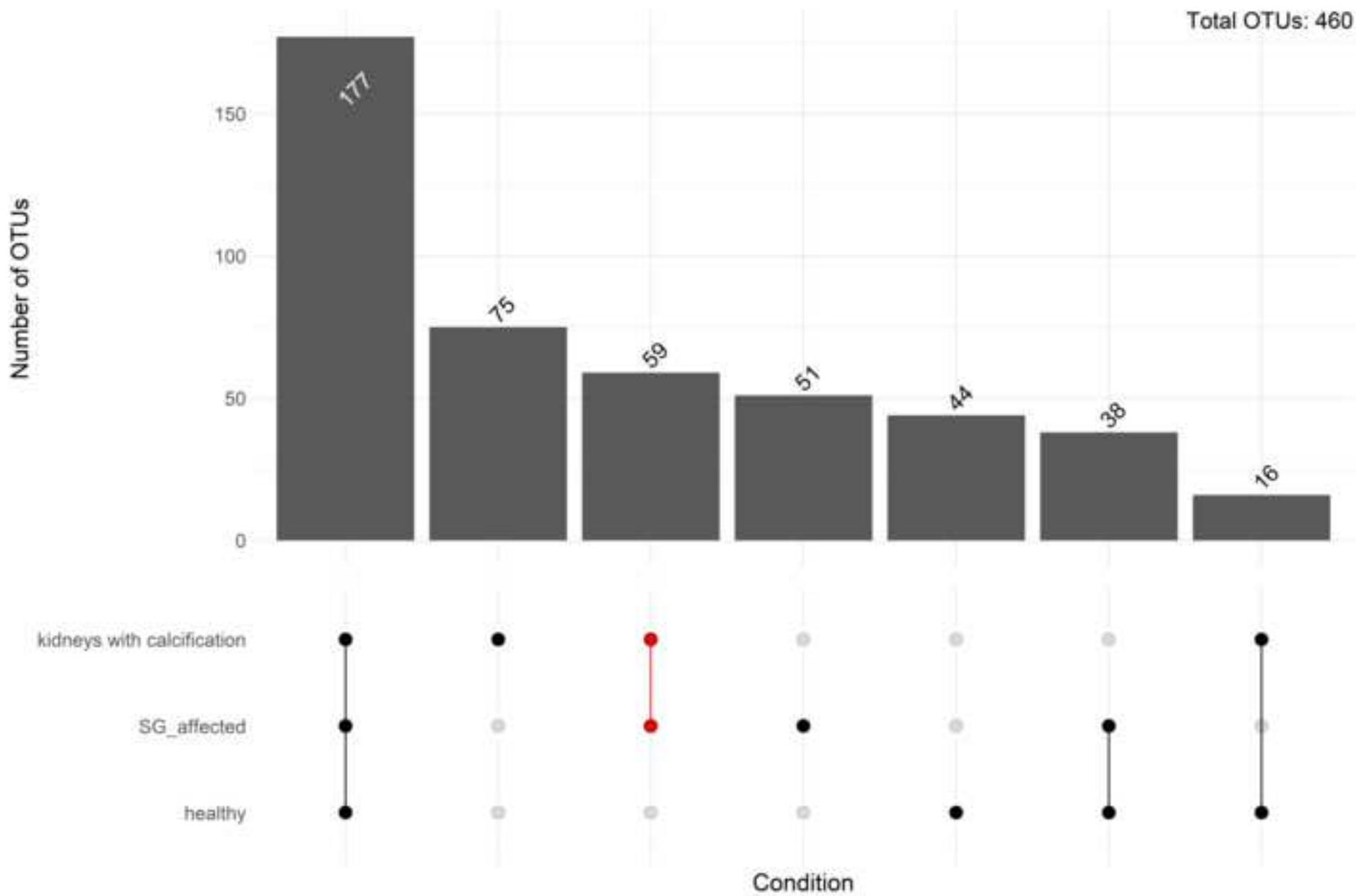


Figure 5



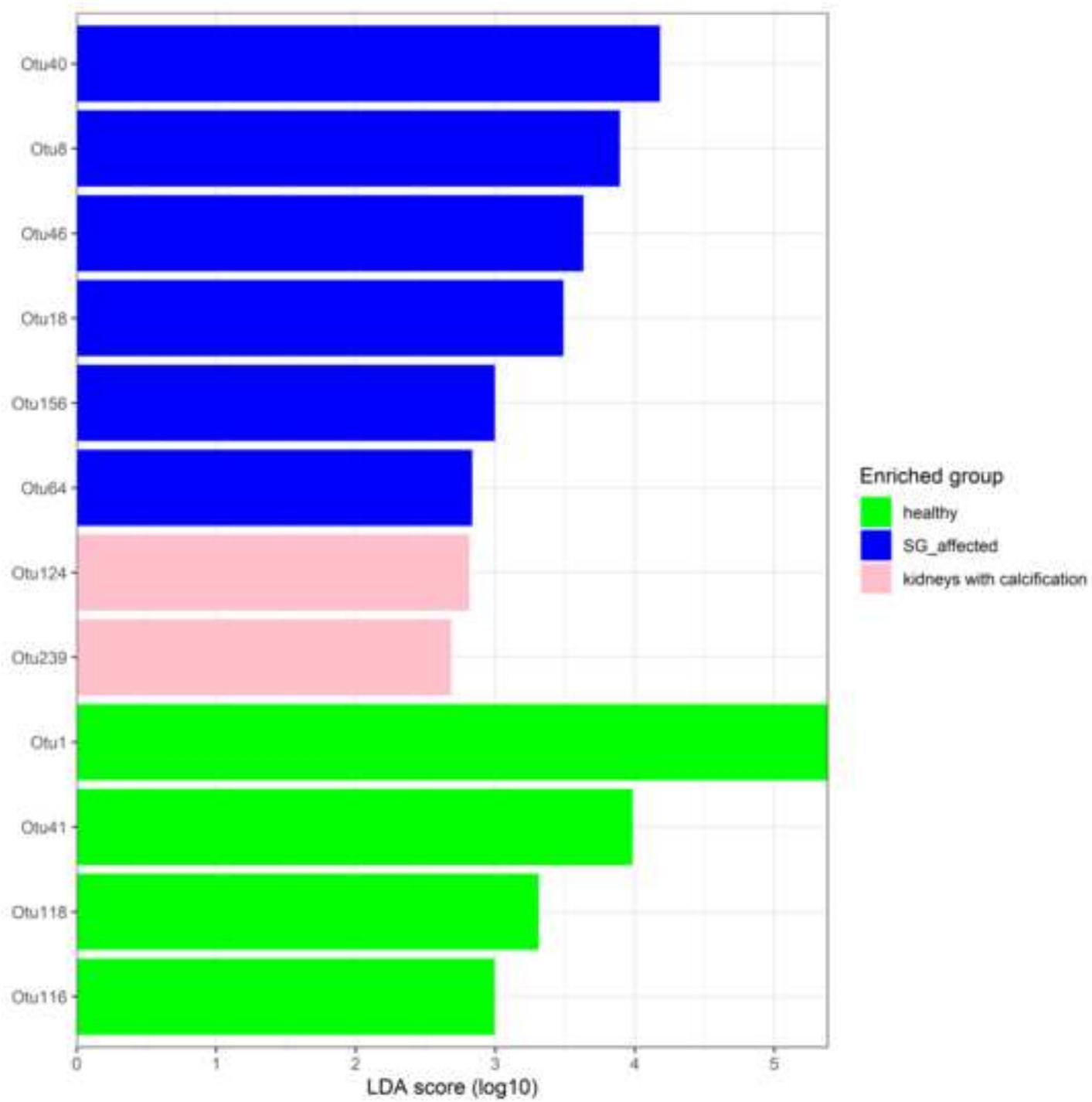


Figure 7

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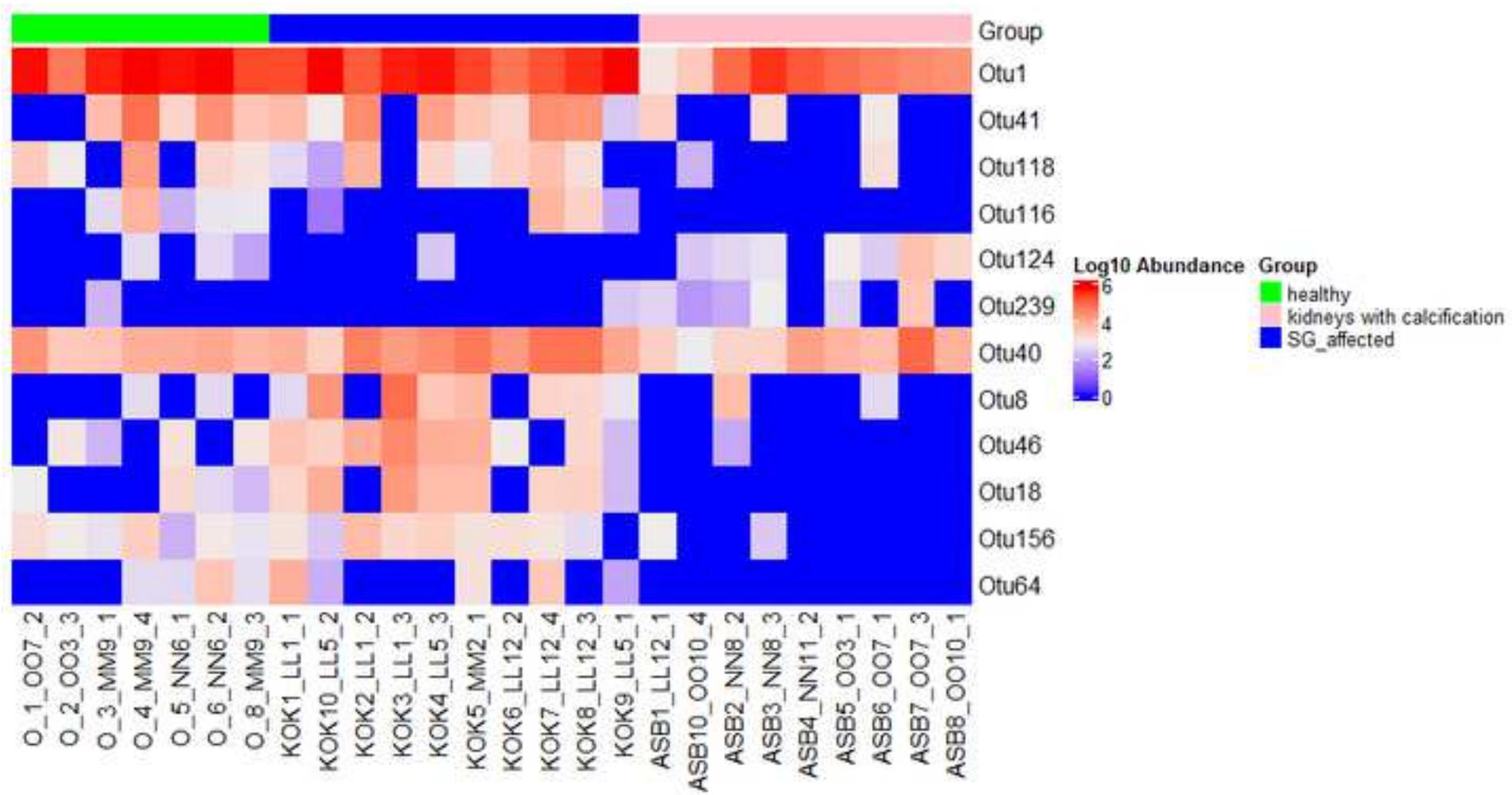


Table 1

Table 1: Common OTUs between different health states.			
kidneys with calcification & SG_affected		healthy & kidneys with calcification	
Otu 77	Main genome;Bacteria;Kiritimatiellaeota;Kiritimatiellales;Kiritimatiellaceae;R76-B128	Otu 56	Main genome;Bacteria;Firmicutes;Bacilli;Lactobacillales;Streptococaceae;Streptococcus
Otu 84	Main genome;Bacteria;Chlamydiae;Chlamydiae (kingdom);Chlamydiales;Simkaniaceae;Ga0074140	Otu 138	Main genome;Bacteria;Omnitrophicaeota
Otu 88	Main genome;Bacteria;Bacteroidetes;Bacteroidia;Flavobacteriales;Weeksellaceae	Otu 238	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Pasteurellales;Pasteurellaceae;Actinobacillus
Otu 98	Main genome;Bacteria;Verrucomicrobia;Verrucomicrobiae;Methylocidiphilales;Methylacidiphilaceae	Otu 266	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Oceanospirillales;Litoricolaceae;Litoricola
Otu 99	Main genome;Bacteria;Verrucomicrobia;Verrucomicrobiae;Pedosphaerales;Pedosphaeraceae	Otu 288	Chloroplast;Bacteria (Chloroplast);Cyanobacteria (Chloroplast);Oxyphotobacteria (Chloroplast)
Otu 105	Main genome;Bacteria;Bacteroidetes;Bacteroidia	Otu 291	Main genome;Bacteria;Firmicutes;Clostridia;Clostridiales;Family XI;Finegoldia
Otu 132	Main genome;Bacteria;Chloroflexi;OLB14	Otu 320	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Diplorickettsiales;Diplorickettsiaceae
Otu 135	Main genome;Bacteria;Acidobacteria;Blastocatellia (Subgroup 4);Blastocatellales;Blastocatellaceae	Otu 322	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhizobiales;Devosiaceae;Devosia
Otu 141	Main genome;Bacteria;Chlamydiae;Chlamydiae (kingdom);Chlamydiales;Simkaniaceae	Otu 335	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Sphingomonadales;Sphingomonadaceae;Sphingomonas
Otu 147	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria	Otu 344	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Puniceispirillales;SAR116 clade
Otu 149	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;SAR11 clade	Otu 363	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhizobiales;Hyphomicrobiaceae;Hyphomicrobium

Otu 180	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Rhodocyclaceae	Otu 369	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Legionellales;Legionellaceae;Legionella
Otu 193	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae	Otu 454	Main genome;Bacteria;Bacteroidetes;Bacteroidia
Otu 198	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Gallionellaceae	Otu 458	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Caulobacteriales;Hyphomonadaceae;SWB02
Otu 199	Main genome;Bacteria;Actinobacteria;Actinobacteria (kingdom);Bifidobacteriales;Bifidobacteriaceae;Gardnerella	Otu 460	Main genome;Bacteria;Actinobacteria;Actinobacteria (kingdom);PeM15
Otu 203	No hits	Otu 461	Main genome;Bacteria;Planctomycetes;Planctomycetacia;Planctomycetales
Otu 206	Main genome;Bacteria		
Otu 218	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;TRA3-20		
Otu 224	Main genome;Bacteria;Bacteroidetes;Bacteroidia;Bacteroidales;Porphyromonadaceae;Porphyromonas		
Otu 229	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Gallionellaceae		
Otu 232	Main genome;Bacteria;Bacteroidetes;Bacteroidia;Bacteroidales;Prevotellaceae;Alloprevotella		
Otu 233	Main genome;Bacteria;WPS-2		
Otu 235	Main genome;Bacteria;Firmicutes;Bacilli;Lactobacillales;Lactobacillaceae;Lactobacillus		

Otu 253	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae		
Otu 255	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Reyranellales;Reyraneliaceae;Reyranela		
Otu 347	Main genome;Bacteria;Chlamydiae;Chlamydiae (kingdom);Chlamydiales;Simkaniaceae;Ga0074140		
Otu 348	Main genome;Bacteria		
Otu 352	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Sphingomonadales;Sphingomonadaceae		
Otu 354	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Rhodocyclaceae		
Otu 359	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Rhodocyclaceae;Sulfuritalea		
Otu 360	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhizobiales;Beijerinckiaceae		
Otu 362	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Gallionellaceae		
Otu 366	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Pasteurellales;Pasteurellaceae;Haemophilus		
Otu 378	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Sphingomonadales;Sphingomonadaceae		
Otu 380	Main genome;Bacteria		

Otu 388	Main genome;Bacteria;Acidobacteria;Subgroup 6		
Otu 402	No hits		
Otu 405	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae;Alcaligenes		
Otu 406	Main genome;Bacteria;Proteobacteria;Deltaproteobacteria;Oligoflexales;0319-6G20		
Otu 407	Main genome;Bacteria		
Otu 410	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Methylophilaceae;OM43 clade		
Otu 411	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Alteromonadales;Alteromonadaceae;Glaciecola		
Otu 412	Main genome;Bacteria;Armatimonadetes;Fimbriimonadia;Fimbriimonadales;Fimbriimonadaceae		
Otu 413	Main genome;Bacteria;Chloroflexi;P2-11E		
Otu 417	Main genome;Bacteria;Firmicutes;Bacilli;Lactobacillales;Lactobacillaceae;Lactobacillus		
Otu 422	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Gallionellaceae		
Otu 424	Chloroplast;Bacteria (Chloroplast);Cyanobacteria (Chloroplast);Oxyphotobacteria (Chloroplast)		
Otu 429	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Azospirillales;Inquilinaceae;Inquilinus		

Otu 435	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Diplorickettsiales;Diplorickettsiaceae;Aquicella		
Otu 437	Main genome;Bacteria;Bacteroidetes;Bacteroidia		
Otu 439	Main genome;Bacteria;Acidobacteria;Subgroup 17		
Otu 441	Main genome;Bacteria;Bacteroidetes;Rhodothermia;Balneolales;Balneolaceae;Balneola		
Otu 443	Main genome;Bacteria;Chlamydiae;Chlamydiae (kingdom);Chlamydiales;Simkaniaceae		
Otu 445	Main genome;Bacteria;Planctomycetes;Planctomycetacia;Gemmatales;Gemmataceae;Fimbrioglobus		
Otu 447	Main genome;Bacteria;Omnitrophicaeota;Omnitrophia;Omnitrophales;Omnitrophaceae;Candidatus Omnitrophus		
Otu 448	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Salinisphaerales;Solimonadaceae;Nevskia		
Otu 449	Main genome;Bacteria;Acidobacteria;Subgroup 6		
Otu 450	Main genome;Bacteria;Verrucomicrobia;Verrucomicrobiae;Pedosphaerales;Pedosphaeraceae		
Otu 451	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae		

Table 2: The OTUs that were enriched in each of the groups as identified by the LefSe. *:<0.05, **:<0.01, ***:<0.001

OTU	Taxonomy	Enriched Group	LDA	adjusted p value
Otu1	Main genome;Bacteria;Firmicutes;Bacilli;Bacillales;Bacillaceae;Anoxybacillus	healthy	5.38	**
Otu41	Main genome;Bacteria;Actinobacteria;Actinobacteria (kingdom);Micrococcales;Micrococcaceae;Micrococcus	healthy	3.98	*
Otu118	Main genome;Bacteria;Actinobacteria;Actinobacteria (kingdom);Micrococcales;Dermacoccaceae;Dermacoccus	healthy	3.31	*
Otu116	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhodobacterales;Rhodobacteraceae;Paracoccus	healthy	3.00	*
Otu40	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae	SG_affected	4.18	*
Otu8	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhizobiales;Beijerinckiaceae	SG_affected	3.89	**
Otu46	Main genome;Bacteria;Acidobacteria;Blastocatellia (Subgroup 4);Pyrinomonadales;Pyrinomonadaceae;Pyrinomonas	SG_affected	3.63	***
Otu18	Main genome;Bacteria;Bacteroidetes;Bacteroidia;Sphingobacteriales;env.OPS 17	SG_affected	3.49	**
Otu156	Main genome;Bacteria	SG_affected	3.00	**
Otu64	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhodobacterales;Rhodobacteraceae;Paracoccus	SG_affected	2.84	*
Otu124	Main genome;Bacteria;Actinobacteria;Acidimicrobiia;Actinomarinales;Actinomarinaceae;Candidatus Actinomarina	kidneys with calcification	2.81	**
Otu239	Main genome;Bacteria;Bacteroidetes;Bacteroidia;Flavobacteriales;Flavobacteriaceae;NS5 marine group	kidneys with calcification	2.68	*
Otu16	Main genome;Bacteria;Deinococcus-Thermus;Deinococci;Thermales;Thermaceae;Meiothermus	Healthy	3.43	*
Otu75	Main genome;Bacteria;Firmicutes;Bacilli;Bacillales;Family XII	Healthy	2.93	*
Otu116	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhodobacterales;Rhodobacteraceae;Paracoccus	Healthy	2.90	*
Otu56	Main genome;Bacteria;Firmicutes;Bacilli;Lactobacillales;Streptococcaceae;Streptococcus	Healthy	2.46	*
Otu457	Main genome;Bacteria;Verrucomicrobia;Verrucomicrobiae;Opitutales;Puniceicoccaceae;Coralimargarita	Healthy	2.23	*
Otu316	Main genome;Bacteria;Firmicutes;Bacilli;Bacillales;Bacillaceae;Bacillus	Healthy	2.10	*
Otu130	Main genome;Bacteria;Proteobacteria;Alphaproteobacteria;Rhodobacterales;Rhodobacteraceae	Sick	3.22	*
Otu185	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Burkholderiaceae	Sick	2.93	*
Otu229	Main genome;Bacteria;Proteobacteria;Gammaproteobacteria;Betaproteobacteriales;Gallionellaceae	Sick	2.79	*

Table 3. Total reads and prevalence (%) of detected phyla per health state of the kidneys.

	Health state of kidneys					
	Healthy		With granulomas		With calcification	
	No of reads	%	No of reads	%	No of reads	%
Bacteroidetes	29,095	50.1	27,502	39.4	60,069	63.3
Proteobacteria	17,649	30.4	21,565	30.9	30,307	31.9
Firmicutes	7,768	13.4	18,300	26.2	1,612	1.7
Cyanobacteria	1,671	2.9	402	0.6	630	0.7
Acidobacteria	28	0.0	96	0.1	89	0.1
Actinobacteria	1,347	2.3	1,072	1.5	824	0.9
Armatimonadetes	5	0.0	8	0.0	30	0.0
Balneolaeota	2	0.0	6	0.0	15	0.0
Chlamydiae	178	0.3	292	0.4	507	0.5
Chloroflexi	11	0.0	12	0.0	32	0.0
Deinococcus-Thermus	174	0.3	415	0.6	444	0.5
Dictyoglomi	0	0.0	7	0.0	9	0.0
Elusimicrobia	0	0.0	0	0.0	2	0.0
Fibrobacteres	0	0.0	0	0.0	1	0.0
Fusobacteria	4	0.0	13	0.0	5	0.0
Gemmatimonadetes	0	0.0	2	0.0	1	0.0
Ignavibacteriae	2	0.0	0	0.0	0	0.0
Kiritimatiellaeota	0	0.0	8	0.0	18	0.0
Lentisphaerae	1	0.0	0	0.0	0	0.0
Nitrospirae	11	0.0	18	0.0	44	0.0
Planctomycetes	47	0.1	56	0.1	147	0.2
Rhodothermaeota	8	0.0	0	0.0	10	0.0
Spirochaetes	2	0.0	3	0.0	4	0.0
Tenericutes	0	0.0	0	0.0	5	0.0
Verrucomicrobia	24	0.0	42	0.1	66	0.1
Total reads	58,027	100.0	69,819	100.0	94,871	100.0

Table 4. Taxa with the most reads per health state of the kidneys

	Health state of kidneys		
	Healthy	With granulomas	With calcification
	No of reads	No of reads	No of reads
<i>Myroides ceti</i>	21,567	19,950	45,340
<i>Anoxybacillus flavithermus subsp. yunnanensis</i>	6,223	17,565	1,100
<i>Pedobacter nutrimenti</i>	5,943	5,023	11,391
<i>Pseudomonas fildesensis</i>	4,159	3,973	40
<i>Brevundimonas albigilva</i>	3,519	3,747	7,102
<i>Pseudomonas migulae</i>	2,125	14	4,200
<i>Achromobacter kerstersii</i>	875	789	1,266
<i>Candidatus pelagibacter</i>	813	1,089	1,721
<i>Stenotrophomonas pavanii</i>	576	502	1,243
<i>Brucella abortus</i>	306	375	673
<i>Vulcaniibacterium thermophilum</i>	282	846	487
<i>Sphingomonas kyeongiensis</i>	206	158	169
<i>Acinetobacter junii</i>	143	118	422
<i>Pseudomonas lini</i>	2	2,081	2
<i>Pseudomonas veronii</i>	0	0	4,915

Cutoff value for species identification: 97%

Declaration of interests

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

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

CRedit author statement

Christina Pavloudi: Methodology, Formal analysis, Visualization, Writing - Original Draft, Writing - Review & Editing

Maria Ioanna Tsertou: Formal analysis, Conceptualization, Writing - Original Draft, Writing - Review & Editing

Efthimia Antonopoulou: Writing - Review & Editing

Pantelis Katharios: Conceptualization, Resources, Supervision, Funding acquisition, Writing - Original Draft, Writing - Review & Editing



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