# 1 The landscape of coadaptation in Vibrio parahaemolyticus

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### 16 Abstract

17 *Vibrio parahaemolyticus* is a human gastrointestinal pathogen that thrives in warm brackish waters and is unusual amongst bacteria in having a population structure that approximates 18 19 panmixia. We take advantage of this structure to perform a genome-wide screen for 20 coadapted genetic elements. There are 93 groups of coadapted genome fragments were 21 identified, with total length of 1.5 Mb and involved 1,703 coding genes. The great majority of 22 interactions (85%) that we detect are between accessory genes, many involved in 23 carbohydrate transport and metabolism. The rarity of interactions involving the core genome 24 provides evidence for a plug and play-like architecture, in which elements have evolved to be 25 functional immediately on arrival in a new organism. 12% of interaction were observed 26 between core and accessory genome regions. The most complex interactions we identify 27 include hundreds of core genome SNPs as well as accessory genome elements, which are 28 organized into a hierarchical structure that implies progressive coadaptation. These 29 interactions involve genes encoding lateral flagella and cell wall biogenesis, implying that 30 several genetically distinct strategies have evolved for colonizing surfaces. The extensively 31 coadapted genetic elements identified in this study indicated that as in human relationships, 32 coadaptation involves progressively increasing levels of commitment, with the most involved 33 interactions becoming irreversible and presaging speciation. Our approach provides new 34 insight into how selection for phenotypic diversity shapes genetic variation within species. 35

#### 36 Introduction

The importance of coadaptation to evolution was recognized by Darwin in the 6<sup>th</sup> edition of Origin of Species, where he wrote: "In order that an animal should acquire some structure specially and largely developed, it is almost indispensable that several other parts should be modified and coadapted" (1). As Darwin's argument implies, complex phenotypic innovation

require adaptation at multiple genes and it is inevitable that some of the changes involved
will be costly on the original genetic background, implying epistasis - i.e. non-additive fitness
interactions - between adaptive loci.

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45 The consequences of epistasis for the evolution of phenotypic diversity depends on the 46 transmission genetics and the population structure of the species in question. For example, in 47 outbreeding animals mating mixes up variation each generation, with the result that genes only increase in frequency if they have high average fitness across genetic backgrounds (2). 48 49 Consequently, extensive linkage disequilibrium due to natural selection is rare (3) and it is 50 difficult to maintain dissimilar genetic strategies concurrently in the same population unless 51 the strategies are encoded by a small number of loci. This means that the coadaptation 52 necessary for extensive phenotypic diversification can only take place when facilitated by 53 barriers to gene flow, such as geographical separation, mate choice or the suppression of 54 recombination for example by inversion polymorphisms (4, 5). This feature also makes it 55 difficult to study the process of complex coadaptation without temporally sampled genetic 56 data, which remains rare despite the advent of technology for sequencing ancient DNA.

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In bacterial populations, mutations do not need to have high average fitness across all genetic 58 59 backgrounds to reach a substantial frequency in the population. For example, Vibrio 60 parahaemolyticus lives in coastal waters and causes gastroenteritis in humans and 61 economically devastating diseases in farmed shrimps. It is capable of replicating in less than 62 10 minutes in appropriate conditions (6), while the doubling time in the wild of the related 63 bacteria Vibrio cholerae has been estimated as slightly over an hour (7). Approximately 64 0.017% of the genome recombines each year (8), implying that there are approximately 50 65 million generations on average between recombination events at a given genetic locus. As a

result, mutations that are beneficial only on specific backgrounds have a chance to rise to high frequency on those backgrounds even if they are harmful on others. Epistatic interactions that involve only small selective coefficients *s* (for example  $s = 1.0 \times 10^{-4}$ ) can create an imprint on the genome in the form of strong linkage disequilibrium (9). These arguments imply that extensive complex coadaptation can potentially accumulate within a single population.

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73 Although recombination happens slowly on the timescale of bacterial generations, the Asian 74 population of V. parahaemolyticus has had a large effective population size for at least the last 15,000 years, or approximately 130 million bacterial generations, over which time 75 76 recombination has been extensive enough to have almost completely scrambled genetic 77 variation (10). As a result, the population is unusual amongst bacteria in that there is 78 approximate linkage equilibrium between most loci greater than 3 kb apart on the 79 chromosome (10). This feature increases the power of tests for interaction based on 80 identifying non-random associations, which relies on identifying the same combination of 81 alleles on independent genetic backgrounds and can therefore be confounded by clonal or 82 population structure unless this is appropriately controlled for.

83

We perform a systematic screen for coadaptation in the core and accessory genome, based on a larger sample of genomes than Cui et al. 2015 (11), here for the first time performing a screen for the co-occurrence of accessory genome elements. We have taken a conservative approach to identifying statistical associations, rigorously filtering the set of genomes used in our discovery dataset to eliminate any hint of population structure. We performed more than 14 billion Fisher exact tests between variants in the core and accessory genomes, using a cut-

90 off of  $P < 10^{-10}$  with the aim of assembling a comprehensive list of common genetic 91 variants that have strong linkage disequilibrium between them due to fitness interactions. 92

93 We find that the great majority of interactions involve small numbers of accessory genome 94 elements, with surprisingly little involvement of the core genome. However, we also identify 95 three complex multi-locus interactions, in which core and accessory genomes have evolved in 96 parallel to create coadapted gene complexes with distinct strategies. We demonstrate the 97 value of hierarchical clustering in characterizing these interactions. Our results demonstrate 98 that V. parahaemolyticus have progressively modified their own fitness landscape through 99 coadaptation and demonstrate the fundamental importance of lateral flagella variation to their 100 ecology. Taken together, our results provide a starting point for systematically investigating 101 fitness landscapes in natural populations while highlighting several methodological 102 challenges.

103

#### 104 **Results**

#### 105 **Detection and characterization of interaction groups**

106 To avoid false positives due to population structure, we restricted our initial analysis to the 107 strains from the Asia population, VppAsia, within our global collection of 1,103 isolates 108 (Table S1) and iteratively removed isolates until there was no sign of clonal structure 109 (Methods), leading to a discovery dataset of 198 strains (Figure 1a, Figure S1). We 110 performed a Fisher exact test of associations between all pairwise combinations of 151,957 111 SNP variants within the core and 14,486 accessory genome elements. As has been observed 112 previously (11), most of strong associations occurred between sites within 3 kb on the 113 chromosome (Figure 1b). In order to exclude associations that arise only due to physical 114 linkage, we excluded all sets of associations that spanned less than 3 kb, including between

115 accessory genome elements. This left us with 452,849 interactions with  $P < 10^{-10}$ , which grouped into 90 networks of associated elements, all of which involved at least one 116 117 accessory-genome element, with 8 also including core genome SNPs and 38 of which 118 included multiple genome regions. In total these networks included 1,936 SNPs in 110 core 119 genes and 1,593 accessory genome elements (Table 1, Table S2 and Table S3). Interacting 120 SNPs were substantially enriched for non-synonymous variants, which is consistent with 121 natural selection being the force generating the linkage disequilibrium we detected. 122 123 The largest network (network 1) accounted for the majority of interacting SNPs as well as a

significant fraction of accessory genome elements (Table 1). Hierarchical clustering of the
interacting elements in this network based on *P* values (Figure 1c) revealed a complex pattern
of interactions but with differentiated sub-networks and we defined three large interaction
groups (IGs), IG1, IG2 and IG3 within it, placing remaining interactions within IG4. IG4-93
are displayed in Figure 2, 3, Table S3 and Figure S2, while IG1-3 are shown separately in
Figures 4, 5 and Table S2.

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131 We compared our results for core genome interactions with those obtained by SuperDCA, a method that uses Direct Coupling Analysis to identify causal interactions (12, 13), using the 132 133 default settings for the algorithm. To make the results as directly comparable as possible we 134 used the same 198 isolates that were used for the Fisher exact test. The most important 135 discrepancy is that although IG1 involves perfect associations, with P values as low as  $1.4 \times$ 136  $10^{-30}$ , the coupling strengths are lower than for the other groups we identified and none 137 appear amongst the top 5,000 couplings. This discrepancy is due the large number of SNPs 138 involved with similar association patterns, which means that coupling values are distributed 139 between them (Figure 1d, Figure S3). Excluding IG1 SNPs, there is a strong correlation

140	between SuperDCA coupling strengths and Fisher exact test $P$ values (Figure 1e). At a					
141	stringent cutoff of 10 <sup>-2.2</sup> , SuperDCA identifies the same multi-locus interactions as Fisher					
142	exact test does at $P < 10^{-10}$ , with a few SNPs excluded (Figure 1f). The significance					
143	thresholds for both the Fisher exact test and SuperDCA could be relaxed to identify a					
144	substantially larger number of true-positive hits, at the likely expense of some false ones, but					
145	we do not investigate these associations further here. We also compared our results with					
146	those obtained by SpydrPick, a model-free method based on mutual information (MI) (14).					
147	The Fisher exact test $P$ value is almost perfectly correlated with the MI statistic used by					
148	SpydrPick for this data (Figure 1e).					
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150	For IG1-4, COG classes M and N, cell wall biosynthesis and cell motility, are substantially					
151	overrepresented, relative to their overall frequency in the genome (Figure 2c, Fisher exact					
152	test, $P < 0.01$ ). Amongst the other interaction groups, class G, encoding carbohydrate					
153	transport and metabolism are substantially overrepresented (Fisher exact test, $P < 0.01$ ),					
154	particularly amongst groups involving incompatibilities. There are also differences in GC					
155	content between accessory genes in IGs and others (Figure 2c), with IGs having higher mean					
156	values, especially in compatibility IGs.					
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158	Structure of variation within interaction groups					

For each interaction group, we investigated how genetic variation was structured within the *V. parahaemolyticus* population using a larger "non-redundant" set of 469 strains, which includes isolates from all four of the populations identified in (8), but excludes closely related isolates, differing at less than 2,000 SNPs. We performed hierarchical clustering of the strains based on the interaction group variants (Figure 3, 4, 5, S2). We also used the criterion used by ARACNE and SpydrPick (14, 15) to remove putatively non-causal connections between

pairs of loci that were mutually connected by statistically more significant connections tothird loci than they are to each other.

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168 The most common type of interaction group is a single accessory genome region of between 169 3 kb (IG53) and 57 kb (IG41), of which there are 52 (Figure 2). For example, IG5 consists of 170 10 genes in a single block. 9 of the genes code for various functions related to carbohydrate metabolism and transport while the 10<sup>th</sup> is a transcriptional regulator (Figure 3 and Table S3). 171 172 Four strains have 9 out of the 10 genes but otherwise the genes are either all present or all 173 absent in every strain. Interestingly, there appears to be a difference in frequency between 174 VppAsia isolates and others, with the island present in 52% of VppAsia strains and 90% of 175 others.

176

Genome islands are often associated with transmission mechanisms such as phage and 177 178 plasmids (16). In our data, one example is IG17 which contains 4 genes annotated as being 179 phage related and a further 19 hypothetical proteins (Figure 3). In the reference strain, 16 of the genes occur in a single block VP1563-VP1586, while 7 genes are present elsewhere in the 180 181 genome. 56% of the 469 strains had none of the genes, while 36% had more than 12 of them 182 and 8% had between 1 and 5, which presumably represent remnants of an old phage 183 infection. Only one gene (VP1563) in IG17 was found in appreciable frequency in strains that 184 had none of the other genes. This gene might represent cargo of the phage infection that is 185 able to persist for extended periods in the absence of infection due to a useful biological 186 function of its own.

187

188 Another common interaction is incompatibility between different accessory genome

189 elements, which is found in total 27 of the interaction groups (Figure 2). For example, all of

190 the 469 strains either have the gene *yniC*, which is annotated as being a phosphorylated 191 carbohydrates phosphatase, or at least 4 out of a set of 5 genes VP0363-VP0367 that includes a phosphotransferase and a dehydrogenase (IG6, Figure 3) in the same genome location. Only 192 193 one strain has both sets of genes. This interaction also involves a core genome SNP, in the 194 adjacent gene VP0368, which is annotated as being a mannitol repressor protein. Another 195 pattern is found in IG45 (Figure 3), where there are three genes that are mutually 196 incompatible in our data, and 12% strains have none of the three genes. Only one of the three 197 genes is annotated.

198

## 199 More detailed characterization of IG1-3

200 For IG1, the clustering revealed that strains fall into two cleanly differentiated groups (Figure 201 4a). Amongst the 469 non-redundant set, there are 43 strains from VppAsia and 1 strain from 202 VppUS2 in the minor group that we call eco-group 1.2, or EG1.2, with the remaining 425 203 belong to EG1.1. Chromosome painting (Figure 4b) shows evidence for sharp peaks of 204 differentiation of EG1.2 strains around the IG1 loci but with little evidence for differentiation 205 elsewhere (see the expected value revealed by vertical dot line). This pattern is qualitatively 206 distinct either for that observed between geographically differentiated populations or for 207 clonally related strains, which show higher-than-expected copying throughout the genome 208 but without sharp peaks (Figure S4). The composition of accessory genes also differs 209 markedly between eco-groups, in particular because EG1.2 strains has a particularly complex 210 polymorphic region (Ref2-09, 82 kb, Figure 4b) with substantial variation in gene content 211 between strains, which in total constitutes for a large fraction of the gene content (57 genes) 212 not shared with EG1.1 strains. Based on the annotation of these genes (Table S2), this region might encode a type II secretion system. 213

214

215 After removing putatively non-causal connections using the ARACNE criteria (15), there are 216 still too many connections to make causal inferences for IG1 (Table S4), with multiple 217 different genome regions retaining connections to 11 different genome blocks (Figure 4a, 218 Table S2), reflecting the large number of sites in perfect or near-perfect linkage 219 disequilibrium with each other. However, hierarchical clustering based on IG1 SNPs helps to 220 identify coherent patterns amongst interacting SNPs. We split the genetic variants into three 221 tiers, shown in red, blue and green. Tier 1 variants distinguish cleanly, or nearly cleanly 222 between EG1.1 and EG1.2 strains. Tier 2 variants are similar but with more discrepancies, 223 while Tier 3 variants are typically fixed or nearly fixed within one eco-group and 224 polymorphic within the other. Each of the tiers includes multiple core and accessory genome 225 regions. Some regions are represented in only one tier, while others contain two or more. For 226 example, the lateral flagellar gene cluster (Ref1-23, VPA1538-VPA1557, Figure 4c) contains 227 383 Tier 1 SNPs, 24 from Tier 2 and 47 from Tier 3, however the extent of the region 228 spanned by Tier 1 SNPs is smaller, so that for example *flhA* and *flhB*, at the center of the gene 229 cluster only contain Tier 3 SNPs, while *lafK* and *lafA* to the left and *filS* to the right contain 230 multiple fixed differences between eco-groups. In other regions of this genome cluster, Tier 1 231 SNPs are flanked by those from other tiers.

232

IG2 includes 548 SNPs and 130 accessory genes which located in 26 regions (Figure 5a),

234 including a *LuxR* family transcriptional regulator (Ref1-11), T6SS (type VI secretion system,

Ref1-05), and cellulose synthesis related genes (Ref2-02) that had been identified in our

previous research (11). Here with increased statistical power with more genome sequences,

237 we found additional interacting loci. Tier 1 contains the T6SS and the cellulose synthesis

related genes, reflecting their strong incompatibility, with nearly all EG2.1 strains containing

a T6SS and all those in EG2.2 containing genes annotated as part of the biosynthesis cluster.

There are also SNPs in a hypothetical protein, VPA1081 (Ref1-10) that have a very similar
distribution amongst strains to T6SS presence/absence, suggesting strong functional linkage.
Tier 2 contains mostly SNPs in core genome, which are located at *LuxR* family
transcriptional regulator and uridine phosphorylase encoding genes (Ref1-10). Tier 3 contains
85% of all variants in IG2, which encoded genes that functional related with biogenesis of
elements in cell membrane, carbohydrate transport and metabolism, and transcriptional
regulators.

248 Although the ARACNE filtering left too many interactions to be immediately useful in causal 249 inference, it did highlight one additional gene as potentially being particularly important. The 250 single accessory gene in Tier2, group\_3560 (Ref2-10), codes for a polysaccharide 251 biosynthesis/export protein and retains interactions with 9 genome blocks after filtering, 3 252 more than any other IG2 gene (Table S2). The large number of causal interactions inferred 253 for this gene reflects its strong association with a sub-cluster of strains within EG2.2, labelled 254 as EG2.2b (Figure 4a), which is stronger than for any other genetic element, including the 255 SNPs in the LuxR transcriptional regulator genes. The remaining strains EG2.2a include all 256 EG1.2 strains and others. These results suggest that amongst strains lacking the T6SS, there are three distinct strategies, one of which is determined by presence or absence of 257 258 group\_3560, the second is determined by the large number of SNPs and genes in IG1.2 259 discussed above, while the third is too rare in our sample to be categorized, even 260 provisionally, but seems to be associated with presence of a handful of the genes in blocks 261 Ref1-02 and Ref1-08.

262

In part due to this diversity of strategies, the overall strength of the associations in the IG2
Tiers we have defined are generally weaker than those for IG1: while there are a handful of

core genome regions where EG2.1 regions are differentiated (Figure 5a), none of these is asclear-cut as the differentiated regions of IG1.

267

268 The loci of IG3 only covered eight genome regions, which contained 75 SNPs and 65 accessory genes, most of which are found in a single genome regions which includes the core 269 270 gene TonB3 (VP0163, Ref1-01) (17) (Figure 5b). Clustering based on variants of IG3 271 revealed a stair-like structure of variation. Tier 1 variants differentiate EG3.1 from other eco-272 groups and include multiple SNPs in TonB3 and in the lateral flagellar gene cluster (Ref1-273 04). Tiers 2 and 3 variants differentiate between EG3.2, EG3.3 and EG3.4, which are 274 progressively more different from EG3.1, both in terms of accessory genome complement 275 and core genome SNPs. Many of the accessory genes specific to EG3.4 are annotated to have 276 functions associated with cell wall biogenesis (Ref2-01). Once again, a large number of 277 interactions were left after ARACNE filtering (Table S2, S4), frustrating explicit causal 278 inference using this approach.

279

### 280 Phenotypic differences between EG1.1 and EG1.2

We performed a preliminary analysis of the phenotypic differences underlying EG1 by determining the motility, growth rate, and biofilm formation ability (Figure 6) of in 7 EG1.1 and 4 EG1.2 strains on laboratory media. We failed to observe differences in swimming or swarming capability under the conditions tested but EG1.2 strains revealed significantly higher biofilm formation ability and faster growth rate than EG1.1 strains (Figure 6b and 6c), and they revealed rough colony morphology, also an indication of increased biofilm formation, under low salinity (1% NaCl) culture condition (Figure 6c).

288

289 There are in total 60 EG1.2 strains in the global collection of 1103 V. parahaemolyticus 290 strains. All but one, a VppUS2 isolate, is from the VppAsia population, with the majority (n= 48, 80%) in this study coming from routine surveillance on food related environmental 291 292 samples, including fish, shellfish, and water used for aquaculture. The strains revealed no 293 clear geographical clustering pattern in China, as they can be isolated from all six provinces 294 that under surveillance. Notably, only 4 EG1.2 strains were isolated from clinical samples, 295 including wound and stool, representing a lower proportion than for EG1.1 isolates 296 (453/1043), including if the two pandemic lineages are removed (268/798), suggesting this 297 eco-group has low virulence potential in humans. 298

# 299 Discussion

300 Bacterial traits such as pathogenicity, host-specificity and antimicrobial resistance naturally 301 attract human attention but less obvious or even cryptic traits might be more important in 302 determining the underlying structure of microbial populations. Studies of coadaptation based 303 on genome sequencing of thousands of isolates have the potential to provide new insight into 304 the ecological forces shaping natural diversity, and how that variation is assembled by 305 individual strains to overcome the manifold challenges involved in colonizing specific niches, 306 such as the human gastrointestinal tract. In other words, these studies provide a unique 307 opportunity to see the world from the point of view of a bacterium.

308

We performed a genome wide scan for coadaptation in *V. parahaemolyticus*, performing pairwise tests for interactions amongst genetic variants and then clustered the significant pairwise interactions into 93 interaction groups. Our analysis demonstrated that genome wide epistasis scans can be used successfully to identify diverse interactions involving both core and accessory genomes but also highlighted unsolved methodological challenges.

314

315	Firstly, pairwise tests should, at least in principal, have reduced statistical power compared to					
316	methods that analyze all of the data at once, such as Direct Coupling Analysis (DCA) (12).					
317	However, while there was a strong correlation between DCA and our results for core-genome					
318	interactions, DCA failed to identify the clearest, most extensive interaction in our dataset,					
319	namely IG1. DCA was designed to identify coupling interactions that take place during					
320	protein folding and implicitly entails that pairwise interaction between a given pair of sites					
321	make it less likely that other sites will interact with either of them. For many types of					
322	interaction, a prior that makes the opposite assumption seems more appropriate, for example					
323	because master regulation loci are likely to interact with many different sites. Thus, in order					
324	to develop statistical tests that exploit the full power of genomic data, new types of statistical					
325	test that search for a more diverse range of interactions would need to be developed.					
326						
327	Second, distinguishing direct associations – either through gene function or ecology – from					
328	those that arise due to mutual correlation with other interacting genes, is a substantial, and					
329	largely unaddressed challenge. For the complex interaction groups in our data, the criteria					
330	used by ARACNE (15) to remove interactions still left far too many interactions to be					
331	interpreted usefully as being causal. We found that hierarchical clustering organized the					
332	interactions in a manner that allowed informal interpretation but once again new statistical					
333	methodology is needed to facilitate detailed dissection of associations.					
334						
335	Notwithstanding the unresolved challenges, our results highlight the central role of lateral					
336	motility in structuring ecologically significant variation within the species. We also find					

337 evidence that interactions move through progressive stages, analogous to differing degrees of

commitment within human relationships, namely casual, going steady, getting married and
moving out together (Figure 7).

340

### 341 Most interactions between core and accessory genomes are casual

A recent debate about whether the accessory genome evolves neutrally (18-20) highlighted how little we know about the functional importance of much of the DNA in bacterial chromosomes. Using the same statistical threshold to assess significance, our interaction screen identifies many more examples of coadaptation between different accessory genome elements than of interactions between the core and accessory genomes or within the core genome, implying that natural selection has a central role in determining accessory genome composition.

349

Unsurprisingly, given the extensive literature highlighting the importance of genomic islands to functional diversity of bacteria (16), the most common form of adaptation detected by our screen is the coinheritance of accessory genome elements located in the same region of the genome. Based on a minimum size threshold of 3 kb, we find 52 (56%) such interactions, the largest of which is 57 kb (Table S3).

355

Previous approaches to detecting genome islands emphasize traits associated with horizontal transmission, for example based on differences in GC content with the core genome, the presence of phage-related genes or other markers of frequent horizontal transfer (21). Our approach, based simply on co-occurrence identifies a wider range of coinherited units and suggests that many islands have functions related to carbohydrate metabolism.

361

Amongst interactions not involving physical linkage, the most common is incompatibility of different accessory genome elements, representing 29% (27/93) of our IGs. For example, two different versions of phosphorous pathway, one involving one gene, the other involving 5 (IG6, Figure 3).

366

We propose that the rarity of interactions between core and accessory genome in our scan reflects the evolution of "plug and play"-like architecture for frequently transferred genetic elements. Accessory genome elements are more likely to establish themselves in new host genomes if they are functional immediately on arrival in many genetic backgrounds.
Furthermore, from the point of view of the host bacteria, acquisition of essential functions in new environments is more likely if diverse accessory genome elements in the gene pool are immediately functional on arrival in the genome.

374

# 375 Sometimes it makes sense to go steady

376 When an accessory genome element with an important protein coding function arrives in a 377 new genome, it is likely that some optimization of gene regulation will be possible, 378 coordinating the expression of the gene with others in the genome. We found 11 different 379 interaction groups involving core and accessory genome regions. One simple example 380 included a regulatory gene VP0368 and an accessory genome element (IG6, Figure 3). In this 381 example, it is feasible for the core genome SNP and the associated accessory element to be 382 transferred together between strains in a single recombination event. Where coadaptation 383 involves two or more separate genome regions, this makes assembling fit combinations more 384 difficult and is likely to slow down the rate at which strains gain and lose the accessory genome elements involved. This higher degree of fidelity in turn makes further coadaptation 385 386 at additional genes more likely.

387

388	IG2, is an example of a complex coadaptation involving multiple core and accessory genome				
389	regions. A large majority of strains in our dataset (439/469) either carry a cluster of genes				
390	encoding a T6SS, or a cluster encoding cellulose biosynthesis genes, but few strains have				
391	genes from both clusters (Figure 5a). Cells uses the T6SS to inject toxins into nearby bacteria				
392	(22) and cellulose production to coat themselves in a protective layer (23). Incompatibility				
393	might have a functional basis, for example because cellulose production prevents the T6SS				
394	functioning efficiently, or an ecological one, for example because cells that attack others do				
395	not need to defend themselves. The evolution of dissimilar strategies has led to differentiation				
396	in gene/SNP frequencies in a large number of regions, including the variants in IG1 and IG3,				
397	that presumably also represent functional or ecological coadaptations to these two distinct				
398	strategies.				
399					
400	Marriage changes everything				
401	IG1 differs from the other interaction groups in our scan in both the number of associated				
402	regions and the strength of the associations. The interaction group include 454 SNPs in the 19				
403	gene 18 kb lateral flagellar gene cluster (VPA1538-1557, Figure 4c), a further 917 core				

404 genome SNPs in 62 genes and 152 accessory genes in 35 clusters. Strains cluster cleanly into

405 two groups, the more common group being designated EG1.1 and the rarer EG1.2.

406 Comparison with closely related species shows that the polymorphisms distinguishing EG1.1

407 and EG1.2 have evolved *de novo* within *V. parahaemolyticus*, with the EG1.2 variant

408 undergoing faster evolution (Figure S5).

409

410 Many of the accessory genes and SNPs are in perfect or near perfect disequilibrium with

411 SNPs in the flagellar gene cluster. These include loci encoding flagellar genes, T2SS and

other membrane transport elements. There are also 285 loci (27%, Tier 3) in weaker
disequilibrium, typically because they are polymorphic in one of the eco-groups. Many of
variants are likely to represent more recently evolved coadaptation. Some of these genes are
also associated with flagella or the T2SS related function but also encompass a broader range
of functional categories, including cell division and amino acid transport and metabolism
(Table S2).

418

Our laboratory phenotype experiments (Figure 6) suggest that biofilm formation is likely to be a key trait underlying the different ecological strategies of EG1.1 and EG1.2, but the variation in phenotypic response at different salinity levels and the absence of measurable difference in swarming behavior, despite the large genetic difference within the lateral flagella genes, highlight some of the manifold difficulties of interpreting natural variation using phenotypes measured under laboratory conditions.

425

Despite the extensive differences that have accumulated between EG1.1 and EG1.2, there is no evidence of restricted gene flow in most of the genome (Figure 4b), and even within the flagellar gene cluster strongly differentiated regions are separated by a weakly differentiated one (Figure 4c), implying that the coadaptation is being maintained by selection in the face of frequent recombination. Initial divergence in flagellar function is likely to have led to ecological differentiation, which led to bacteria having different nutritional inputs or requirements and a broadening of the functional categories undergoing divergent selection.

How can the difference between IG1 and the other interaction groups in both the number of
associations and their strength be explained? *V. parahaemolyticus* is ubiquitous in shellfish in
warm coastal waters, within which it occurs at densities of around 1,000 cells per gram, so a

437 back of the envelope calculation suggests there are likely to be substantially more than  $10^{15}$ 438 bacteria in the VppAsia population. The species also has a high estimated effective 439 population size (10, 11) and has strong codon bias, which is often argued to be evidence that 440 even tiny selective coefficients can drive adaptation (24). Furthermore, recombination only 441 breaks up linkage disequilibrium between loci slowly. Therefore, weaker and more variable 442 patterns of association within IG2 and IG3 than in IG1 is unlikely to be a simple consequence 443 of the ineffectiveness of selection and is instead likely to reflect complexity in the fitness 444 landscape.

445

446 Strains gain flexibility by being able to switch between or modulate genomically encoded 447 strategies by homologous recombination. For example, expression of the T6SS might be 448 essential for survival in crowded habitats but detrimental in sparsely populated ones. 449 Recombinants between EG2.1 and EG2.2 at IG2 loci might represent transient adaptation of 450 strains to their immediate environment or long-term adaptation of intermediate strategies. 451 Furthermore, the phenotypic consequences of IG2 variants can depend on other loci in the 452 genome, such as IG1 variants, which is likely to reduce the strength of associations within 453 IG2. Crucially, the evolution of promiscuity is self-reinforcing because the presence of strains using multiple strategies in the population also favors the presence of accessory genes and 454 455 core gene haplotypes that have high or intermediate fitness on multiple backgrounds. 456

457 On the other hand, an absence of intermediate genotypes in the population can favor the 458 evolution of fastidiousness, with particular accessory genes and haplotypes becoming 459 essential components of some genetic backgrounds but deleterious on others. A likely 460 scenario is that differences between IG1.1 and IG1.2 at a lateral flagellar gene made 461 recombinants between the two versions of the gene inviable and also created divergent

462 selection at a handful of other loci that was largely independent of the external environment 463 or of interactions with other genes. The evolution of fastidiousness, like the evolution of 464 promiscuity, can be self-reinforcing, and might have led to progressive increase in the 465 differentiation of EG1.2 strains from EG1.1 until the coadaptation of IG1.2 variants to each 466 other and of IG1.1 variants to each other became more-or-less irreversible, like marriage in 467 England prior to the reign of King Henry VIII.

468

# 469 **Coadapted gene complexes as speciation triggers**

470 Running the tape forward, it is easy to envisage the number of coadapted regions of the

471 genome within IG1 undergoing progressive enlargement, until the entire genome becomes

472 differentiated. As coadapted regions become more numerous, the proportion of

473 recombination events between eco-groups that are maladaptive will increase, which might

474 prompt the evolution of mechanistic barriers to genetic exchange between them.

475

476 Mechanisms by which new bacterial species arise are frequently discussed in the literature 477 (25-27) but there is currently little data on how the process unfolds. IG1 is of interest both as 478 an example of an intermediate stage of divergence, prior to speciation, and because it 479 suggests that substantial adaptive divergence between gene pools can precede any barriers to 480 genetic exchange, other than natural selection at the loci involved. This – unique to our 481 knowledge – example is exciting because the distinct signature of selection should make it 482 possible to dissect the genetic basis of coadaptation in unprecedented detail. Broadly similar patterns of differentiation including "genomic islands of speciation" have been observed for 483 484 example between ecomorphs of cichlid fishes (28), but the evolution of ecomorphs has been facilitated by fish preferring to mate with similar individuals, which will have also inevitably 485 486 lead to some level of differentiation at neutral loci throughout the genome.

487

#### 488 Conclusions

489 In *V. parahaemolyticus*, it has been possible to distinguish clearly between adaptive

- 490 processes, reflecting fitness interactions between genes and neutral ones, reflecting clonal and
- 491 population structure. This has allowed us to provide a description of the landscape of
- 492 coadaptation, involving multiple simple interactions and a small number of complex ones.
- 493 We have focused on interactions that generate strong linkage disequilibrium, but weaker and
- 494 more complex polygenic ones also have the potential to provide biological insight.

495

496 Most bacteria have population structure that deviates more markedly from panmixia (10). In 497 some species this is likely due to smaller effective population sizes, lower recombination 498 rates or mechanistic barriers to genetic exchange between strains. However, coadaptation can 499 itself generate genome-wide linkage disequilibrium that might be difficult to distinguish from 500 clonal or population structure. Because the linkage disequilibrium associated with IG1 is 501 highly localized within the genome, it can, on careful inspection be clearly be attributed to 502 selection, but in other bacteria patterns are likely to be less straightforward, making it 503 challenging to understand to whether adaptive processes drive population structure, or vice 504 versa. Natural selection is the jewel of evolution but distinguishing it from other processes 505 requires in depth understanding of the relevant biology in addition to suitable data and 506 statistical methods.

507

508 Materials and Methods

#### 509 **Genomes used in this work**

510 Totally 1,103 global *V. parahaemolyticus* genomes were used in this work (Table S1), which
511 also were analyzed in our other studies (8, 10). To reduce clonal signals, we firstly made a

512 "non-redundant" dataset of 469 strains, in which no sequence differed by less than 2,000 513 SNPs in the core genome. They were attributed to 4 populations, VppAsia (383 strains), 514 VppX (43), VppUS1 (18) and VppUS2 (21) based on fineSTRUCTURE result (29). We then 515 focused on VppAsia which has more strains, to generate a genome dataset in which strains 516 represent a freely recombining population. We selected 386 genomes from 469 non-517 redundant genome dataset, including all the 383 VppAsia genomes and 3 outgroup genomes 518 which were randomly selected from VppX, VppUS1 and VppUS2 population, respectively. 519 These 386 genomes were used in Chromosome painting and fineSTRUCTURE analysis (29) 520 as previously described (11). Initial fineSTRUCTURE result revealed multiple clonal signals 521 still exist, thus we selected one representative genome from each clone, combined them with 522 the remaining genomes and repeated the process. After 14 iterations, we got a final dataset of 523 201 genomes with no trace of clonal signals, involving 198 VppAsia genomes that were used 524 in further analysis. 525 526 The copy probability value of each strain at each SNP was generated by Chromosome

527 painting with "-b" option, and the average copying probability value of a given strain group

528 (e.g. EG1.2) at each SNP was used in Figure 4, 5 and Figure S4.

529

### 530 Variation detection, annotation and phylogeny

531 We re-called SNPs for 198 VppAsia genomes by aligning the assembly against reference

532 genome (RIMD 2210633) using MUMmer (30) as previous described (11). Totally 565,466

533 bi-allelic SNPs were identified and 151,957 bi-allelic SNPs with minor allele frequency > 2%

534 were used in coadaptation detection. We re-annotated all the assemblies using Prokka (31),

and the annotated results were used in Roray (32) to identify the pan-genome and gene

536 presence/absence, totally 41,052 pan-genes were found and 14,486 accessory genes (present

537	1n > 2% and $< 98%$ strains) were used in coadaptation detection. The pan-gene protein
538	sequences of Roary were used to BLAST (BLASTP) against COG and KEGG database to get
539	further annotation.

. .

540

541 The Neighbour-joining trees were built by using the TreeBest software

542 (http://treesoft.sourceforge.net/treebest.shtml) based on sequences of concatenated SNPs, and

543 were visualized by using online tool iTOL (33).

0004

544

# 545 **Detection of coadapted loci**

Totally 151,957 bi-allelic SNPs and 14,486 accessory genes identified from 198 independent 546 547 VppAsia genomes were used in coadaptation detection by three methods. Firstly we used 548 Fisher exact test to detect the linkage disequilibrium of each SNP-SNP, SNP-accessory gene, 549 and accessory gene-gene pair. Presence or absence of an accessory gene was considered as its 550 two alleles. Each variant locus (SNP or accessory gene) has two alleles, major and minor, of 551 which major represents the allele shared by majority of isolates. For each pair of loci X and Y, the number of combinations between Xmajor-Ymajor, Xmajor-Yminor, Xminor-Ymajor, Xminor-Yminor 552 553 were separately counted and used in the contingency table to calculate the Fisher exact test P 554 value. It took 3 days to finish all the coadaptation detection in a computer cluster using 21 555 cores and 2 Gb memory. We also used SuperDCA (13) and SpydrPick (14) to detect the 556 coadaptation between SNPs, using the same subset of 198 strains to make the analysis as 557 comparable as possible. SuperDCA is based on direct coupling analysis (DCA) model (12) 558 and has a much faster calculation speed compared with previous DCA methods. However, it 559 still took 25 days to finish the detection by using 32 cores and 86 Gb memory. SpydrPick took one hour to finish the calculation by using 32 cores and 1 Gb memory. 560

561

562 We removed coadaptation pairs with distance less than 3 kb to minimize the influence of 563 physical linkage. All identified SNPs in this study were located in the core genome, therefore 564 the physical distance between SNP pairs can be calculated according to their position in the 565 reference genome. To define the distance between accessory genes, and between SNP and 566 accessory gene, we mapped the sequence of accessory genes against available 19 complete 567 maps of the V. parahaemolyticus genomes to acquire their corresponding position, and then 568 the gene that failed to be found in complete reference genomes were then mapped to the draft 569 genomes. If the accessory genes pair or SNP- accessory gene pair was found located in a 570 same chromosome or same contig of a draft genome, then the distance between paired 571 variants could be counted according to their position in the chromosome or contig. The 572 distance between paired variants that located in different chromosomes or contigs was 573 counted as larger than 3 kb and such pairs were kept in further analysis. Circos (34) was used 574 to visualize the networks of coadaptation SNPs in Figure 1f and Figure S3.

575

#### 576 Lateral flagellar gene cluster region in Vibrio genus

577 To identify the homologous sequences of V. parahaemoluticus lateral flagellar gene cluster 578 (VPA1538-1557) in the Vibrio genus, we downloaded all available Vibrio genome sequences 579 in NCBI, then aligned the nucleotide sequence of lateral flagellar gene cluster of V. 580 parahaemolyticus (NC\_004605 1639906-1657888) against Vibrio genome dataset 581 (excluding V. parahaemolyticus) by using BLASTN. Totally 46 Vibrio genomes revealed 582 above than 60% coverage on lateral flagella region in V. parahaemolyticus genome and was 583 used in phylogeny rebuilding. We also included three randomly selected strains from EG1.1 584 and EG1.2 respectively for comparison. In total 3,000 SNPs were identified in this region and 585 were used for NJ tree construction.

586

# 587 **Determination of phenotypes**

588	Bacteria strains. In the phenotype experiments, totally 11 strains were randomly selected
589	respectively from two EGs that defined by IG1 variants, including 7 EG1.1 strains (B1_10,
590	B1_3, B2_10, B4_8, C1_5, C5_2, C6_5) and 4 EG1.2 strains (B1_1, B3_1, B5_2, C3_10).
591	The strains stored at -80 °C were inoculated in the thiosulfate citrate bile salts sucrose agar
592	(TCBS) plates by streak plate method. Five clones for each strains were inoculated again in
593	another TCBS plate and then cultured overnight at 30 °C in 3% NaCl-LB broth overnight and
594	used for the following assays.
595	
596	Motility assays. Five clones for each strain were cultured overnight at 30 °C and then
597	inoculated in the swimming plate (LB media containing 0.3% agar) and swarming plate (LB
598	agar with 3% NaCl ). The swimming ability was recorded by measuring the diameter of
599	colony after 24 hours at 30 °C. And the swarming ability was recorded after 72 hours at 24 $^\circ$
600	C.
601	
602	Growth curve. V. parahaemolyticus strains in 96-well plate were cultured overnight at 30 °C
603	in 3% NaCl-LB broth. The optical density of each culture was adjust to an OD <sub>600</sub> of 0.6.Then
604	1 ml of each culture was inoculated 100 ml of 3% NaCl-LB broth in a 96-well plate and
605	cultured at 30 °C. The growth of each culture were measured every 1 hour at the optical
606	density of 600 nm using Multiskan Spectrum.
607	
608	Biofilm formation. V. parahaemolyticus strains were cultured overnight at 30 °C in 3%

NaCl-LB broth. 2 μl of each overnight culture was inoculated to 100 μl of 3% NaCl-LB broth
in a 96-well plate and cultured at 30 °C for 24 h statically. The supernatant was discarded and

611	each well was washed once with sterile phosphate-buffered saline (PBS). 0.1% Crystal violet				
612	(wt/vol) was added to each well and incubated at room temperature for 30 min. The crystal				
613	violet was decanted, and each well was washed once with sterile PBS. Crystal violet that				
614	stained biofilm was solubilized with dimethylsulfoxide (DMSO), and then measured at the				
615	optical density of 595 nm using Multiskan Spectrum (Thermo Scientific).				
616					
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625					
626	Author Contributions				
627	D. F., Y. C., and R. Y. designed the study and coordinated the project; Y. C., C. Y., and D. F.				
628	analyzed the data; H. Q. and H. W. performed phenotype experiments; D. F. and Y. C. wrote				
629	the manuscript. All authors approved the final version of the manuscript.				
630					
631	Conflict of interest				
632	The authors declare that they have no conflict of interest.				
633					
634	References				
635	1. Darwin C. The origin of species. 6th. John Murray, London; 1859.				

636 2. Neher RA, Shraiman BI. Statistical genetics and evolution of quantitative traits. Reviews of 637 Modern Physics. 2011;83(4):1283. 638 Pritchard JK, Przeworski M. Linkage disequilibrium in humans: models and data. The 3. 639 American Journal of Human Genetics. 2001;69(1):1-14. 640 4. Dobzhansky T. 1937Genetics and the origin of species. NewYork: Columbia University 641 PressDobzhanskyGenetics and the origin of species1937. 1970. 642 5. Wallace B. Coadaptation revisited. The Journal of heredity. 1991;82(2):89-95. 643 Makino K, Oshima K, Kurokawa K, Yokoyama K, Uda T, Tagomori K, et al. Genome sequence 6. 644 of Vibrio parahaemolyticus: a pathogenic mechanism distinct from that of V cholerae. Lancet. 645 2003;361(9359):743-9. 646 7. Gibson B, Wilson DJ, Feil E, Eyre-Walker A. The distribution of bacterial doubling times in the 647 wild. Proceedings Biological sciences. 2018;285(1880). 648 Yang C, Pei X, Wu Y, Yan L, Yan Y, Song Y, et al. Recent mixing of Vibrio parahaemolyticus 8. 649 populations. bioRxiv. 2018. 650 9. Arnold BJ, Gutmann MU, Grad YH, Sheppard SK, Corander J, Lipsitch M, et al. Weak Epistasis 651 May Drive Adaptation in Recombining Bacteria. Genetics. 2018;208(3):1247-60. 652 10. Yang C, Cui Y, Didelot X, Yang R, Falush D. Why panmictic bacteria are rare. bioRxiv. 2018. 653 Cui Y, Yang X, Didelot X, Guo C, Li D, Yan Y, et al. Epidemic Clones, Oceanic Gene Pools, and 11. 654 Eco-LD in the Free Living Marine Pathogen Vibrio parahaemolyticus. Molecular biology and 655 evolution. 2015;32(6):1396-410. 656 Morcos F, Pagnani A, Lunt B, Bertolino A, Marks DS, Sander C, et al. Direct-coupling analysis 12. 657 of residue coevolution captures native contacts across many protein families. Proceedings of the 658 National Academy of Sciences. 2011;108(49):E1293-E301. 659 13. Puranen S, Pesonen M, Pensar J, Xu YY, Lees JA, Bentley SD, et al. SuperDCA for genome-660 wide epistasis analysis. Microbial genomics. 2018. 661 Pensar J, Puranen S, MacAlasdair N, Kuronen J, Tonkin-Hill G, Pesonen M, et al. Genome-14. 662 wide epistasis and co-selection study using mutual information. BioRxiv. 2019:523407. 663 15. Margolin AA, Nemenman I, Basso K, Wiggins C, Stolovitzky G, Dalla Favera R, et al., editors. 664 ARACNE: an algorithm for the reconstruction of gene regulatory networks in a mammalian cellular 665 context. BMC bioinformatics; 2006: BioMed Central. 666 Dobrindt U, Hochhut B, Hentschel U, Hacker J. Genomic islands in pathogenic and 16. 667 environmental microorganisms. Nature reviews Microbiology. 2004;2(5):414-24. 668 Tanabe T, Funahashi T, Okajima N, Nakao H, Takeuchi Y, Miyamoto K, et al. The Vibrio 17. 669 parahaemolyticus pvuA1 gene (formerly termed psuA) encodes a second ferric vibrioferrin receptor 670 that requires tonB2. FEMS microbiology letters. 2011;324(1):73-9. 671 Vos M, Eyre-Walker A. Are pangenomes adaptive or not? Nature microbiology. 18. 672 2017;2(12):1576. 673 Andreani NA, Hesse E, Vos M. Prokaryote genome fluidity is dependent on effective 19. 674 population size. ISME J. 2017;11(7):1719-21. 675 20. Shapiro BJ. The population genetics of pangenomes. Nature microbiology. 2017;2(12):1574. 676 21. Langille MG, Hsiao WW, Brinkman FS. Detecting genomic islands using bioinformatics 677 approaches. Nature reviews Microbiology. 2010;8(5):373-82. 678 Salomon D, Gonzalez H, Updegraff BL, Orth K. Vibrio parahaemolyticus type VI secretion 22. 679 system 1 is activated in marine conditions to target bacteria, and is differentially regulated from 680 system 2. PloS one. 2013;8(4):e61086. 681 23. Tischler AD, Camilli A. Cyclic diguanylate (c-di-GMP) regulates Vibrio cholerae biofilm 682 formation. Molecular microbiology. 2004;53(3):857-69. 683 Sharp PM, Bailes E, Grocock RJ, Peden JF, Sockett RE. Variation in the strength of selected 24. 684 codon usage bias among bacteria. Nucleic acids research. 2005;33(4):1141-53. 685 25. Shapiro BJ, Friedman J, Cordero OX, Preheim SP, Timberlake SC, Szabo G, et al. Population 686 genomics of early events in the ecological differentiation of bacteria. Science. 2012;336(6077):48-51.

Fraser C, Alm EJ, Polz MF, Spratt BG, Hanage WP. The bacterial species challenge: making
sense of genetic and ecological diversity. Science. 2009;323(5915):741-6.

Falush D, Torpdahl M, Didelot X, Conrad DF, Wilson DJ, Achtman M. Mismatch induced
speciation in Salmonella: model and data. Philosophical transactions of the Royal Society of London
Series B, Biological sciences. 2006;361(1475):2045-53.

Malinsky M, Challis RJ, Tyers AM, Schiffels S, Terai Y, Ngatunga BP, et al. Genomic islands of
speciation separate cichlid ecomorphs in an East African crater lake. Science. 2015;350(6267):14938.

Lawson DJ, Hellenthal G, Myers S, Falush D. Inference of population structure using densehaplotype data. PLoS genetics. 2012;8(1):e1002453.

697 30. Delcher AL, Salzberg SL, Phillippy AM. Using MUMmer to identify similar regions in large
698 sequence sets. Current protocols in bioinformatics. 2003;Chapter 10:Unit 10 3.

Seemann T. Prokka: rapid prokaryotic genome annotation. Bioinformatics.2014;30(14):2068-9.

70132.Page AJ, Cummins CA, Hunt M, Wong VK, Reuter S, Holden MT, et al. Roary: rapid large-scale702prokaryote pan genome analysis. Bioinformatics. 2015;31(22):3691-3.

703 33. Letunic I, Bork P. Interactive tree of life (iTOL) v3: an online tool for the display and

annotation of phylogenetic and other trees. Nucleic acids research. 2016;44(W1):W242-5.

705 34. Krzywinski M, Schein JI. Circos: an information aesthetic for comparative genomics. Genome
 706 Research. 2009;19(9):1639-45.

707

# 708 Figure legends

709 Figure 1. Detection of coadaptation loci in *V. parahaemolyticus*. (a) NJ tree of 198

710 VppAsia strains based on 151,957 bi-allelic SNPs (minor allele frequency > 2%) (b) Q-Q plot

711 of Fisher exact test *P* values between genetic variants. The vertical dotted line shows the

threshold  $P = 10^{-10}$ . (c) Hierarchical clustering of interacting variants (column and row) in the

713 largest network based on Fisher exact test *P* value. IG2-1 and IG2-2 were integrated into IG2.

714 (d) Distribution of SuperDCA coupling strength value. (e) Correlation between Fisher exact

test *P* value and SuperDCA coupling strength (red), and between Fisher exact test *P* value

and SpydrPick mutual information (blue). (f) Overlap of strong linked SNP sites detected by

Fisher exact test ( $P < 10^{-10}$ , excluding IG1 variants) and SuperDCA (coupling strength > 10<sup>-10</sup>)

<sup>2.2</sup>). Red for interacted SNP pairs detected by both methods, blue for SNP pairs detected only

719 by Fisher exact test. Only SNP/accessory gene pairs with distance > 3 kb were included in

720 (c,e and f).

722 Figure 2. Landscape of coadaptation (excluding IG1-3). (a) Gene maps of different IGs. 723 Arrows indicate genes and red for detected coadaptation core genes, blue for accessory genes 724 and orange for genes with no coadaptation signal. Black vertical lines indicate SNPs in the 725 interaction group. The colors of the bar on the left indicates average linkage strength of the 726 loci in each IG. Vertical dotted lines were used to split compatible genes with physical 727 distance larger than 3 kb, or genes located in different contigs, chromosomes and strains. 728 Dotted rectangles indicate incompatible genes. IGs with genome block length larger than 60 729 kb are broken by double slash and shown in (b) after zooming out. COG classification labels 730 are shown above the genes. (c) COG classification and GC content of all the genes used in 731 detection (top) and of different types of coadaptation genes. Red for core genes and blue for 732 accessory genes. The first number in brackets is the number of genes with COG annotation 733 and the second is the total number of genes in the category.

734

Figure 3. Representative interaction groups. Hierarchical clustering of 469 non-redundant 735 736 strains (columns) based on coadaptation loci (rows) of 4 representative IGs. Colors of the 737 heatmap indicate the status of genetic variants, with light orange/orange for two alleles of a 738 SNP, light yellow/brown for absence and presence of the accessory genes. Bar colors below 739 the tree on the top indicate the populations of strains according to the legend. Function 740 summary of involved genes is shown on the top of each heatmap. Arcs on the right indicate 741 the causal links after ARACNE flitering, colors and the width of the arcs scale with the P 742 values.

743

Figure 4. Interaction group 1. (a) Hierarchical clustering of 469 non-redundant strains
(columns) based on coadaptated loci (rows) of IG1. Color scheme of the heatmap is the same
as in Figure 3. Branch colors of the tree on the top indicate the populations of strains

747 according to the legend. The black bars below the tree indicate the strains used in 748 experiments. Branch colors of the tree on the left indicate the tiers of coadaptation loci, with 749 red, blue and green for tier 1, 2 and 3, respectively. The same colors are used for tiers of 750 coadaptation in panel (b) and (c). Colors of the bar on the right indicate the genome position 751 of coadaptation loci, which is corresponding to the bar colors in panel (b). Arcs on the right 752 indicate the causal links as in Figure 3, the links within the genome block in (b) were 753 removed and only one link between different blocks was shown. (b) Gene map of 754 coadaptation genome blocks of IG1. Two reference genomes were used to show coadaptation 755 variants in IG1. The left curve indicates the value of average copy probability of EG1.2 756 strains that copied from themselves throughout the genome of Ref1, with vertical dotted line 757 indicates the expect value (number of EG1.2 strains /number of all strains). The bars indicate 758 the reference genomes and different chromosomes are separated by a horizontal short bar. 759 The labels of coadaptation genome blocks are shown above them and are corresponding to 760 information in Table S2. Arrows and vertical lines separately indicate genes and SNPs, which 761 were colored according to different coadaptation tiers, and core genes were colored grey and 762 genes with no coadaptation signal were light orange. COG classification labels are shown 763 above the genes. (c) The distribution of coadaptation SNPs in the lateral flagellar gene cluster 764 region (VPA1538-1557). The top indicates the gene organization of lateral flagellar gene 765 cluster. Light orange rectangles show the accessory genome region. The histograms indicate 766 the distribution of SNPs along the gene cluster, with colors of bars indicate coadaptation tiers.

767

Figure 5. Interaction group 2 (a) and 3 (b). Layout and colors are the same as in Figure 4.
EG1.2 and EG2.1 strains are shown below the tree on the top for comparison (black bars).
The left curves indicate the average copy probability value of EG2.1 (a) and EG3.1 (b) strains
copy from themselves throughout the reference genome, respectively. Twenty randomly

selected SNPs separately from IG2-1 and IG2-2 were used in hierarchical clustering tominimize the influence of number of variants.

774

Figure 6. Phenotypes of 7 EG1.1 and 4 EG1.2 strains. (a) Swimming and swarming
ability. (b) Growth curve. (c) Biofilm formation and colony morphology. Strains used in
experiments were randomly selected and were marked in Figure 4a.

778

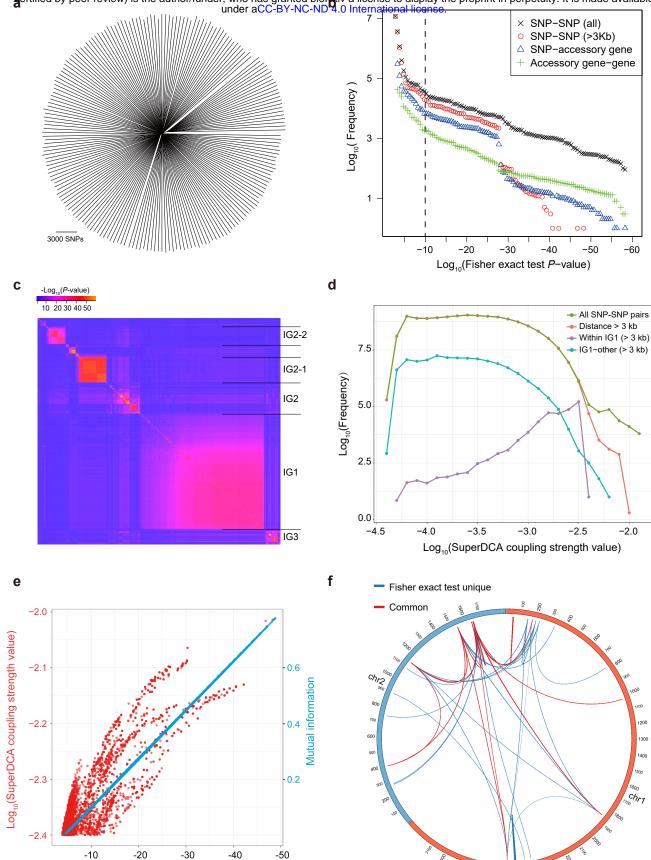
779 Figure 7. Overview of four stages of coadaptation. Circles indicate bacterial strains within a population. Stars indicate SNPs, with red and green indicating the two alleles. Blue 780 781 rectangles indicate accessory genes or genome islands. Arrows indicate the transitions 782 between stages. Casual interactions involve genes and SNPs coming and going on all genetic 783 backgrounds. Steady interactions involve particular genes that are associated with each other 784 but with frequent exceptions due to ongoing genetic flux and coadaptation with other loci. Married interactions involve a core of fastidiously associated loci with other loci that lead to 785 786 further co-adaptation in multiple genome regions. The horizontal line in the fourth stage 787 indicates a barrier to gene flow entailing speciation.

	Total <sup>*</sup>	Network 1				IG5-93	Frequency***	
	Total	IG1	IG2	IG3	IG4	Frequency**	100-90	Trequency
SNP-SNP pair	2.3×10 <sup>10</sup>	283632	4398	1150	6	0.00%	22751	0.00%
SNP-Accessory gene pair	2.2×10 <sup>9</sup>	104096	7319	2446	112	0.01%	1188	0.00%
Accessory gene-gene pair	2.1×10 <sup>8</sup>	7999	2823	973	1692	0.01%	12264	0.01%
SNP number	151957	917	548	75	63	1.05%	333	0.22%
Synonymous (Syn)	117541	626	409	49	38	0.95%	226	0.19%
Nonsynonymous (NonSyn)	23673	236	122	21	21	1.69%	107	0.45%
NonSyn/Syn	0.2	0.38	0.30	0.43	0.55		0.47	
Core gene	3936	62	20	6	4	2.34%	18	0.56%
Accessory gene	14486	152	130	65	124	3.25%	1122	7.75%

\* All of the variations used in coadaptation screen.

\*\* Ratio of the number of variations in Network 1 to the total number of variations.

\*\*\* Ratio of the number of variations in IG5-93 to the total number of variations.



-40

Log<sub>10</sub>(Fisher exact test *P*-value)

-50

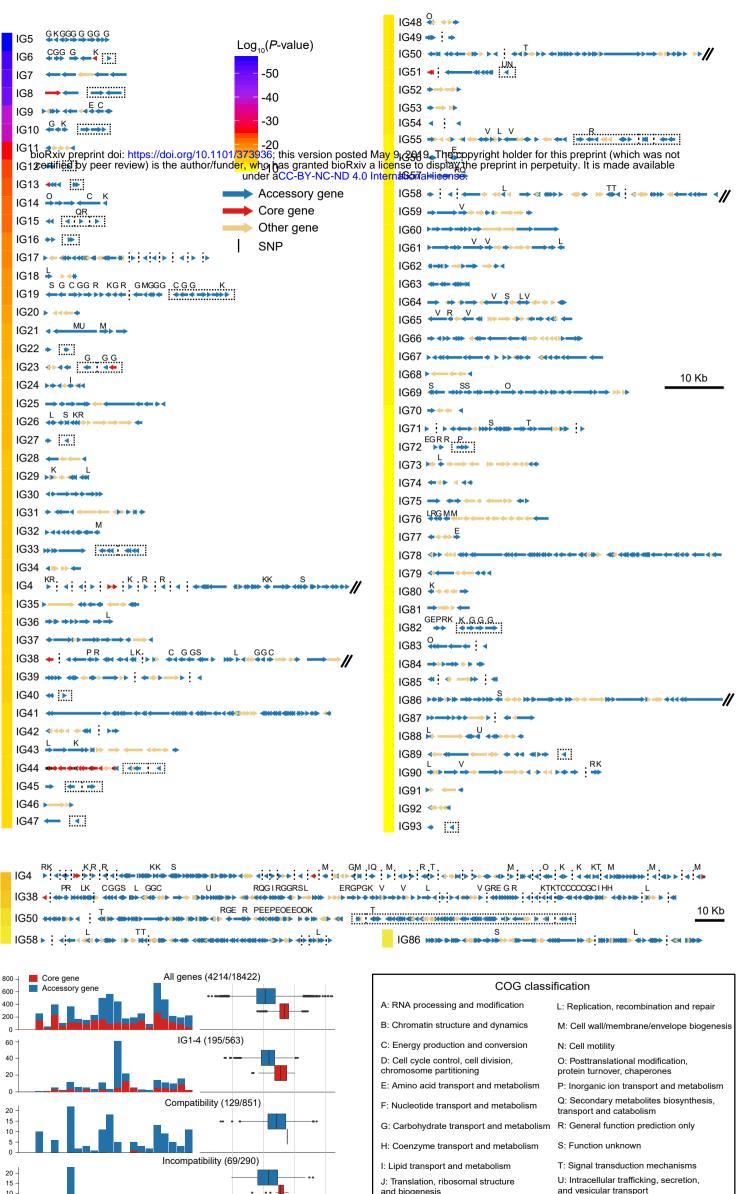
2800

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and biogenesis

K: Transcription

V: Defense mechanisms

а

b

С

Gene number

10 5

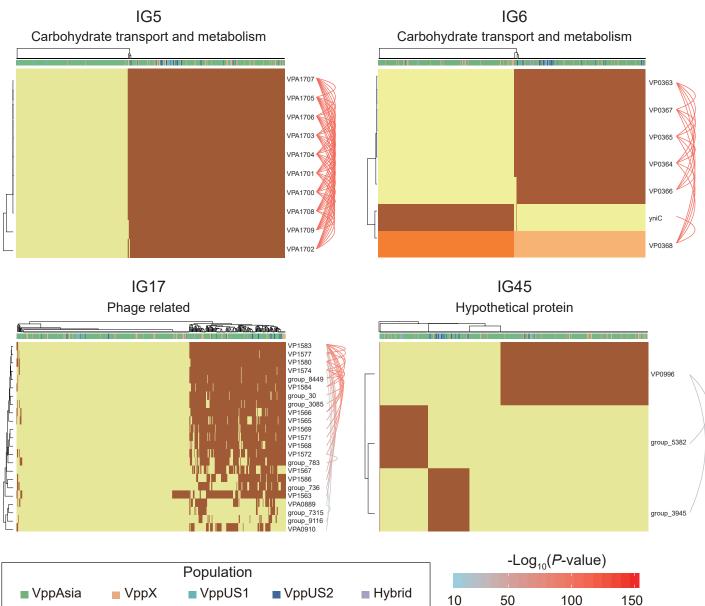
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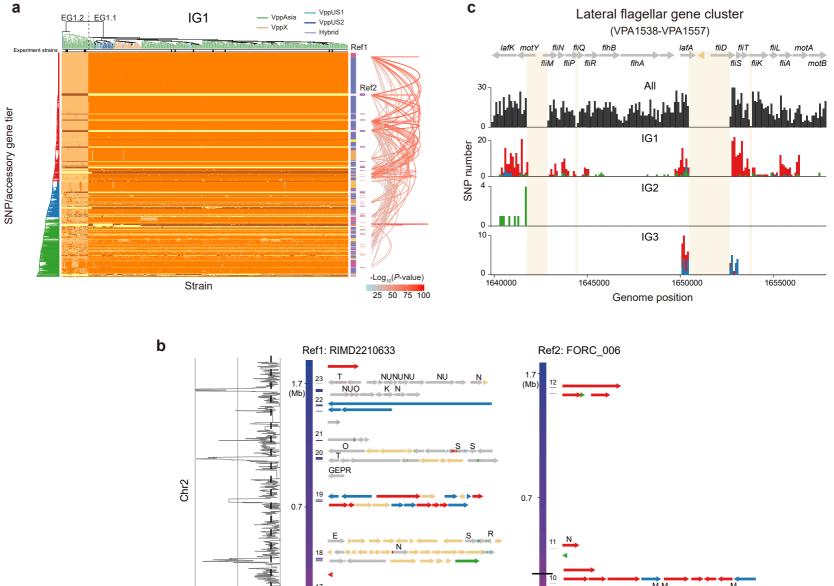
COG classification

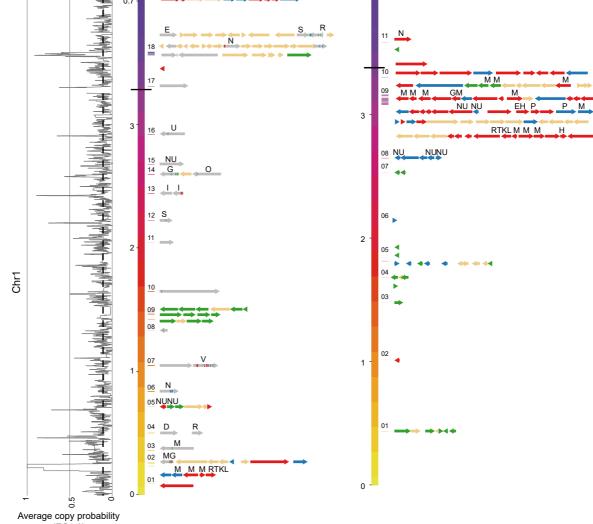
30

GC content (%)

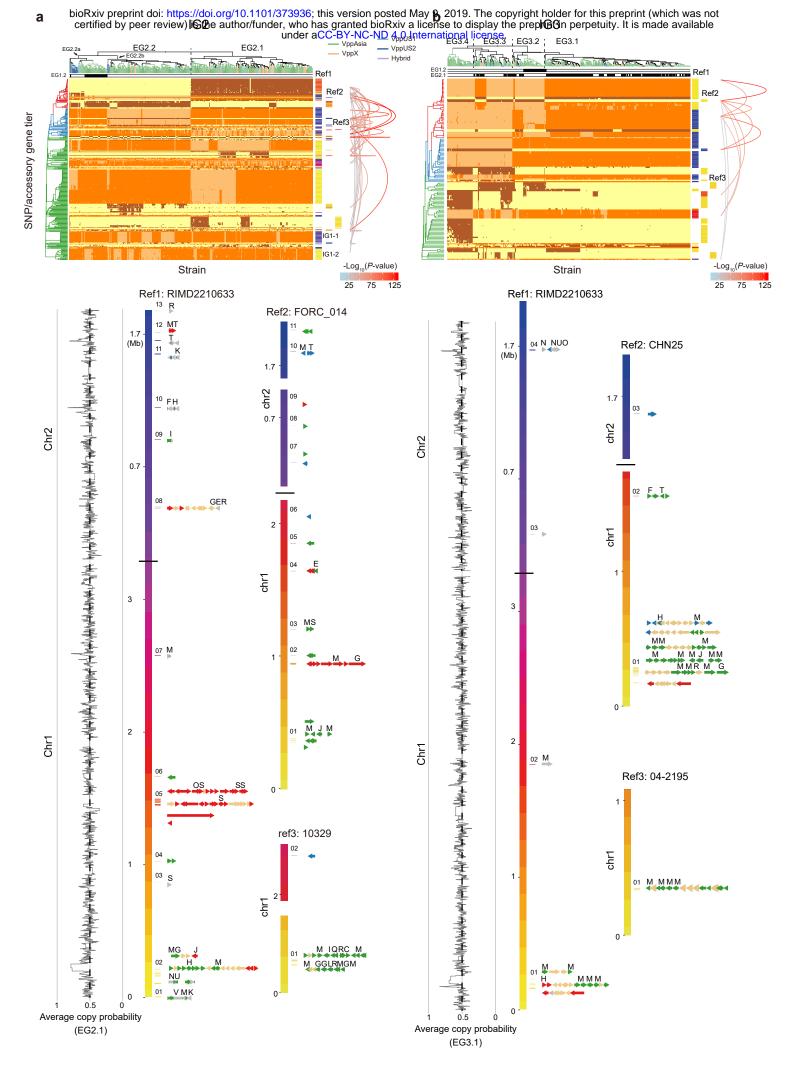


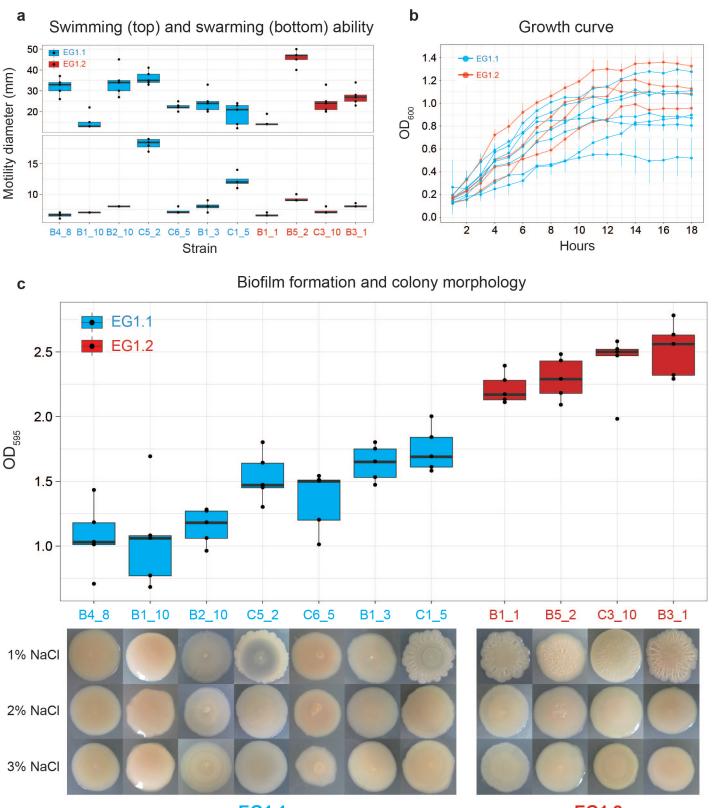
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Average copy probability (EG1.2)







EG1.2

