1	Dual RNAseq highlights the kinetics of skin microbiome and fish host responsiveness to
2	bacterial infection
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#### 22 Abstract (350 words)

### a) Background

24 Tenacibaculum maritimum is a worldwide-distributed fish pathogen known for causing 25 dramatic damages on a broad range of wild and farmed marine fish populations. Recently sequenced genome of T. maritimum strain NCIMB  $2154^{T}$  provided unprecedented 26 27 information on the possible molecular mechanisms involved in virulence for this species. 28 However, little is known on the dynamic on the infection *in vivo*, and information are lacking 29 on both the intrinsic host response (gene expression) and its associated microbiome 30 community. Here, we applied complementary omic approaches, including dual RNAseq and 31 16S rRNA gene metabarcoding sequencing using Nanopore and short-reads Illumina 32 technologies to unravel the host-pathogens interplay in experimental infection system using 33 the tropical fish *Platax orbicularis* as model.

#### 34 b) Results

35 We show that T. maritimum transcriptomic landscape during infection is characterized by an 36 enhancement of antibiotic catalytic and glucan catalytic functions while decreasing specific 37 sulphate assimilation process, compared to *in vitro* cultures. Simultaneously, fish host display 38 a large palette of immune effectors, notably involving innate response and triggering acute 39 inflammatory response. In addition, results suggest that fish activate adaptive immune 40 response visible through stimulation of T-helper cells, Th17, with congruent reduction of Th2 41 and T-regulatory cells. Fish were however largely sensitive to infection, and less than 25% of 42 them survived after 96hpi. These surviving fish showed no evidence of stress (cortisol levels) 43 as well as no significant difference in microbiome diversity compared to control at the same 44 sampling time. The presence of Tenacibaculum in resistant fish skin and the total absence of 45 any skin lesion suggest that these fish did not escape contact with the pathogen but rather prevent the pathogen entry. In these individuals we detected the up-regulation of specific 46

47 immune-related genes differentiating resistant from control at 96hpi, which suggests a
48 possible genomic basis of resistance while no genetic variations in coding regions was
49 reported.

## 50 c) Conclusion

51 Here we refine the interplay between common fish pathogens and host immune response 52 during experimental infection. We further highlight key actors of defense response, 53 pathogenicity and possible genomic bases of resistance to *T. maritimum*.

54

## 56 Background

57 Pathogens remain a significant threat to biodiversity, livestock farming and human health [1]. 58 Host-pathogen interactions rely on a complex balance between host defenses and pathogen 59 virulence. Through constant selective pressure, pathogens evolve mechanisms in order to 60 overcome the host immune system, likewise the host adapt to counteract and limit pathogen 61 virulence. Although changes in gene expression as a result of host-pathogen interactions 62 appear to be common [2-4], the mechanisms involved often remain poorly understood. A 63 more in-depth understanding of host-pathogen interactions has the potential to improve our 64 mechanistic understanding of pathogenicity and virulence, thereby defining novel preventive, 65 therapeutic and vaccine targets [5].

66 Dual RNAseq sequencing strategy fills the need of simultaneously assess the host and the 67 pathogens genes expression [6-8]. Studies applying these approaches in fish bacterial infection systems have bloomed recently and show promising in deciphering the complexity 68 69 of host-pathogen interplay [9–11] yet, these studies did not simultaneously explore dysbiosis 70 and associated changes of microbiome communities. In nature, co-occurrence of multiple 71 pathogen species (co-infection) is frequent. Species interactions might be neutral, antagonistic 72 or facilitative and most often shape strain virulence plasticity resulting in increased disease virulence [12–14]. Despite its commonness, remarkably few studies have explored such 73 74 models, *i.e.* when host interact simultaneously with multiple pathogens co-infection [15]. 75 During tenacibaculosis outbreak in platax, T. maritimum burden is also commonly associated 76 with other pathogen co-occurrences, namely Vibrio spp [16]. Nevertheless, such approach is 77 dramatically impaired by the unbalanced representation of each compartment sequences, most 78 often favouring the host compartment [8,17]. This bias can be minimized by specific library 79 preparation (*i.e.* mRNA depletion), *in silico* normalization procedures, and/or by investigating 80 models where pathogens burden is high.

81

82 Tenacibaculum maritimum is a worldwide-distributed fish pathogen, known for its lethal consequences on a broad range of wild and farmed marine fish populations. Major efforts 83 have been undertaken to lessen the effect of the pathogen and/or increase fish immune 84 85 resistance [18], yet the mechanisms of the infection and the response of fish remain largely 86 unknown which significantly hold back development of aquaculture sectors. Nevertheless, recent sequencing of *T. maritimum* strain NCIMB 2154<sup>T</sup> genome provided unprecedented 87 88 information on the putative molecular mechanisms involved in virulence [19]. Authors note 89 for instance that T. maritimum display a large array of evolutionary conserved stress 90 resistance related effectors as well as expanded capacity of iron mobilisation [19].

91 Tenacibaculum maritimum adheres and rapidly colonizes mucosal surfaces [16,20]. Infected 92 fish show multiplication of T. maritimum on their external tissues leading to severe skin 93 lesions and following fish rapid death [16]. Therefore, as for other infection systems, the 94 mucosal surfaces, here mainly skin mucus, is considered as the first barrier against pathogens 95 [21]. This physical and chemical barrier constituted by mucus also includes the presence of 96 host immune effectors (innate and adaptive) that orchestrate a complex interaction network 97 between with the commensal bacterial community [22,23]. The identification of these multi-98 specific interactions within the mucus brings to the fore the microbiome as the cornerstone of 99 host-pathogen interactions [21,24]. Indeed, dysbiosis (i.e., the imbalance or alteration of the 100 microbial ecosystem leading to a diseased status) is directly involved in the severity of a 101 disease [25-27]. Recent studies on zebrafish (Danio rerio) raised in axenic conditions or in 102 the presence of probiotic bacteria underlined the crucial role of the microbiota on the 103 development of the immune system, mucosal homeostasis and resistance to stress and 104 pathogens ([28], for review see [29]).

105 In French Polynesia, recurrent tenacibaculosis infections have been the major obstacle to local 106 fish production sustainability. Indeed, T. maritimum affects the only locally farmed fish, the 107 Orbicular batfish (Platax orbicularis) leading to very high mortality rates shortly after 108 transferring hatchery fingerlings to off-shore marine cages. Here we combined dual RNAseq 109 and 16S rRNA metabarcoding sequencing approaches to investigate the molecular responses 110 of the host and the microbiome communities (genes expression and microbiome composition) 111 simultaneously during the infection and the recovery phases to T. maritimum using the 112 orbicular batfish as a model. We also integrated comparison to *in vitro* liquid cultures of T. maritimum to refine our knowledge of virulence-related genes and explored genomic and 113 114 genetic bases of resistance in *P. orbicularis*.

### 115 Methods

#### 116 a) Animal husbandry

117 Platax fingerlings used in the bacterial challenge were 58 days old (days post-hatching; dph). 118 Fish were obtained from a mass tank spawning of 6 females and 8 males induced by 119 desalinisation. Broodstock include wild individuals caught in French Polynesia that has been 120 maintained at the Centre Ifremer du Pacifique (CIP) hatchery facility for seven years, under 121 the supervision of the direction des ressources marines (DRM). Eggs were randomly 122 distributed into six black circular fiberglass tanks of 210 L with 50 eggs.L<sup>-1</sup> in order to achieve an average density of 30 larvae.L<sup>-1</sup>. Half of the tank were then reared in conditions 123 124 that followed standard procedures implemented in the CIP facility (open water system, 125 normal salinity around 36 psu), named "Standard" [18]. The other half was reared in 126 conditions that were supposed to be optimal according to previous experiments, named 127 "Recirculated". Indeed, animals were bred in a recirculating system which was desalinated to 128 24 psu until day 34 where salinity was progressively raised to normal (36 psu). Moreover, 129 commercial clay (Clay Bacter  $\mathbb{R}$ ) was added daily at a rate of  $1g/d/m^3$  per percent of hourly

130 water renewal from day 1 to day 19, the beginning of living prey weaning period. In addition, 131 an input of probiotic Pseudoalteromonas piscicida B1 (local strain), produced in CIP facilities 132 (see supplementary methods), was realised daily in fish fed (0.5mL/day/tank) and in the water 133 (0.5 ml/day/tank) at a concentration of 10<sup>9</sup>cfu/ml of bacterial suspension from day 1 to day 134 57. At the end of the larval phase, day 20, 700 fingerlings/tank were randomly kept. When 135 they reached an average weight of 1g, they were sorted to get rid of the queue and head batch 136 and kept at a density of 200/tank (1g/L). It is however relevant mentioning that around day 137 40, fish started to show a decrease of appetite and heavy mucus losses even if there was no 138 mortality, mainly in the recirculating system. After an analysis of water flora, it was shown 139 that Vibrio harvevi was present but no T. maritimum.

140 Platax larvae were fed 4 times a day with living preys (Brachonius sp. and Artemia spp.) 141 before being weaned from day 16 to 23. Fingerlings were then fed with commercial micro-142 pellets ranging from 0,3 to 1 mm for the range Micro-Gemma and Gemma (Skretting, 143 Stavanger, Norway) and 1-1.3 mm for Ridley (Le Gouessant, Lamballe, France) according to 144 the standard previously established [18]. Seawater provided to both systems was pumped 145 from the lagoon, filtered with 300 µm sand filter and two 25 and 10 µm mesh filters and UV 146 treated (300 mJ/cm<sup>2</sup>). Recirculating system included a 500L biological filter to regulate level 147 of ammonia and nitrite. All tanks were supplied with saltwater held at  $28,4 \pm 0.3$  °C at 148 constant photoperiod (12L: 12D) and oxygen saturation was maintained above 60% in the 149 tanks with air distributed via air stone. Water renewal ranged from 36 to 360 L/h and new 150 water input in the recirculating system was of  $11 \pm 1$  %. Levels of ammonia and nitrite were 151 monitored once a week by spectrophotometry (HANNA Instruments ®) to assess bio filter 152 performance. Temperature, salinity and dissolved oxygen were measured daily (YSI ®) and 153 the unfed and fecal materials were removed once a day.

154 b) Bacterial challenge

155 We used strain TF4 for the experimental infection on 58 dph fingerlings. TFA4 strain was 156 isolated from the skin of an infected *Platax orbicularis* in French Polynesia in 2013 and was 157 shown to belong to *Tenacibaculum maritimum* by whole-genome sequencing, displaying an 158 average nucleotide identity of 99.6 % with the reference strain NCIMB 2154<sup>T</sup> [30]. TFA4 strain was cultivated in nutrient Zobell medium (4 g L<sup>-1</sup> peptone and 1g L<sup>-1</sup> yeast extract 159 160 Becton, Dickinson and Company, Sparks, MD in filtered and UV-treated sea water) under 161 constant agitation (200 rpm) at 27°C for 48h. On the infection day, 50 juvenile Platax 162 orbicularis were transferred into 40 L-tanks supplied with air and infected by an addition of 163 10 mL of bacterial suspension of TFA4 strain in the tank water. Final bacterial concentration in the 40 L-tanks tanks, determined by "plate-counting" method, reached 4.10<sup>4</sup> CFU.mL<sup>-1</sup>. 164 165 Moreover, for each rearing condition, 16 to 17 fish were randomly selected from each tank to 166 be transferred in one 40L-tank to form mock-treated group, referred as control (N = 50 fish) 167 and an addition of 10 mL of Zobell medium was done. After 2 hours of bathing, fish were 168 caught with a net, rinsed by successive passage in two buckets of 40L filled with clean 169 filtered UV-treated seawater, before being transferred back into their respective tanks. Twice 170 a day, one third of the water was changed with filtered UV-treated seawater to maintain good 171 water quality and be able to inactivate T. maritimum in sewage by bleach treatment. 172 Moreover, at those times, dead animals were collected and recorded. After 115 hours post-173 infection (hpi), all infected animals were considered as survivors and the challenge ended. All 174 the remaining fish were euthanized.

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## c) Animal sampling

We randomly sampled five individuals per tank at 58 dph (average weight of  $7.21g \pm 0.28$  se). Sampling used for the experiment consisted in five individuals per tank at 24hpi and 96hpi (Figure 1A). To increase our sampling dataset for controls we included "standard" control group (see previous section, one tank) together with "recirculated" condition (one tank) individuals. Consequently, our design consisted in four groups, namely *control*<sub>24h</sub> (N=10 181 individuals, replicates tanks), control<sub>96h</sub> (N=10 individuals, replicates tanks), infected<sub>24h</sub> (N=15 182 individuals, triplicates tanks) and *resistant*<sub>96h</sub> (N=15 individuals, triplicates tanks). For each 183 sampling, at 24hpi and 96hpi, individuals were lethally anaesthetized using benzocaine bath 184 (150 mg.L<sup>-1</sup>) and a lateral photograph was taken using a digital fixed camera (Leica 185 Microsystems; Figure 1B and C). Microbiome and host sampling consisted in gentle fish skin 186 smears with sterile swabs. Swabs were directly placed in TRIZOL Reagent (Life 187 Technologies) on ice to prevent RNA degradation. Swabs were disrupted using a mixer mill 188 MM200 (Retsch) for 5 min at a frequency of 30 Hz and stocked at -80°C for latter analysis. In 189 parallel, water was also sampled in each tank but was not included in the analysis due to very 190 low DNA yield.

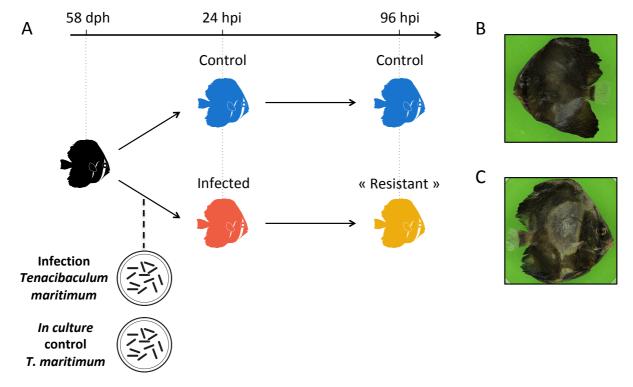


Figure 1: Experimental design and individuals' photographs. A) Experimental infection was conducted at 58 dph, after random sampling of five individuals per tank to assess initial weight. At 24 and 96 hours hpi, five individuals per tank (N= 15 individuals, *infected*<sub>24h</sub>; N = 15 individuals, *resistant*<sub>96h</sub>; N = 10 individuals, *control*<sub>24h</sub> and N = 10 individuals, *control*<sub>96h</sub>) were sampled by swabs. Same individuals serve for host and microbiome transcriptomic and for microbiome metabarcoding. B) Photograph of control fish (control<sub>24h</sub>); C) Photographs of infected fish (infected<sub>24h</sub>) showing typical skin lesions associated with tenacibaculosis.

## 199 d) *T. maritimum in vitro* liquid culture sampling.

The TFA4 strain was cultivated in 6 mL of Zobell medium under constant agitation (200 rpm) 200 201 at 27°C for 48h, following exact same procedure and time of incubation than the culture used 202 for bacterial challenge. Five culture replicates were performed. For each replicate, 4 mL at 203 10<sup>8</sup> CFU/mL were centrifuged 5 min. at 10,000g and at room temperature. Three inox beads 204 and 2 mL of TRIZOL (Life technologies) were quickly added to each bacterial pellet and cells 205 were immediately disrupted using a mixer mill MM200 (Retsch) for 5 min. at a frequency of 206 30 Hz to prevent RNA degradation. RNA was extracted following manufacturer' instructions, 207 using a high salt precipitation procedure (0.8 M sodium citrate and 1.2 M NaCl per 1 ml of 208 TRIZOL reagent used for the homogenization) in order to reduce proteoglycan and 209 polysaccharide contaminations. Quantity, integrity and purity of total RNA were validated by 210 both Nanodrop readings (NanoDrop Technologies Inc.) and BioAnalyzer 2100 (Agilent 211 Technologies). DNA contaminants were removed using a DNAse RNase-free kit (Ambion). 212 A total of five RNA samples  $(1.048 \pm 0.019 \ \mu g)$  were further dried in RNA-stable solution 213 (ThermoFisher Scientific) following manufacturer's recommendations and shipped at room 214 temperature to McGill sequencing platform services (Montreal, Canada). One library was 215 removed prior sequencing because it did not meet the minimal quality requirements.

216

## e) Fish mortality and cortisol measurements

217 Mortality was recorded at 0, 19, 24, 43, 48, 67, 72, 91, 96 and 115hpi. We used the nonparametric Kaplan-Meier approach for estimating log-rank values implemented in the survival 218 219 R package [31]. Differences in survival probability was considered significant for P < 0.05. 220 We assessed stress levels in fish by measuring scale cortisol content [32]. The scales of both 221 flanks of each individual were collected, and subsequently washed and vortexed three times 222 (2.5 min; 96% isopropanol) in order to remove external cortisol that takes its source in mucus. 223 Residual solvent traces were evaporated under nitrogen flux and samples frozen at -80°C. To 224 ensure scales were dry, they were lyophilized for 12 hours before being grounded to a powder 225 using a ball mill (MM400, Retsch GmbH, Germany). Cortisol content was extracted from ~50

226 mg of dry scale powder by incubation in 1.5mL of methanol (MeOH) on a 30°C rocking 227 shaker during 18 hr. After centrifugation at 9500g for 10 min, the supernatant was evaporated 228 a rotary evaporator and reconstituted with 0.2 mL of EIA buffer provided by the Cortisol 229 assay kit (Neogen® Corporation Europe, Ayr, UK). Cortisol concentrations were determined 230 in 50 µL of extracted cortisol by using a competitive EIA kits (Neogen® Corporation Europe, 231 Ayr, UK) according to previously published protocol [33]. Differences across groups were 232 tested by a two-way ANOVA and following Tukey's HSD post-hoc after validation of 233 normality and homoscedasticity. Differences were considered significant when P < 0.05.

234

# f) RNA and DNA extraction and sequencing

235 Dual RNAseq. Total RNA was extracted using the same procedure than described above. 236 RNA was then dried in RNA-stable solution (ThermoFisher Scientific) following 237 manufacturer's recommendations and shipped at room temperature to McGill sequencing 238 platform services (Montreal, Canada). Ribo-Zero rRNA removal kit (Illumina, San 260 239 Diego, Ca, USA) was used to prepare mRNA, rRNA-depleted, libraries that were multiplexed 240 (13-14 samples by lane) and sequenced on HiSeq4000 100-bp paired-end (PE) sequencing 241 device. Infected individuals 24hpi were sequenced twice for insuring sufficient coverage 242 (Table S1).

Short-reads 16S rRNA MiSeq microbiome sequencing. Total DNA was extracted from the
same TRIZOL Reagent (Life Technologies) mix than described above. DNA
quantity/integrity and purity were validated using both a Nanodrop (NanoDrop Technologies
Inc.) and a BioAnalyzer 2100 (Agilent Technologies). The V4 region was amplified by PCR
using modified 515F/806rb primers constructs (515F: 5'-GTGYCAGCMGCCGCGGTAA-3';
806rb: 5'- GGACTACNVGGGTWTCTAAT-3'), recommended for microbial survey [34].
Amplicons libraries were multiplexed and sequenced on a single lane of MiSeq 250bp PE

Illumina machine at Genome Québec McGill, Canada. Details of sequencing statistics areprovided in Table S2.

Full 16S rRNA Nanopore sequencing. For a broad range amplification of the 16S rRNA
gene, DNA was amplified using the 27F/1492R barcoded primers products (27F: 5'AGAGTTTGATCMTGGCTCAG-3'; 1492R: 5'- TACGGYTACCTTGTTACGACTT-3').
We included in the PCR experiment eight randomly selected individuals from *infected*<sub>24h</sub>
group, two negative PCR controls (clean water) and one positive control (Acinetobacter
DNA).

258 The PCR mixtures (25 µl final volume) contain 10 ng of total DNA template or 10 µl of 259 water, with 0.4 µM final concentration of each primer, 3% of DMSO and 1X Phusion Master 260 Mix (ThermoFisher Scientific, Waltham, MA, USA). PCR amplifications (98 °C for 2 min; 30 cycles of 30 s at 98 °C, 30 s at 55 °C, 1 min at 72 °C; and 72 °C for 10 min) of all samples 261 262 were carried out in triplicate in order to smooth the intra-sample variance. Triplicates of PCR 263 products were pooled and purified by 1x AMPure XP beads (Beckmann Coulter Genomics) 264 cleanup. Amplicon lengths were measured on an Agilent Bioanalyzer using the DNA High 265 Sensitivity LabChip kit then quantified with a Qubit Fluorometer.

An equimolar pool of purified PCR products (excepted for negative controls) was done and one sequencing library was finally prepared from 100 ng of the pool using the 1D Native barcoding genomic DNA protocol (with EXP-NBD103 and SQK-LSK108) for R7.9 flow cells run (FLO-MAP107) then sequenced on the MinION device. Details of sequencing statistics are provided in Supplementary Material.

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#### g) Microbiome communities analyses

Microbiome dynamics with MiSeq short-reads dataset. Raw reads were filtered to remove Illumina's adaptors as well as for quality and length using Trimmomatic v.0.36 [35] with minimum length, trailing, and leading quality parameters set to 100 bp, 20, and 20,

respectively. Remaining reads were analysed with functions implemented in QIIME2 275 276 platform v2019.10. Briefly, we used DADA2 algorithm [36] to cluster sequences in amplicon 277 sequence variants (ASVs). The following ASVs were mapped against GreenGenes v13.9 99% 278 OTUs database [37]. We explored alpha-diversity [Shannon, Fisher and Faith's phylogenetic 279 diversity (PD) indexes] and beta-diversity (Bray-Curtis, unweighted and weighted Unifrac 280 distances) using phyloseq R package [38]. Dissimilarity between samples was assessed by 281 principal coordinates analysis (PCoA). Differences in alpha-diversity were tested using 282 pairwise Wilcoxon rank test and were considered significant when P < 0.01. Differences in 283 beta-diversity were tested using PERMANOVA (999 permutations) as implemented in the adonis function of the vegan R package [39] and were considered significant when P < 0.01. 284 285 We also searched for « core » microbiome in fish skin and considered as member of core 286 microbiome ASVs that were present in all the individuals across all condition (infected, 287 control and resistant). We finally searched for significant differences in specific ASV 288 abundance across groups using Wald tests implemented in the DESeq2 R package [40]. We 289 used 'apeglm' method for Log2FC shrinkage to account for dispersion and variation of effect 290 size across individuals and conditions, respectively [41]. Differences were considered 291 significant when FDR < 0.01 and |FC| > 2.

292 Microbiome diversity analysis with the Nanopore dataset. Sequences were called during 293 the MinION run with the MinKnow software (v. 1.7.14). The demultiplexing and adaptor 294 trimming were done with porechop tool (https://github.com/rrwick/Porechop) with the option 295 discard middle. For each barcode, all nanopore reads were mapped on the GreenGenes 296 database (v.13.5, http://greengenes.lbl.gov) with minimap2 (v2.0-r191) with the pre-set 297 options "map-ont" [42]. All reference sequences of the GreenGenes database covered by 298 more than 0.01% of all read were kept for the next step. A second round of mapping (same 299 parameters) was done on the selected references in order to aggregate reads potentially mis-300 assigned during the first round of mapping. SAMtools and BCFtools were used to reconstruct 301 consensus sequences for each reference sequence covered with more than 10 nanopore reads 302 with the following programs and options: mpileup -B -a -Q 0 –u; bcftools call -c --ploidy 303 1;vcfutils.pl vcf2fastq. Individuals and consensus sequences were blast against NCBI nt 304 database (e-value  $< 10^{-5}$ ).

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## h) Compartment specific differential expression analyses

306 Reads pre-processing. For each individual, raw reads were filtered using Trimmomatic 307 v0.36 [43], with minimum length (60bp), trailing and leading (20 and 20; respectively). 308 Filtered PE reads were mapped against a combined reference including the host's 309 transcriptome (See supplementary material for details of the transcriptome assembly; Table 310 S1 and S3) and the genomes of Alteromonas mediterranea strain: AltDE1 (Genbank 311 accession: GCA 000310085.1), and Pseudoalteromonas phenolica strain: KCTC 12086 312 (Genbank accession: GCA 001444405.1), Tenacibaculum maritimum strain: NCIMB 2154T 313 (Genbank accession: GCA 900119795.1), Sphingobium vanoikuyae strain ATCC 51230 314 (Genbank accession: GCA 000315525.1), Vibrio alginolyticus strain: ATCC 17749 315 (Genbank accession: GCA 000354175.2,) and Vibrio harveyi strain: ATCC 43516 (Genbank accession: GCA 001558435.2). To prevent multi-mapping biases we used GSNAP v2017-03-316 317 17 [44] with minimum coverage fixed at 0.9, maximum mismatches allowed of 5 and 318 removing non-properly paired and non-uniquely mapped reads (option "concordant uniq"). 319 Low mapping quality (MAPQ) were further removed using Samtools v1.4.1 [45] with 320 minimum MAPQ threshold fixed at 5. A matrix of raw counts was built using HTSeq-count 321 v0.9.1 [46]. Transcripts from host and bacteria species origin were then separated in different 322 contingency tables using homemade scripts.

Host transcriptome analysis. Low coverage transcripts with count per million (CPM) < 1 in at least 9 individuals were removed, resulting in a total of 22,390 transcripts. Similarly, transcripts over-representation was assessed using *'majSequences.R'* implemented in 326 SARTools suite [47]. We used distance-based redundant discriminant analysis (db-RDA) to document genetic variation among groups and correlation with condition (infected or control), 327 328 weight and time (24 and 96hpi) as the explanatory variables. Briefly, we computed 329 Euclidean's distances and PCoA using 'daisy' and 'pcoa' functions, respectively, 330 implemented in the ape R package [48]. PCo factors (n = 6) were selected based on a broken-331 stick approach [49,50] and used to produce a db-RDA. Partial db-RDAs were used to assess 332 the factor effect, controlling for the other factor variables. We tested the models and 333 individual factors significance using 999 permutations. The effect was considered significant 334 when P < 0.01.

335 Differential expression was assessed using the DESeq2 R package [40] using pairwise 336 comparisons with Wald test. Logarithmic fold change (logFC) were shrinked using 'apeglm' method, implemented in DESeq2 R package [40], to account for dispersion and effect size 337 338 across individuals and conditions [41]. Differences were considered significant when FDR < 0.01 and FC > 2. Group comparisons included infected<sub>24h</sub> vs control<sub>24h</sub> and resistant<sub>96h</sub> vs 339 340 control<sub>96h</sub>. Gene ontology (GO) enrichment was tested using GOAtools v0.6.5 [51] and the 341 go-basic.obo database (release 2017-04-14) using Fisher's test. Our background list included 342 the ensemble of genes in the host transcriptome. Only GO terms with Bonferroni adjusted P <343 0.01 and including at least three differentially expressed genes were considered. Significant 344 GO enriched terms used for semantic-based clustering REVIGO were in 345 (http://revigo.irb.hr/).

346 *Tenacibaculum maritimum* gene expression *in vitro* or during infection. A validation step 347 for searching for transcripts over-representation was assessed using *'majSequences.R'* 348 implemented in SARTools suite [47], similarly to the fish transcriptome. Most represented 349 sequences were attributed to *ssrA* coding genes, but represents less than 8% of the total 350 library. We applied similar shrinkage method and pairwise comparisons (infected vs. *in vitro*). 351 We used more stringent thresholds for the *T. maritimum* than for the host, as commonly observed in similar studies [8], and considered significant differences when FDR < 0.01 and FC > 4. Gene ontology (GO) enrichment was similar to the methods used for the host.

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## i) Species specific weighted co-network gene expression analyses.

We built a series of signed weighted co-expression network for the host and the bacteria compartments (using only for *infected*<sub>24h</sub> individuals for including *V. harveyi*, *T. maritimum* and *P. phenolica*, independently) to cluster co-expressed genes and identify putative driver genes using WGCNA R package [52]. Variation in normalized counts were prior controlled using '*vst*' method implemented in DESeq2 R package [40].

360 Host WGCNA analysis. We reduced the expression noise in the dataset by retaining only 361 transcripts with minimum overall variance (> 5%). Briefly, we fixed a soft threshold power of 362 14 using the scale-free topology criterion to reach a model fit (|R|) of 0.80. The modules were 363 defined using the 'cutreeDynamic' function (minimum 30 genes by module and default 364 cutting-height = 0.99) based on the topological overlap matrix, a module Eigengene distance 365 threshold of 0.25 was used to merge highly similar modules. For each module we defined the 366 module membership (kME, correlation between module Eigengene value and gene expression values). We looked for significant correlation (Pearson's correlation; P < 0.001) modules 367 against physiological data including cortisol levels (pg.mg<sup>-1</sup> of scales), fish weight (g) and 368 condition (coded "1" for control<sub>24h</sub>, control<sub>96h</sub> and resistant<sub>96h</sub> and "2" for infected<sub>24h</sub> 369 370 condition, respectively). Gene ontology (GO) enrichment for each module was tested using 371 same protocol and parameters than described above.

372 **T.** maritimum WGCNA analyses. Briefly, we conducted species-specific weighted co-373 expression network analyses and used bacterial species and host module eigenvalue to 374 correlate genes modules. We fixed a soft threshold power of 20 using the scale-free topology 375 criterion to reach a model fit ( $|\mathbf{R}|$ ) of 0.85. The modules were defined using the 376 *cutreeDynamic* function (minimum 30 genes by module and default cutting-height = 0.99)

based on the topological overlap matrix, a module Eigengene distance threshold of 0.3 was 377 378 used to merge highly similar modules. For each module we defined the module membership 379 (kME, correlation between module Eigengene value and gene expression values). Individual 380 module Eigengene values were computed using the 'moduleEigengenes' and used as metadata 381 for further downstream correlation analyses. We finally computed a correlation matrix and focused on genes showing significant correlation (P < 0.05) to host main modules 382 383 eigenvalues, namely modulehost-turauoise and modulehost-blue. Gene ontology (GO) enrichment for 384 each list of genes was tested using same protocol and parameters than described above.

385

# j) The genetic bases of fish resistance

386 We further explored the putative genetic variation between resistant and infected fish. We 387 choose to focus on resistant fish because of their established phenotype, (i.e. survivor with no 388 sign of lesions after bacterial challenge). We followed GATK recommendations for SNPs identification based on RNAseq data. Briefly, BAM files were pre-treated using 'CleanSam' 389 390 function, duplicates were notified with the 'MarkDuplicates' function, and cigar string 391 splitted with 'SplitNCigarReads' function. All functions are implemented in GATK v4.0.3.0 392 software [53,54]. Final SNPs calling was conducted with Freebayes v1.1.0 393 (https://github.com/ekg/freebayes) requiring minimum coverage of 15 and minimum mapping 394 quality of 20, forcing ploidy at 2 and removing indels ('--no-indels') and complex 395 polymorphisms ('--no-complex'). The raw VCF file was filtered for minimum allele 396 frequency ('--min maf=0.2'), minimum coverage ('--minDP=20') and allowing no missing 397 data using Vcftools v0.1.14 [55]. We computed relatedness ('-relatedness2') within and 398 among groups with Vcftools v0.1.14 [55]. We further used distance-based redundant 399 discriminant analysis (db-RDA) to document genetic variation among groups and correlation 400 with cortisol and condition and weight as the explanatory variables. Briefly, we computed 401 Euclidean's distances and PCoA using 'daisy' and 'pcoa' functions, respectively, 402 implemented in the ape R package [48]. PCo factors (n = 6) were selected based on a broken403 stick approach [49,50] and used to produce a db-RDA. We tested the model significance 404 using 999 permutations, effect was considered significant when P < 0.01.

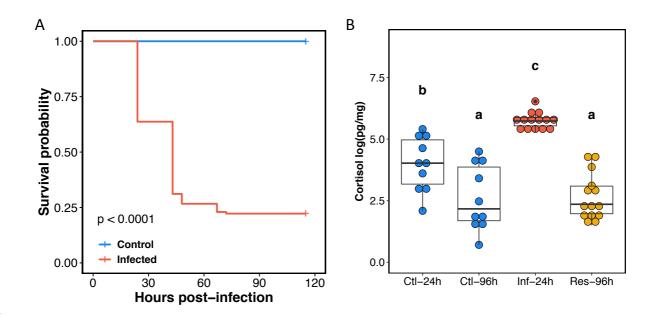
## 405 **Results**

406 We compared infected (with T. maritimum TF4 strain) to mock-treated P. orbicularis groups 407 (thereafter referred as control) in experimental infection conditions and individuals were 408 sampled at 24 and 96 hpi. Surviving individuals in infected groups at 96 hpi are referred as 409 'resistant' fish. Sampling consisted in individual skin swab for later DNA and RNA 410 extraction. DNA served to assess microbiome communities (using 16S rRNA and nanopore 411 technologies) while RNA served for genes expression analysis of the microbiome and the fish 412 simultaneously (dual RNAseq). In addition, we compared genes expression of T.maritimum 413 during the infection in vivo to in vitro liquid culture to detect putative virulence factors. Fish 414 condition, survival and cortisol levels were also monitored.

#### 415

#### a) Fish weight, cortisol levels and mortality

416 Mortality rate in challenged fish reached  $77.36 \pm 18.35$  (standard error; se) while no mortality was observed in control group (Kaplan-Meier analysis, P < 0.001; Figure 2A). Mortality 417 418 started at 24hpi in infected group and no novel mortality even was observed after 72hpi. Cortisol levels in fish scales significantly vary across groups (ANOVA; F = 9.46; P < 0.01; 419 420 Figure 2B). Overall cortisol levels were higher in the *infected*<sub>24h</sub> group compared to all others groups (Tukey 's HSD; P = 0.01). Cortisol levels in *control*<sub>24h</sub> group were also higher than 421 422 both *control*<sub>96h</sub> and *resistant*<sub>96h</sub> groups (Tukey's HSD; respectively t = -3.28; P = 0.01 and t =-3.42; P < 0.01). However, no difference was observed between *control*<sub>96h</sub> and *resistant*<sub>96h</sub> 423 groups (Tukey's HSD; t = 0.12; P = 0.99). 424

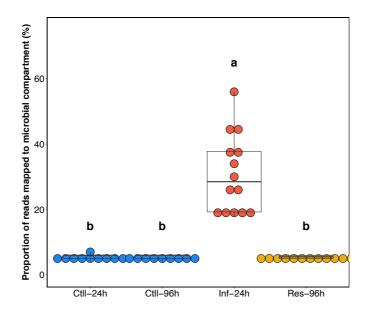




426Figure 2: Kaplan Meier survivals estimates and scales cortisol levels. A) Kaplan–Meier427survival curves for control (blue) and infected (red) groups over the 115hpi of the experiment.428Survival was monitored at 0,19, 24, 43, 48, 67, 72, 91, 96 and 115hpi. B) Scale cortisol levels429are expressed on a logarithmic (Log10) scale. Ctl-24h: control24h; Ctl-96h: control96h, Inf-24h:430infected24h; Res-96h: resistant96h, groups. Letters represent significant differences, P < 0.05,431Tukey's HSD test.

# b) Dynamic of host transcriptomic response to infection and search for genomic bases of resistance.

Global mean unique mapping rate for skin smear samples reached 71.64  $\pm$  2.99% against a combined reference for host and microbes compartments. Datasets were predominantly composed of host-origin sequences (mean 86.57  $\pm$  13.48%), with *infected*<sub>24h</sub> group showing significantly higher proportion of non-host origin reads [mean 30.70 %  $\pm$  0.03 se] than other groups (Dunn's test; Benjamini-Hochberg adj. P < 0.05; Figure S1). Details of host' transcriptome and individuals mapping are provided in Table S1 and S3.

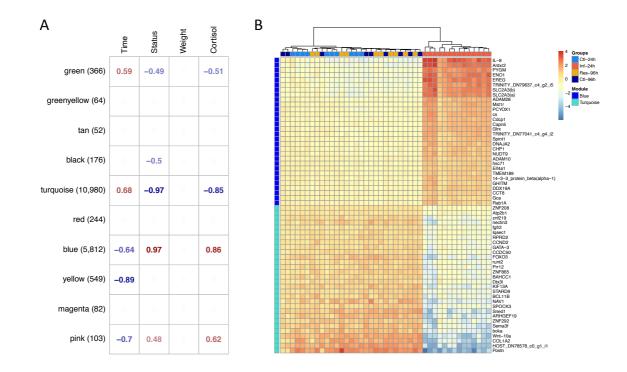


442 **Figure S 1: Proportion of the reads mapped to the microbial compartment.** Reads origin 443 was dissociated *in silico*. Reads were considered originating from microbial compartment 444 when no mapping was evident in the fish transcriptome. Ctl-24h: *control*<sub>24h</sub>; Ctl-96h: 445 *control*<sub>96h</sub>, Inf-24h: *infected*<sub>24h</sub>; Res-96h: *resistant*<sub>96h</sub>, groups. Letters represent significant 446 differences, P < 0.05, Dunn's test.

447 Fish response to infection. Differential expression analyses reveal strong differences in host 448 genes expression profiles between *control*<sub>24h</sub> and *infected*<sub>24h</sub>, with a total of 3,631 and 2,388 449 down and up-regulated genes in *infected*<sub>24h</sub>, respectively, compared to *control*<sub>24h</sub>, (|FC| > 2; 450 FDR < 0.01; Table S4). Infected<sub>24h</sub> group responds to infection mainly by activating immune 451 system response (Biological Process; BP), sterol biosynthetic process (BP), defense response 452 (BP), inflammatory response (BP), regulation of biological quality (BP), lipid metabolic 453 process (BP), iron ion homeostasis (BP), complement binding (Molecular Function; MF), 454 heme binding (MF), oxidoreductase activity (MF), sulphur compound binding (MF), (1-3)-455 beta-3-D-glucan binding (MF). A complete list of GO enrichment for each module is 456 provided in Table S4.

We further used co-expression network analysis (WGCNA) to draw clusters of co-regulated genes associated with discrete (condition) or continuous variable (weight and cortisol) and to identify putative hub genes. No genes module significantly correlates with fish mass suggesting that it had no significant effect on genes expression profiles. A total of three

461 modules show negative correlation (P < 0.01) with disease status (coded 1 for *control*<sub>24h</sub>, control<sub>96h</sub> and resistant<sub>96h</sub> groups and 2 for infected<sub>24h</sub>) namely module<sub>turquoise-host</sub> (r = -0.97, P 462 < 0.001), module<sub>black-host</sub> (r = -0.5, P < 0.001) and module<sub>green-host</sub> (r = -0.49, P < 0.001; Figure 463 464 3). Inversely, two modules show positive correlation with the condition namely module<sub>blue-host</sub> 465 (r = 0.97, P < 0.001) and module<sub>pink-host</sub> (r = 0.48; P = 0.001). Almost all these modules (with 466 the exception of module<sub>black-host</sub>) also correlate significantly with cortisol levels. The genes found up-regulated in *control*<sub>24h</sub> clustered mostly in the module<sub>turquoise-host</sub> (n = 3,468; 95.5%), 467 468 module<sub>black-host</sub> (n = 72; 2.0%) and module<sub>green-host</sub> (n = 39; 1.0%). Nearly all the genes found up-regulated in *infected*<sub>24h</sub> clustered in module<sub>blue-host</sub> (n = 2,352; 98.5%). Not surprisingly, 469 470 main drivers genes ('hub-genes') encompass several transcriptional activators such as for the 471 module<sub>turquoise-host</sub> several Zinc finger proteins, Transcription factor GATA-3 (gata-3), Forkhead box protein O3 (foxpo3), activators of the autophagy pathways and main drivers of 472 naïve specific T-cells differentiation and activation [56], Runt-related transcription factor 2 473 474 (runt2) coding genes, involved in osteoblast differentiation, a mineral depositing cells and 475 enhancer of T-cells receptor and sialoproteins [57]. In the module<sub>blue-host</sub>, 'hub-genes' mainly report actors of the innate immune system, inflammatory response, wound healing, oxidative 476 477 and adhesion activity (Figure 3B).

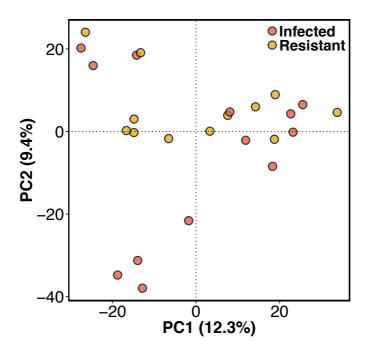


480 Figure 3: Signed co-expression network analysis for *P. orbicularis*. A) Correlation matrix 481 for *P. orbicularis*. Values in the cells represent significant (P < 0.01) Pearson's correlation of 482 module eigenvalue to physiological parameters (top panel). Names (left panel) are arbitrary 483 color-coded names for each module; values in parenthesis represent the number of genes per 484 module. Empty cells indicate non-significant correlation ( $P \ge 0.01$ ). Individuals' cortisol 485 [log(pg.mg<sup>-1</sup>)] and weight (g) are continuous values. Time (24hpi and 96hpi) and Status (coded 1 for *control*<sub>24h</sub>, *control*<sub>96h</sub> and *resistant*<sub>96h</sub> groups and 2 for *infected*<sub>24h</sub>) are discrete 486 numeric values. B) Heatmaps of top 30 genes in module<sub>blue-host</sub> and module<sub>turquoise-host</sub>. Scales 487 represent Log2 (prior 2) of the individuals' expression levels. Individuals were clustered using 488 hierarchical clustering procedures implemented in pheatmap R package [58]. 489

490

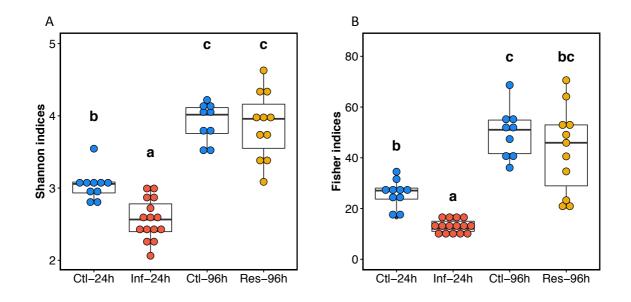
491 Genomic bases of resistance. We found 38 DEGs between control<sub>96h</sub> and resistant<sub>96h</sub> (16 and 492 22 down and up-regulated in *resistant*<sub>96h</sub>, respectively; |FC| > 2; FDR < 0.01). GO analyses 493 show that adaptive immune response (BP) tends to be activated (uncorrected P < 0.001) in 494 resistant<sub>96h</sub> that includes genes related to pathogens recognition and immune response such as C-type lectin domain family 4 member M, Low affinity immunoglobulin gamma Fc receptor 495 496 II-like and T-cell receptor beta variable 7-2 coding genes. Inversely, resistant<sub>96h</sub> show 497 inactivation of the regulation of ERK1 and ERK2 cascade (BP) and repressors of the response 498 to wounding (BP), regulation of the transforming growth factor-beta secretion (BP), alcohol 499 biosynthetic process (BP) and regulation of interleukin-8 production (BP). However, GO 500 enrichments were not considered significant under our threshold (Bonferroni adj. P > 0.05). 501 A total of 27 (71.1%), out the 38 DEGs identified, also showed different expression levels 502 between *control*<sub>24h</sub> and *infected*<sub>24h</sub>. Among the 11 remaining genes (28.9%), we found Arf-503 GAP with dual PH domain-containing protein 1, C-type lectin domain family 4 member M, 504 protein KIAA1324-like homolog, Ankyrin repeat and fibronectin type-III domain-containing 505 protein 1 and T-cell receptor beta variable 7-2, up-regulated in *resistant*<sub>96h</sub> group. Inversely, 506 we found the Sal-like protein 1, Early growth response protein 1 and the Low affinity 507 immunoglobulin gamma Fc receptor II-like down-regulated in resistant<sub>96h</sub>. The complete list 508 of DEGs and GO term enriched is provided in Table S4.

We finally searched for genetic variation (SNPs) across *resistant*<sub>96h</sub> and *infected*<sub>24h</sub> (two established phenotypes) in order to identify putative variants associated with resistance capacities. We identified a subset of 13,448 filtered bi-allelic SNPs. Genetic variations analyses did not suggest any significant difference among groups (relatedness, Fst) and was not correlated with any of the groups' cortisol levels or fish mass based on the 13,448 markers (PERMANOVA; 1000 permutations; P = 0.18; Figure S2).



# c) Microbiome flexibility and interaction among pathogens species and host response

521 Dynamic of microbiota communities on fish skin. MiSeq sequencing strategy with 522 amplification of the 16S rRNA V4 region of the 16S rRNA resulted a mean number of PE of 523  $231,164.02 \pm 36,542.99$  sd out of which a mean of  $82.47 \pm 2.54$  remained after filtering 524 (Table S2). Species richness (Shannon) was lower in *infected*<sub>24h</sub> than other groups (MWW; 525 Holm adj. P < 0.001). Similarly, *control*<sub>24h</sub> shows reduced species diversity values compared 526 to control<sub>96h</sub> (MWW; Holm adj. P < 0.001) but no difference was observed between 527 resistant<sub>96h</sub> and control<sub>96h</sub> (MWW; Holm adj. P = 0.71; Figure S3A). Similar observation was 528 made for Fisher's alpha parameter but the latter shows significant difference between 529 *control*<sub>24h</sub> and *resistant*<sub>96h</sub> (MWW; Holm adj. P = 0.05; Figure S3B). Bacterial communities vary significantly across groups (PERMANOVA; F = 30.93; P < 0.001); however, the beta 530 531 dispersion also differs significantly ('betadisper', ANOVA, F = 30.93; P < 0.001). 532 Specifically, based on Bray-Curtis distances values, communities are less variable in infected<sub>24h</sub> group compared to all other groups (Tukey's HSD, [control<sub>24h</sub>-infected<sub>24h</sub>: 95% 533 534 CI= 0.05-0.19; resistant<sub>96h</sub>-infected<sub>24h</sub>: 95% CI= 0.17-0.31; control<sub>96h</sub> - infected<sub>24h</sub>: 95% CI= 535 0.12-0.28]; P < 0.001, Figure S4). Communities are also more variable in resistant<sub>96h</sub> compared to *control*<sub>24h</sub> (Tukey's HSD, 95% CI= 0.04-0.20; P = 0.001). The ASVs associated 536 537 with *Tenacibaculum (Flavobacteriales)* are largely enriched in *infected*<sub>24h</sub> compared to 538 control<sub>24h</sub>, but also significantly enriched in resistant<sub>96h</sub> compared to control<sub>96h</sub> (shrinked 539 |Log2FC| > 2; FDR < 0.01; Figure S4).



541 Figure S 3: Alpha-diversity estimates across groups. Alpha-diversity was computed using

542 A) Shannon (H') and B) Fisher indexes. Ctl-24h: *control*<sub>24h</sub>; Ctl-96h: *control*<sub>96h</sub>, Inf-24h: 543 *infected*<sub>24h</sub>; Res-96h: *Resistant*<sub>96h</sub>, groups. Letters represent significant differences, P < 0.05,

544 Tukey's HSD. Each dot represents an individual.

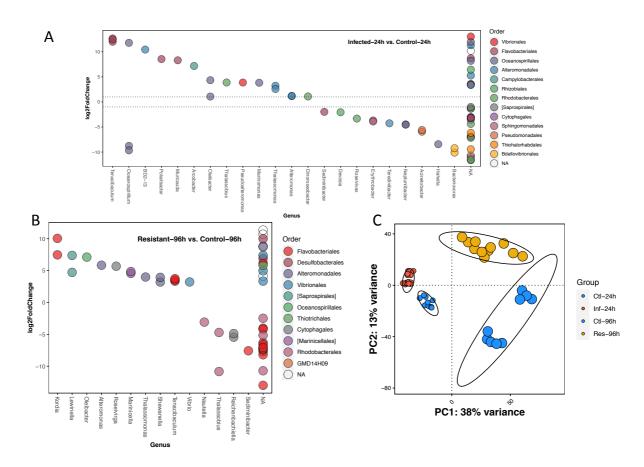
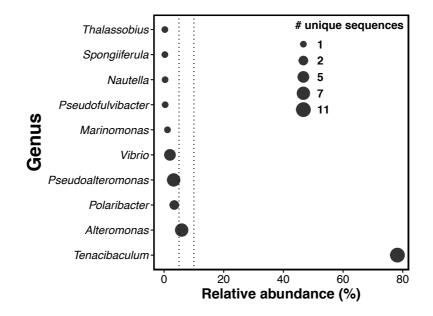


Figure S 4: Taxa enrichment and beta-diversity dissimilarities across groups. A) ASVs 547 enrichment between *infected*<sub>24h</sub> (positive log2FC) and *control*<sub>24h</sub> (negative values). Colors 548 549 represent different Orders. The y-axis reports shrinked Log2FC. Horizontal dash lines represent Log2FC threshold for significance (|Log2FC| > 2). NAs represent missing 550 taxonomic information for this ASV; B) ASVs enrichment between resistant<sub>96h</sub> (positive 551 log2FC) and control<sub>96h</sub> (negative values). Colors represent different orders. The x-axis 552 553 represents associated Genus, y-axis reports shrinked Log2FC. NAs represent missing 554 taxonomic information for this ASV. C) PCoA based on Bray-Curtis distance values. Ellipses 555 represent 95% CI intervals. Ctl-24h: control<sub>24h</sub>; Ctl-96h: control<sub>96h</sub>, Inf-24h: infected<sub>24h</sub>; Res-556 96h: Resistant<sub>96h</sub>, groups. Smaller points code for 24hpi, larger points for 96hpi groups.

557

558 Long-reads refinement of bacteria communities in infected fish. Results from Nanopore 559 sequencing on full 16S rRNA sequences served to refine the taxonomy at the species levels, 560 which might be limited with short-reads approaches. We amplified the full 16S rRNA for 8 561 individuals randomly subsampled from the infected group 24hpi resulting in a mean number 562 of SE reads of  $60,019.62 \pm 33,778.99$  sd after pre-processing (individual with the lowest 563 coverage reached a total of 29,520 sequences). Nanopore shows an over-dominance of T. 564 maritimum in infected<sub>24</sub> (73.51  $\pm$  4.89%) and confirmed the presence of other genera, 565 including Vibrio, Polibacter, Alteromonas and Pseudoalteromonas (Figure S5). Among these 566 genera, some species are known as potential fish pathogens such as V. harveyi [59], while 567 others (*Pseudoalteromonas*) have been proposed as putative probiotics [60].



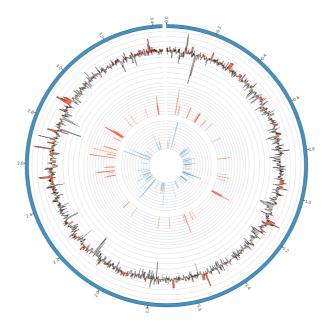
569 **Figure S 5: Relative abundance of bacterial genera in the** *infected*<sub>24h</sub> group reported 570 **with Nanopore.** 16S rRNA sequences and their relative abundance were generated from 571 Nanopore reads (see methods). These sequences were blast against NCBI nt database 572 (BLASTn; e-value<10-5). Size of the dots represent the number of unique sequence per 573 genus.

574

# 575 d) Microbial compartment transcriptomic activity

# 576 Genes expression of *Tenacibaculum maritimum* during experimental infection vs *in vitro*.

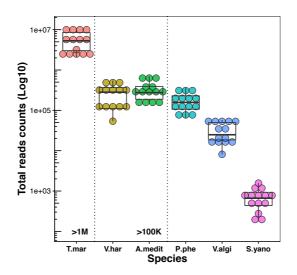
- 577 We explored the genes expression levels for T. maritimum in the fish during the pic of
- 578 infection compared to *in vitro* to highlight putative genes associated with virulence (Figure 4).
- 579 Mean total mapped reads against *T. maritimum in vivo* reached  $5.65M \pm 0.82$  se (Figure S6),
- 580 which is sufficient to conduct differential expression analysis [61].



581

**Figure 4: Circos plot of** *in vitro* and *in vivo T. maritimum* expression comparisons. External line represents mean shrinked log2FC *in vitro* (negative values) compared to *in vivo* (positive values). Reds bar represent shrinked log2FC of significantly up-regulated genes *in vivo*; blue histograms represent shrinked log2FC of significantly up-regulated genes *in vitro*. Circos positions were based on *T. maritimum* NCIMB 2154<sup>T</sup> genome information. Positions represented by external ticks are reported in million bp.

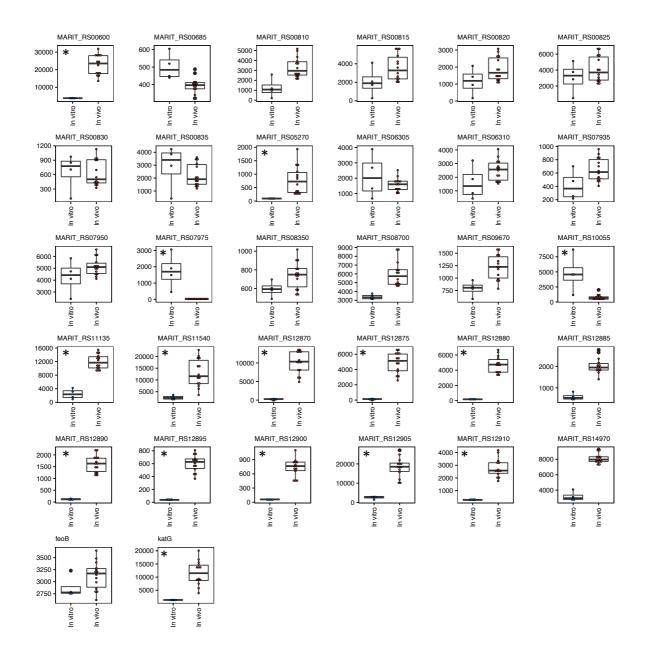
588





591 Figure S 6: Total Illumina PE reads count for the most abundant species in the 592 microbial compartment. The selected reference species were the most abundant species 593 represented in the Nanopore 16S rRNA analysis (see methods). T.mar: *T. maritimum*; V.har: 594 Vibrio harveyi; A.medit: Altermonas mediteranea; P.phe: Pseudoalteromonas phenolytica; 595 V.algi: Vibrio alginolyticus; and S.yano: Sphingobium yanoikuyae. Each dot per species 596 represents one individual.

598 We found a total of 72 and 142 DEGs up-regulated during experimental infection (in vivo) and *in vitro*, respectively (Shrinked |log2FC| > 2; FDR < 0.01). We only found the sulfate 599 600 assimilation (BP) function enriched in vitro (Bonferroni adj. P < 0.1). Among the GO positively enriched during experimental infection (Bonferroni adj. P < 0.1) we found the 601 602 glucan catabolic process (BP), external encapsulating structure part (cellular component, CC), 603 pattern binding (MF) and the antibiotic catabolic process (BP). These processes include genes already highlighted in genome scale comparisons of Tenacibaculum species as possible 604 605 virulence-related factors such as the catalase/peroxidase katG or several Ton-B receptor 606 dependent and Suc-C and SucD-like proteins [19] (Figure S7). In parallel, we also detected 607 putative candidate involved in host membrane interaction and integrity such as Ulilysin, 608 Streptopain, Pneumolysin toxin and peptidoglycan-associated factor lipoprotein or adhesines. 609 A complete list of GO is provided in Table S4.





612 Figure S 7: Plot of expression levels between *in vitro* and *in vivo* groups for all the 613 virulence-related genes previously identified. The gene list was obtained from whole-614 genome analysis in *Tenacibaculum* spp. [19]. Asterisks represent genes with significant 615 difference between groups (Shrinked |Log2FC| > 2; FDR < 0.01).

## 617 **Discussion**

618 Tenacibaculosis is a worldwide fish disease responsible for considerable farmed fish mortality 619 events; yet, knowledge is still missing on the microbiome kinetics during infection and the

620 concomitant host-pathogens interaction. Dual RNAseq arose as a method of choice by

providing unprecedented simultaneous information on the molecular features of the infection. It is particularly adapted for systems characterized by a massive pathogens burden with readily accessible material and for which cultures are not available [17,62]. Here we adapted this approach for tenacibaculosis in *P. orbicularis* fish skin samples with the goal to comprehensively assess genomic basis and kinetics of the infection as well as associated resistance mechanisms.

627 Infection modulates a wide range of host' innate and adaptive immune effectors. Bath 628 exposition of T. maritimum was highly efficient in inducing tenacibaculosis in juvenile 629 orbicular batfish. The low survival rate and the kinetics of infection support what is usually 630 observed for other fish species [16,20,63]. Infected fish, sampled at the pic of infection 631 (24hpi), show large skin lesions characteristic of tenacibaculosis together with high cortisol 632 concentration in their scales [32]. Cortisol mediates changes in individual energy balance (e.g. mobilisation of energy stores; immunity; cognition; visual acuity; and behaviour) [64,65]. 633 634 This initial cascade of physiological and behavioural changes enable the organism to cope 635 with acute stressors by mobilising adequate bodily functions, while concurrently inhibiting 636 non-essential functions (e.g. reproduction, digestion) [66]. Here increasing cortisol levels 637 reflect local stress response to unfavourable environment and is most likely involved in 638 triggering fish rapid immune response [67].

639 As expected fish immune response, especially innate immune system is strongly solicited at 640 24hpi. Infected fish show activation of the acute inflammatory response, mainly through 641 drivers genes including interleukin-8 (IL-8) [68], but also activation of pathogens recognition 642 receptors (PRRs), chemokines as well as antimicrobial related humoral effectors. For 643 instance, infection triggers co-expression of the cascade Toll-like receptor 5 (TLR5) and 644 Myeloid differentiation primary response protein (MyD88), as previously reported in bony 645 fish during bacterial infection [69]. However, the diversity of the fish immune actors along 646 with a relatively limited knowledge on specific effectors functions significantly hampered the 647 comprehensive understanding of the mechanisms involved in our non-model species. For 648 instance, in parallel of the TLR5, several other TLRs show reduced expression in infected 649 fish, including TLR2 type-1, TLR-8 and non-mammalian ('fish-specific') TLR21. Despite 650 previous effort toward assessing diversity of TLRs sequences, protein-specific function 651 remains poorly known in teleost [70]. Similar observations can be made for the Complement 652 system, specifically complement C3, a key component of the immune system involves in "complementing" antibodies for bacteria cells killing [71], for which several isoforms are 653 654 reported in the platax transcriptome. The different isoforms here have divergent patterns of 655 expression (both up or down-regulated in *infected*<sub>24h</sub> group), which support previously 656 observed difference in target surface binding specificities [72].

657 Innate immune response is generally tightly linked with cellular homeostasis regulation and 658 precedes adaptive immune response. The ability of the fish to maintain cellular homeostasis 659 during infection is of primary importance when facing infection and mechanisms include 660 redox, biological quality control (autophagy) as well as ion levels maintenance [73,74]; all 661 found affected in the platax. For instance, infected fish largely activates effectors of the iron 662 ion homeostasis. Iron, albeit largely present in the environment, is poorly accessible by 663 organisms and iron sequestration and maintenance is a major mechanisms developed by the 664 host to limit pathogens growth as well as to regulate macrophages cytokines production [75]. In parallel, *infected*<sub>24</sub> activate the (1->3)-beta-D-glucan binding process and contribute to the 665 666 body of literature revealing receptor capacities in fish and pathways conservation (through 667 PRRs, C-lectin and/or TLRs) across vertebrates and invertebrates [76,77]. Indeed, supplementation of  $\beta$ -glucan stimulates immune response in fish and confers higher resistance 668 669 of the host to virus and pathogens (probably by reducing bacteria adhesion through lectin 670 binding [78]); hence representing promising immunostimulant in aquaculture [77,79]. Effect 671 of β-glucan vary depending on the species, exposure time, source of glucan, organs and 672 markers monitored [76,80] and further studies will be needed to evaluate its potential at the 673 production scale. Nevertheless, β-glucan is also relevant in bridging inflammatory response 674 and activation / differentiation of T-cells in the adaptive immune response [81].

675 The adaptive immune response was also modulated at 24hpi and its fine-tuned orchestration 676 offers the opportunity to dissect preferential immune paths to fight against T. maritimum 677 infection. We identified several hallmarks of differentiated T-cells, indicative of the 678 specialisation of the adaptive immune response to T. maritimum infection. Among the main 679 driver genes of the response to infection in platax we noted a reduced expression of *foxp3* and 680 gata-3 in infected<sub>24h</sub>. Both transcription factors are important regulators of Naïve CD4+ naïve 681 T-cells fate encouraging differentiation to T-regulatory (Treg) [82] and T-helper 2 (Th2) cells 682 [56], respectively. Similarly, we show reduced expression of T-bet transcription factors, an 683 hallmark of Th1 cells [56]. Inversely, infected fish seem to activate Th17 cells differentiation 684 as suggested by simultaneous activation of signal transducer and activator of transcription 685 (STAT1-alpha/beta) and cytokine IL-17 [82]. The Th17 cells are mainly dedicated to control 686 bacterial and fungi entry [83]. Our results suggest and support previous a complex 687 orchestration of T-cells differentiation via antigens communication and associated cytokines 688 regulatory network in platax during T. maritimum infection [56,84]. However, we can't over 689 rule that changes in transcripts abundance might also be indicative of cells migration and 690 certainly, other approaches including cellular imaging [85] would clarify the presence and 691 refine the regulation of T-reg cells in fish.

The genomic bases of resistance in *P. orbicularis*. Despite profound activation of the immune system response, most of the fish failed at containing the infection. At 96hpi, less than 25% of the infected fish had survived the bacterial challenge. These surviving individuals did not display any skin lesion, suggesting they resisted the *T. maritimum* penetration and/or limited initial bacterial adhesion. Considering the high bacterial concentration in the tanks during infection and the severity of the mortality event, it is very unlikely that resistant fish might have totally escaped contact with the pathogen. Indeed, *T.* 

699 maritimum were present in resistant<sub>96h</sub> but not in control<sub>96h</sub> (see next section for details). Fish 700 were thus able to maintain the integrity of first barrier against pathogens; hence we 701 hypothesize that genes activity difference would reveal specific immune actors present and/or 702 efficient enough (timing of regulation) to inhibit pathogens multiplication and entry in 703 resistant fish [16]. We show that PRRs, specifically a C-type lectin receptor, was up-regulated 704 in resistant<sub>96h</sub>, together with a T-cell receptor and Low affinity immunoglobulin gamma Fc 705 receptor II-like while fibronectin coding genes was down-regulated. These genes-products are 706 known for binding, agglutinating and neutralizing bacteria [86] as well as triggering humoral 707 immune response [87] or providing extracellular structure for pathogens adhesion through 708 fibronectin-binding proteins [88,89]. Our experimental design did not allow segregating 709 between a basal difference in expression in *resistant*<sub>96h</sub> (genomic basis of resistance *per se*) or 710 if the difference at 96hpi is the result of a delayed adaptive immune response (timing of genes 711 expression). Nonetheless, in catfish, lectin expression allows differentiating resistant from 712 susceptible families against *Flavobacterium columnnare*, another gram-negative bacteria of 713 the Flavobacteriaceae family [90]. Further longitudinal studies monitoring genes expression 714 of resistant fish along the entire infection (and before the challenge) should prove useful in 715 identifying resistant-specific response to infection. Ideally, these studies should also 716 simultaneously look at different immune-specific organs and tissues compartments and 717 integrate genome-scale genetic variants (not limited to coding regions) to infer putative 718 genetic bases of resistance.

719 Microbiome dynamics and host-pathogens communication. At 24hpi, microbiome 720 community was dramatically affected with over-dominance of *T. maritimum*. Abundance of 721 *T. maritimum* was evident from metabarcoding data and contributes to significantly reduce 722 species richness in *infected*<sub>24h</sub> fish. We went further and compared expression of *T. maritimum in vivo* (during infection) compared to *in vitro*, with the hypothesis that key 724 drivers of pathogenicity would be solicited for thriving and breaking host' defense barriers.

There are at least two major challenges that T. maritimum needs to overcome to successfully 725 726 infect the host: Pathogens need 1) to compete (at the intra and interspecific levels) for 727 resources to metabolise from the local environment and 2) to resist to the host immune 728 responses and stressful conditions. During infection T. maritimum enhances its glucan 729 catabolic activity; while this might only reflect differences due to changes of the local 730 environment conditions (host mucus and skin) and/or resources availability, it also reveals 731 some major mechanisms explaining the success of *T. maritimum* to grow on fish skin. Among 732 the genes involved in glucan catabolic, we report several key components linking alternative 733 food and minerals supplies and putative virulence-related functions, such as several genes 734 involve in specifically degrading and up taking sialoglycan and ions, mainly iron [19]. 735 Sialidase activity explains *Capnocytophaga canimorsus* burst when in contact with host cells it allows the pathogen to mobilise sugar directly from host phagocytes [91]. Similarly, the 736 737 tonB coding gene, regularly reported as a gene relevant for pathogenicity, confers virulence to 738 Edwardsiella ictaluri by allowing to maintain growth in iron-depleted medium [92]. In 739 parallel, several stress resistance related genes were activated during experimental infection; 740 all also involved in the antibiotic catalytic functions. These genes include katA and katG, 741 coding for two catalases-peroxidases involved in resistance to reactive oxygen species (ROS), 742 by detoxifying exogenous  $H_2O_2$  produced by host macrophages as a defense mechanism [93]. 743 Obviously, the identification of virulence-related genes can not be limited to the ones 744 differentiating in vitro versus in vivo infectious status and other actors might be involved in 745 conferring T. maritimum its pathogenicity. For instance, siderophore coding genes are 746 constitutively expressed in vitro or during experimental infection. These genes are a 747 determining factor of host-pathogens and pathogens-pathogens interactions in the so-called 748 "race for iron" [94–96], which suggest that T. maritimum is highly efficient in mobilizing 749 iron, independently of the local environment.

750 Finally, we mostly explored here expression levels variation in the light of an exclusive 751 interplay between host and T. maritimum, which might be effective considering the over-752 dominance of T. maritimum in fish mucus. However, most of the infection systems report 753 several pathogen co-occurrences and the presence and/or activity of other opportunistic 754 pathogens might also play an important role in host' fate [15]. In infected fish, we found a 755 relatively large representation of those so-called "opportunistic" bacteria, known for their 756 pathogenicity in fish, including V. harveyi. V. harveyi is an ubiquitous bacteria and one of the 757 most common pathogens inducing major disease outbreaks in fish farming [59]. The 758 enrichment for Vibrio ASVs in resistant<sub>96h</sub> mucosal communities and the absence of evident 759 physiological associated changes (cortisol, mortality, skin integrity) in this group, suggest that 760 V. harveyi alone is not sufficient to induce mortality in platax under our specific experimental conditions and associated bacterial burden. 761

#### 762 Conclusions

763 Here we provide a comprehensive description of the host and T. maritimum interplay under 764 experimental infection conditions. Our results serve in deciphering the complex orchestration 765 of innate and immune response of the host but also propose some promising avenues of 766 research to limit the impact of tenacibaculosis in fish farming. By deploying an integrative 767 'omic' approach, we identified bacterial interaction as well as putative virulence-related genes 768 in T. maritimum and candidate-genes involved in fish resistance. Importantly however, the 769 detection of immune actors in fish and our comprehension of their regulation rely mainly on 770 the quality of the annotation and the knowledge we have of their activity in other species, mainly mammals model species. Consequently, further studies are now urgently needed to 771 772 properly apprehend genetic and genomic bases of response to infection and possible 773 resistance capacities in other non-model fish species.

Ethics approval. *In vivo* experiments compiles with all the sections of deliberation n° 200116 APF from the Assembly of French Polynesia regarding domestic or wild animals welfare,
issued in 'Journal Officiel de Polynésie française' on February 1<sup>st</sup>, 2001. In the absence of *adhoc* ethical Committees, we follow European Commission, DGXI [97] and ARRIVE [98]
guidelines.

779 **Consent for publication.** Not applicable

780 Data accessibility. Raw sequences are deposited in NCBI database under accession number
781 (PRJNA656561). Codes are made publicly available on a Github repository:
782 https://github.com/jleluyer/metatranscriptomics\_workflow

Authors' contributions. DS and JLL conceived the experiment. MC conducted fish husbandry and rearing. DS, MC, JLL and QS conducted the sampling. CB and CB conducted DNA and RNA extractions. QS conducted the cortisol levels analyses. PA assembled the *P*. *orbicularis* transcriptome. JLL conducted the RNAseq and MiSeq analyses. JP conducted the Nanopore sequencing. JLL and QC conducted the Nanopore analyses. All co-authors made substantial revisions to the manuscript.

789 **Competing interest**. The authors declare no competing interest

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