

# Independent evolution of shape and motility allows evolutionary flexibility in Firmicutes bacteria

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- 19 Abstract
- 20

Functional morphological adaptation is an implicit assumption across many ecological 21 22 studies. However, despite a few pioneering attempts to link bacterial form and function, functional morphology is largely unstudied in prokaryotes. One intriguing candidate for 23 24 analysis is bacterial shape, as multiple lines of theory indicate that cell shape and motility should be strongly correlated. Here we present a large-scale use of modern phylogenetic 25 comparative methods to explore this relationship across 325 species of the phylum 26 27 *Firmicutes*. In contrast to clear predictions from theory, we show that cell shape and motility are not coupled, and that transitions to and from flagellar motility are common and strongly 28 29 associated with lifestyle (free-living or host-associated). We find no association between 30 shape and lifestyle, and contrary to recent evidence, no indication that shape is associated with pathogenicity. Our results suggest that the independent evolution of shape and motility 31 in this group might allow a greater evolutionary flexibility. 32

34 Studies of functional morphology are commonplace in eukaryotes, with an implicit understanding that form and function are generally correlated 1-3. However, such 35 morphological functional adaptation is largely unstudied in prokaryotes<sup>4</sup>. While explanations 36 for the functions of rod and coccoid forms have been posited based on scaling and 37 hydrodynamic arguments<sup>5</sup>, and we know of functions for a limited subset of species-specific 38 bacterial morphologies from detailed experimental work<sup>6</sup>, we are realistically no closer to a 39 more general understanding of prokaryote functional morphology than we were a decade 40  $ago^{7,8}$ . 41

One clear and recurring prediction for form and function in microorganisms in general is that 42 shape and motility are correlated. In bacteria, where the majority of motile species use 43 flagella to propel themselves, these two traits are commonly thought to co-vary tightly<sup>7,9,10</sup>. 44 Mathematical modelling of optimal shapes for efficient swimming suggests that flagellar 45 46 motility in particular should be an important driving force for bacterial shape evolution. Specifically, motility imposes substantial physical and energetic constraints<sup>5,9–11</sup> that favour 47 bacterial cells with ellipsoid or rod-like morphologies within a narrow aspect ratio 48 (length/width) range to reduce drag<sup>7,9,10</sup>. However, while mathematical models predict a 49 strong relationship between shape and motility, explicit experimental tests are rare and, 50 surprisingly, analyses of this relationship in an evolutionary context are lacking entirely. 51

In addition to the requirement of efficient motility for host invasion and colonization in pathogenic species<sup>12</sup>, flagellar motility is also known to activate strong immune system responses in mammalian hosts through recognition of flagellar components and movement<sup>13–</sup> Selective pressures exerted by host immune responses against flagella have been suggested to have led many bacteria to lose their ability to move during adaptation to the host habitat<sup>14</sup>. While the role of flagella as a virulence factor in pathogenesis is well
documented<sup>16</sup>, the function of bacterial cell morphology remains elusive.

Bacterial shape has been linked to immune evasion and virulence in some disease-causing groups<sup>7,17–19</sup>. A small number of experimental studies suggest that the host-immune system can recognise shape and size of artificial particles and could therefore be a strong selective force acting on cell shape in pathogenic species<sup>20,21</sup>. Recent work has led to the prediction that the coccoid form is adaptive in a pathogenic context, owing to reduction in cell surface area exposed to immune attack<sup>22</sup>.

Almost everything we understand about the evolution of bacterial shape is based on 65 qualitative descriptions of morphologies 'mapped' on to phylogenetic trees<sup>23,24</sup>. For example, 66 Siefert and Fox<sup>24</sup> observed that the coccoid form has evolved repeatedly and independently, 67 as a persistent end-state morphology, in several distinct bacterial groups. Tamames et al.25, 68 reported the same observation using arrangement of genes involved in division and cell-wall 69 synthesis, suggesting that transitions back to a rod shape are unlikely. However, a new 70 generation of comparative phylogenetic methods now exist, meaning a robust statistical 71 approach can now be brought to bear on such questions. 72

73 Here we draw on this new generation of methods to assess the link between form and function in a large monophyletic group within the *Firmicutes*, a phylum of considerable 74 environmental, medical, and biotechnological importance (e.g.<sup>26-28</sup>). More specifically, we 75 investigate the evolutionary associations between shape and motility and whether transitions 76 from a free-living to a host-associated mode of life were accompanied by a coordinated 77 change in both traits. As these transitions represent a steep evolutionary hill, coordinated 78 79 morphological changes in this context most likely represent adaptations to counter immune responses, competition, and new nutrient sources. 80

#### 81 **Results**

To assess the correlations between different bacterial traits (see Figure 1a and Methods) we used a recently developed probit model<sup>29</sup> that accommodates binary response variables while simultaneously accounting for shared ancestry (Methods). The presence of shared ancestry often biases visual interpretation<sup>30</sup> and accounting for it forms the basis of comparative phylogenetic methods<sup>31</sup>.

# 87 Shape and motility evolve independently

Owing to physical and energetic constraints imposed on cell shape by flagellar motility, these 88 two traits are predicted to co-vary tightly in bacteria<sup>7,9,11</sup>. In contrast to this prediction we 89 found no evidence for an association between shape and either motility or mode of life (free-90 living vs non-free living species, see Methods) based on the probit model, despite the 91 preponderance of rod-shaped motile bacteria ( $pMCMC^{29} = 0.17$  and pMCMC = 0.9892 respectively). pMCMC is the proportion of coefficients in the posterior distribution estimates 93 that are  $\neq 0$ , multiplied by two (for a two-tailed test), and is analogous to a frequentist p-94 95 value. This result is robust to a resampling procedure that examines the effect of species composition in our dataset (pMCMC values > 0.05, Methods). 96

Given that *mode of life* was not a significant predictor of shape, we used a model with motility and the subset of lifestyle which constitutes only host-associated species and those that are free-living as predictors (see Fig. 1a and Methods). This model also provided no support for an association with shape despite the fact that the host habitat is often assumed to exert selective pressure on this trait<sup>7</sup> (pMCMC<sub>motility</sub> = 0.31 and pMCMC<sub>lifestyle</sub> = 0.58, Table 1). This result too was robust to our resampling procedure (95% of pMCMC values > 0.05, Methods), and a transition model that models discrete character evolution as a continuoustime Markov process (Methods and Supplementary Table S1) also lends support in that transitions between free-living and host-associated lifestyles and between a free-living and non-free living mode of life were not accompanied by change in shape (*mode of life*: BF = -1.81; *lifestyle*: BF = -1.75, Methods and Supplementary Table S1).

An expectation of strong selective pressures exerted by immune system responses on cell morphology, leads to a prediction of an association between shape and pathogenicity<sup>7,22</sup>. However, the probit model provided no evidence for any association (pMCMC = 0.32, Table 1), a result robust to our resampling procedure (pMCMC values > 0.05, Methods). Despite the selective pressures due to habitat and the immune system on shape<sup>7</sup>, our analyses suggest that selection for shape in this group of bacteria is driven by factors other than the simple ecological pressures previously assumed.

# 115 Motility is strongly associated with lifestyle

116 To investigate whether evolutionary transitions from a free-living to a host-associated lifestyle were accompanied by a change in motility status, we assessed the association 117 between motility and our two classifications of habitat (Methods). Our results indicate that 118 motility is not associated with mode of life per se but that motility loss is linked to a host-119 120 associated lifestyle (pMCMC<sub>lifestyle</sub> = 0.014, Table 1). This is supported by the strong rejection of a transition model in which motility and *lifestyle* are assumed to evolve 121 independently, in favour of a dependent model ( $\log$ -BF = 9.29, Fig. 1b, Supplementary Table 122 S1). The most likely transition model thus suggests that transitions from a free-living to a 123 host-associated lifestyle are often accompanied by a loss of motility (Fig. 1b), and we infer 124 that selective pressures within the host are likely to have selected against flagellar motility in 125 host-associated bacteria (Discussion). However, the pMCMC values < 0.05 for the model 126 with motility as the response and *lifestyle* as predictor after sampling 50% and 75% of the 127

data were 77.4% and 86.8% respectively. This result indicates that the relationship between
motility and lifestyle is not significant, probably due to a reduction of the statistical power in
comparison with the model using all of the data.

#### 131 Transition rates for shape and motility

In agreement with previous observations from phylogenies<sup>24,25</sup> our estimated transition rates 132 for shape provided no evidence for transitions from coccoid (C) to rod (R) (i.e., qCR = 0) in 133 the group (log-BF = -3.46, Fig. 1c), indicating the transitions from rod to coccoid are 134 135 probably irreversible (Discussion). In contrast, transition rate estimates for motility indicated that this is a labile character where both loss and regain occur, and with the transition rate 136 from motile to non-motile approximately six times that of the reverse (qMN =  $0.6 \pm 0.124$ , Z 137 = 0 %; qNM =  $0.12 \pm 0.055$ , Z = 0 %, Figure 1c). However, while the rate of transitions to 138 motile from non-motile forms (qNM) was low, it was significantly different from a rate of 139 zero (log-BF = 8.32). We suggest (Discussion) that lability of flagellar motility is most likely 140 explained through instances of flagellar resurrection<sup>32</sup> or horizontal gene transfer  $(HGT)^{33-38}$ . 141

142 It has been previously posited that bacteria have evolved from a rod shaped ancestor<sup>24,39,40</sup>. 143 Here we provide statistical support for this hypothesis in this particular group of bacteria as 144 indicated by a transition model (root posterior probability (rod) =  $0.99\pm0.001$ , Fig. 1a). This 145 model also indicates that this group probably derived from an ancestral motile bacterium 146 (root posterior probability (motile) =  $0.99\pm0.003$ ), (Fig. 1a).

147

In agreement with work suggesting that functional traits resulting from complex genetic machineries are conserved in prokaryotes<sup>41</sup>, we found strong phylogenetic signal in both shape (mean  $h^2 = 0.84$  with 95 % probability of lying between 0.74 and 0.92, Supplementary

- Figure S5 and motility (mean  $h^2 = 0.64$  with 95 % probability of lying between 0.40 and 0.86,
- 152 Figure S6).

#### 153 **Discussion**

#### 154 Shape and motility evolved independently

Cell shape and motility are often thought to have important adaptive functions in bacteria<sup>7</sup>. 155 Based mainly on fluid dynamic arguments, it has been suggested that these two traits co-vary 156 tightly because of the physical and energetic constraints imposed on cell shape by flagellar 157 motility<sup>5,7,9</sup>. However, in this study we demonstrate that shape and motility are not 158 statistically coupled. The lines of evidence we present here suggest that the independent 159 160 evolution of motility and shape in this group of bacteria provides a mechanism to allow greater evolutionary flexibility. Here we draw parallels with analysis of leaf economics and 161 hydraulic traits in higher plants<sup>42</sup>, where decoupling of suites of traits from each other 162 suggests that independent trait dimensions can exist. For subtropical forests a leaf economics 163 dimension corresponding to light capture and tissue longevity, and a hydraulic dimension 164 corresponding to water-use and leaf temperature maintenance were identified. We suggest 165 that in the same way that the independent evolution of leaf economics and hydraulic traits 166 allows more possible plant trait combinations, so independence of shape and motility in 167 bacteria may allow adaptation to distinct niches. However, in the case of these bacteria there 168 is a difference in that we observe an evolutionarily irreversible character state (the coccoid 169 form). The existence of this 'dead end' state reduces trait dimensionality somewhat, while the 170 171 independent evolution of shape from motility allows at least partial release from this constraint. 172

The true morphological diversity in the prokaryotes is larger than the simple rod or coccoid dichotomy used here<sup>7</sup>, with shape complexity that belies a widespread perception that there is limited morphological variation in groups such as bacteria (e.g.<sup>7</sup>). Given this variation, we expect morphology in prokaryotes to be finely tuned to function where selection pressures are 177 high, in line with many studies on individual species. Here we provide evolutionary arguments suggesting that shape is under selective pressure in this monophyletic group. We 178 provide, to our knowledge, the first statistical support for a rod shaped ancestor of the group 179 (root posterior distribution =  $99\pm0.001$ ) and, as suggested by two previous studies<sup>24,25</sup>, 180 statistical support for the coccoid shape being a derived end state. This progressive 181 development of the coccoid shape implies that selective forces are operating<sup>8</sup>. Also, our 182 analysis suggests that the coccoid shape has evolved several times independently. This 183 convergence indicates that similar selective forces have led to similar responses across the 184 group<sup>43</sup>. The complex biochemical machinery, cellular mechanisms and mechanical 185 constraints involved in rod morphogenesis<sup>44–46</sup> support the idea that transitions from rod to 186 coccoid are irreversible as our results suggest. 187

#### 188 Motility is associated with lifestyle

In contrast to the irreversibility we observe for cell morphology, our results suggest that flagellar motility in this group is a highly labile character. Although the rate of motility regain was much lower than that of motility loss, it was still significantly different from zero. Thus, despite the complex regulatory system involved in flagellar assembly, flagellar motility has been regained several times, providing complementary evidence for flagellar resurrection<sup>32</sup>, or horizontal gene transfer (HGT), <sup>33–37</sup> *in natura*.

Motility has been suggested to play important roles in dispersal, niche colonization, predation, desiccation, and chemotaxis under natural conditions<sup>7</sup>, and perhaps unsurprisingly, it is clearly associated with a free-living lifestyle in this group. Linked to the lability of flagellar motility we also provide evidence for an association between this trait and habitat (Table 1), where loss of motility is associated with transitions to a host-associated life-style (Figure 1b). In agreement with common observations, 83.3 % of free-living bacteria in our 201 dataset were motile while only 8.8 % of those species associated with a host were. It has been suggested that in the Staphylococcaceae, the transition from a free-living mode to a host-202 associated habitat coincided with a loss of motility<sup>38</sup>. Flagellar molecular machinery is known 203 to be targeted by the mammalian immune system via Toll-like receptor 5 (TLR5) and the 204 membrane spanning protein FLS2 in plants<sup>12,13</sup>, and there are likely to be homologous 205 immune responses in other animal groups. Such selective pressures are, we suggest, highly 206 likely to have selected against flagellar motility in host-associated bacteria. In contrast, while 207 adoption of a coccoid form may confer increased resistance to the host's immune system by 208 reducing the size of bacterial cells<sup>22</sup>, and the coccoid form has also been suggested to play a 209 crucial role in pathogenesis<sup>47</sup>, we found no correlation between cell morphology and 210 pathogenicity (pMCMC = 0.32). 211

#### 212 Conclusions

We now have strong evidence that shape and motility are not correlated in this large 213 monophyletic group within the Firmicutes, allowing this group to overcome perceived 214 constraints imposed by irreversible transitions from rod to coccoid morphologies. While we 215 find a general lack of correlation between shape and lifestyle, there is also little support for 216 the idea that shape in microorganisms may be untouched by selection, *sensu* Bonner<sup>48</sup>. We 217 provide evidence that flagellar motility is a highly labile character in the wild, and suggest 218 219 that the independent evolution of shape and motility in this group may allow an increase in bacterial trait dimensions. We think it is likely that such trait independency could be a general 220 pattern in bacteria as well as for leaf economics and hydraulic traits in plants. 221

#### 222 Methods

#### 223 Phylogenetic tree and species selection

In order to account for shared ancestry in our statistical treatment, we used the monophyletic *Firmicutes (Bacilli* and *Erysipelotrichia*) section of the phylogenetic tree of Chai *et al.*<sup>49</sup>, based on 14,727 prokaryotic genomes (see Fig. 1a).

#### 227 **Data collection**

228 We collected phenotypic data on shape, motility, pathogenicity and lifestyle type for 325 species of the Firmicutes from Bergev's Manual of Systematic Bacteriology<sup>50</sup>. Data for 229 species described after the manual was published were collated from the primary literature 230 (Supplementary Table S3). Data were not reported for taxa without a species description (e.g. 231 Bacillus sp. 1NLA3E, Streptococcus sp. GMD2S). Data for outlier strains (i.e. potentially 232 misclassified species), were not included in the analysis (e.g. Clostridium difficile strain P28 233 did not cluster with members of the genus *Clostridium*). The tree and phylogenetic 234 distribution of phenotypic data are shown in Figure 1a. 235

#### 236 **Phenotypic characterization**

# 237 Cell morphology

Shape characterization in the species description section from *Bergey's Manual of Systematic Bacteriology* and the primary literature is generally subjective and not geometrically precise.
To provide a more reliable description for the purpose of our study we classified shape based
mainly on size measurements of individual cells. When cell size was not available we used a
simplified classification.

We first reported cell length and width (diameter for coccoid cells) and calculated the aspect 243 ratio (AR) as length divided by width. AR of species for which a range of width and length 244 was provided was calculated as the average length divided by the average width. We defined 245 as rod-shaped any cylindrical cell with an AR > 1 (blue tips in Fig. 1a) and as coccoid any 246 cell with AR = 1 (red tips in Fig. 1a). Pleomorphic species for which width and length data 247 were provided (seven species with AR > 1 and two with AR = 1) were considered as missing 248 for shape as these data were reported only for the cells that were rod or coccoid among other 249 morphologies. Species for which length and/or width was missing were classified as being 250 251 either rod or coccoid based on a qualitative description. The descriptions of shape in Bergey's Manual and the primary literature were usually words and phrases such as "rods", "rods with 252 rounded ends", "straight rods", "curved rods", "slightly curved rods" and "rods with tapered 253 254 ends", "cocci", "spherical", "coccoid", "and ovoid" or "ovococcoid". Based on these descriptions, we recorded the shape as coccoid for "cocci", "spherical", "coccoid", "ovoid" 255 and "ovococcoid", and as rod for the remaining categories. We did not consider the curvature 256 or end type for the rod categories. Ovococcoid species with AR > 1 were excluded from the 257 analyses. Species with ambiguous shapes (e.g. "ovoid or rods", "cocci or rods") were 258 excluded from the analysis. 259

# 260 Motility

Species were classified as motile or non-motile regardless of motility type (e.g. swarming or swimming motility). Species exhibiting changes in motility status depending on growth conditions were recorded as being motile only if the presence of flagella was reported. Motile and non-motile species are coloured in light green and orange respectively on the inner ring in Fig. 1a.

# 266 Habitat and pathogenicity

267 For the purpose of this study and due to limited information on microenvironments we used a broad categorization (based on macro-environment descriptions) of habitat types (i.e. the 268 different locations where the organism naturally lives and grows and from which it could be 269 270 recovered and isolated). When the habitat was not known, the first isolation site was used (e.g. human tissue, soil, etc.). This categorization was a simple division between free-living 271 (i.e. bacteria living independently in the environment) and non-free-living species (mode of 272 life dataset and middle ring in Fig. 1a). Bacteria living in soil, water, lake, sea or sediment, 273 for instance, were considered as free-living. Species associated with plant, animal or insect 274 275 organisms and species living in confined environments (e.g. food production and fermentation processes) were recorded as non-free living. 276

To investigate whether host-associated species exhibit a particular morphology and motility status in comparison to free-living species, we used a subset of our data containing free-living species and only those non-free-living species associated with a host (*lifestyle* dataset, n = 145 species and outer ring in Fig. 1a). Host-associated species were defined as those living within a plant, animal or insect hosts while species associated with food production and fermentation processes were not considered in this classification. Species living in multiple environments (e.g. human tissues, food and soil) were recorded as missing for both datasets.

To test for a correlation between shape and pathogenicity we took the host-associated species and classified them as either pathogenic or non-pathogenic. We defined pathogenicity as the capacity to cause disease. Opportunistic and obligate plant, animal and insect pathogens were considered as pathogenic while commensal species and those not yet reported as being involved in host infections were considered as non-pathogenic. Species for which pathogenicity information was not available were not included in the analysis. As data on pathogenesis were only available for two of 12 motile host-associated species we did notinclude motility in this analysis.

# 292 **Phylogenetic comparative methods**

#### 293 **Probit model**

We modelled the probability of a correlation between our response variable (shape or motility) and our predictors using phylogenetic generalised linear mixed models in a Bayesian framework<sup>29</sup>. We used this type of model as it allows testing models with binary response variables while accounting for shared ancestry as implied by the phylogeny. We also used the more familiar Markov transition model developed by Pagel<sup>31</sup> in a Bayesian framework<sup>51</sup>.

Shape, motility and lifestyle data were coded as discrete binary characters (rod, motile and 300 free-living as 1 and coccoid, non-motile and non-free living or host-associated as 0). We used 301 a probit model in MCMCglmm<sup>29</sup> with largely uninformative priors (normal distribution with 302 a mean of zero and a variance of 10<sup>8</sup>) for our fixed factor predictors, and a  $\chi^2$  prior for the 303 phylogeny treated as a random factor as this best approximates a uniform distribution<sup>29,52</sup>. As 304 binary response variables do not provide sufficient information for estimating the residual 305 variance, we fixed the residual variance to  $1^{29,52}$ . The MCMC (Markov chain Monte Carlo) 306 chains were run for 5 million iterations with an additional burn-in of 300,000 iterations and a 307 sampling interval of 1000 iterations. Chain convergence and mixing were assessed visually 308 (Supplementary Fig. S1-S4) as well as by ensuring that the effective sample sizes for all 309 estimated parameters were > 1000. To assess the autocorrelation for the sampling factor we 310 checked that all correlation between samples after lag zero was less than  $0.1^{29}$ . 311

#### 313 Assessing robustness of multiple regression results using MCMCglmm

To test whether our results from multiple regressions were robust, we applied a cross-314 validation test. We ran 500 independent chains by sampling 50% of the data in each run for 315 all the models. For regression model with motility and *lifestyle* we also performed an 316 317 additional run of 500 independent chains by sampling 75% of the data due to a decrease in the statistical power when sampling only 50% of the data. Chains mixing was assessed 318 visually and percentage of pMCMC values below 0.05 among 500 samples for each model is 319 reported (Results section). To account for multiple testing for our hypotheses regarding 320 motility we performed a False Discovery Rate (FDR) test<sup>53</sup>. 321

322

# 323 Phylogenetic signal

We used the estimated posterior heritability ( $h^2$ ) of our models as a measure of the degree of the phylogenetic signal in our data, a parameter that is equivalent to  $\lambda^{54}$  in phylogenetic generalised least-squares models<sup>55</sup>. We used a Bayesian approach to take into account the uncertainty in model parameter estimation and calculated the posterior heritability across the entire posterior distribution of model variances.

# 329 Transition model

To assess whether transitions from a free-living lifestyle to being host-adapted were associated with a change in shape or motility status we used a transition model under a reversible-jump MCMC approach as implemented in BayesTraits  $v2^{51}$ , by comparing two competing models. The first (independent) model assumes that two characters evolve independently while the second (dependent) model allows one character to vary depending on 335 the character state of the other. For an effective estimate of the marginal likelihoods we used three independent chains run for 5,000,000 generations after discarding the first 10% as 336 burning period and the stepping stone sampling procedure (1,000 stones, each sampled for 337 338 20,000 iterations ) implemented in BayesTraits v2. Chain convergence was assessed using Tracer v1.6.03<sup>56</sup>. The models were evaluated by two methods. First by comparing the 339 marginal likelihood of the two models using Bayes factor (BF). Second, given that the 340 number of visits to the dependent or independent model is propositional to the posterior 341 probability of the model, support for correlated evolution was evaluated by comparing the 342 343 ratio of prior and posterior odds for visits of the two models during the chains1. For both methods a  $\log$ -BF < 2 was considered as weak evidence for correlated evolution. 344

To estimate the transition rates for discrete phenotypic characters and to assess whether the 345 rates were asymmetric we modelled discrete character evolution as a continuous-time 346 347 Markov process using the multistate method in BayesTraits v2. All models were run for 5,000,000 iterations (sampled every 1,000 iterations) with all priors set to an exponential with 348 a mean of 10. Marginal likelihoods were obtained from the harmonic mean estimates of the 349 model. Where strong asymmetry was detected, we then compared a constrained with a full 350 model in order to assess whether low transition rates differed significantly from zero rates. In 351 352 the constrained model, the transition rate from state 0 to 1 (reversal) was fixed to zero ( $q_{01}$  = 0), while the full model estimated both parameters simultaneously  $(q_{01} \neq q_{10})$ . To identify the 353 best-fitting model, we compared the log marginal likelihoods obtained from estimates for the 354 two models using BF. A log-BF < 2 was considered as a weak support<sup>57</sup> for the model where 355 the rates are different  $(q_{01} \neq q_{10})$ . 356

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- 498 SH, CV and FE designed the study; FE and SH developed the protocol for the data collection;
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#### 503 **Figure Legends**

Figure 1. (a) Phylogenetic tree and distribution of traits. The inner and middle rings are 504 colour coded according to motility status and *mode of life* respectively, while the outer ring is 505 506 coded according to *lifestyle*. Histograms show the posterior distribution of probability at the root to be a rod (top) and motile (bottom). (b) Transition rate estimates between motility and 507 *lifestyle*. The q<sub>ii</sub> transition rates denote changes in one trait that are dependent on the state of 508 509 host-associated and 4 = free-living. Histograms on the arrows indicate the posterior 510 511 distribution of transition rates under a reversible-jump MCMC model for a given transition from one state to another (arrow). On the left is a model where all transition rates were 512 estimated, on the right one where transition rates q12, q21 and q13 were set to zero (First 513 514 model in Supplementary Table S2). (c) Transition rates for shape and motility. Histograms 515 indicate the posterior distribution of transition rates estimates between rod and coccoid (qRC and qCR) and between being motile and non-motile (qMN and qNM). 516

# 518 **Table 1.**

Model	Posterior mean	Lower 95 % CI*	Upper 95 % Cl	pMCMC	HPD† Lower	HPD Upper
Response: Shape					0.74	0.92
(Intercept)	6.22	0.68	11.97	0.016		
Motility	2.08	-0.93	5.26	0.17		
mode of life	-0.06	-2.98	2.98	0.98		
Response: Shape					0.79	0.93
(Intercept)	4.96	-0.1	10.31	0.04		
Motility	1.54	-1.8	4.42	0.31		
lifestyle	0.77	-2.25	3.73	0.58		
Response: Shape					0.5	0.88
(Intercept)	3.64	-1.1	9.03	0.11		
Pathogenicity	-2.7	-6.67	1.15	0.146		
Response: Motility					0.53	0.88
(Intercept)	0.99	-1.77	3.82	0.45		
mode of life	1.1	-0.17	2.28	0.09		
Response: Motility					0.4	0.86
(Intercept)	0.21	-2.38	2.62	0.89		
lifestyle	1.9	0.35	3.4	0.028 (0.014)		

- 519
- 520
- 521 \* CI: Credible interval
- **522 †** HPD: 95% credible interval for heritability

523 Our conclusions were not affected by multiple testing by using the false discovery rate (FDR) control test<sup>53</sup>

524 (Methods). Corrected pMCMC values are given with originals in brackets only where a significant result was

- 525 influenced.
- 526

# 527 **Table 1. MCMCglmm results for the different models.** For each model we report the

- 528 posterior mean, the 95 % credible interval, the pMCMC values and the 95 % credible interval
- 529 for heritability. Significant (< 0.05) pMCMC values are in bold.