1	Systematic Analysis of Metabolic Pathway Distributions of Bacterial Energy Reserves
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18	
19	Abstract
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21	Metabolism of energy reserves are essential for bacterial functions such as pathogenicity,
22	metabolic adaptation, and environmental persistence, etc. Previous bioinformatics studies
23	have linked gain or loss of energy reserves such as glycogen and polyphosphate (polyP) with
24	host-pathogen interactions and bacterial virulence based on a comparatively small number of
25	bacterial genomes or proteomes. Thus, understanding the distribution patterns of energy
26	reserves metabolism across bacterial species provides a shortcut route to look into bacterial
27	lifestyle and physiology theoretically. So far, five major energy reserves have been identified
28	in bacteria due to their effective capacity to support bacterial persistence under nutrient
29	deprivation conditions, which include wax ester (WE), triacylglycerol (TAG),
30	polyhydroxyalkanoates (PHA), polyphosphate, and glycogen. Although unknown pathways
31	directly involved in energy reserves keep being discovered with the continuous endeavour of
32	molecular microbiologists and it is currently rather clear about the enzymes related with the
33	metabolism of energy reserves, there is a lack of systematic study of the pathway or key

34 enzyme distributions of the five energy reserves in bacteria from an evolutionary point of

view. With the fast development of sequencing technology, abundant bacterial proteomes are available in public database now. In this study, we sourced 8214 manually reviewed bacterial reference proteomes from UniProt database and used statistical models to search homologous sequences of key enzymes related with energy reserves. The distribution patterns of the pathways for energy reserves metabolism are visualized in taxonomy-based phylogenetic trees. According to the study, it was revealed that specific pathways and enzymes are associated with certain types of bacterial groups, which provides evolutionary insights into the understanding of their origins and functions. In addition, the study also confirmed that loss of energy reserves is correlated with bacterial genome reduction. Through this analysis, a much clearer picture about energy reserves metabolism in bacteria is present, which could serve a guide for further theoretical and experimental analyses of energy reserves metabolism in bacteria. Keywords Energy reserve, Hidden Markov model, Evolution, Proteome, Taxonomy 

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## 70 Introduction

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72 Due to the versatility of environmental niches that bacteria colonize through millions of years 73 adaptation and evolution, bacteria have been equipped with specialized sets of metabolic 74 pathways so as to live optimally in these environments, which can be reflected in their characteristic genomes, gene transcription profiles, and also proteomes.<sup>1</sup> Previously, 75 76 comparative genomics studies have shown that glycogen metabolism loss could serve as an 77 indicator for bacterial parasitic lifestyle and polyP metabolism gain seems to link with freeliving lifestyle and stronger bacterial virulence potential.<sup>2,3</sup> In addition, it has been observed 78 that metabolism loss of glycogen or polyP is associated with shrunk genome size, leading to a 79 hint of genome reduction trend.<sup>2,4</sup> Both glycogen and polyphosphate are representative 80 81 energy reserves in bacteria. Thus, presence or absence of energy reserves in bacteria could be 82 important for *in silico* analysis of bacterial physiology and lifestyle, especially when large 83 number of sequenced bacterial genomes are available and many of those are unculturable 84 through traditional laboratory techniques.

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86 It is well known now that energy reserves play essential roles in bacteria for their regular 87 activities to sense and respond to the changing environments with different types of stresses, such as temperature fluctuation and nutrient deprivation, etc.<sup>4</sup> Although there are many 88 89 different energy-related compounds, not all of them can be classified as energy reserves. 90 According to Wilkinson, three principles should be satisfied for a compound to be considered 91 as an energy reserve, which are: 1) accumulation when energy is over-supplied, 2) utilization 92 when energy is insufficient, and 3) apparent advantages by consuming the compound when compared with those without it.<sup>5</sup> Through physiological and biochemical studies, five energy 93 94 storage compounds are regarded to meet the criteria, which are WE, TAG, PHAs, polyP and glycogen.2,4-6 95

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97 Although several studies have attempted to investigate the distributions of these energy 98 reserves in bacteria, most of these studies are based on small sets of bacterial genomes or 99 proteomes. No systematic analysis exists that is based on current available reference 100 proteomes from the evolutionary point of view.<sup>2,4,7-10</sup> In this study, we collected 8214 101 manually-reviewed bacterial proteomes from UniProt database<sup>11</sup> and sourced key enzymes 102 involved directly in the metabolism of energy reserves from public literature and database 103 (Table 1). Full statistical sequence models were constructed *de novo* for these enzymes based 104 on hidden Markov models via HMMER package, which were then used to screen for homologous sequences in all bacterial proteomes.<sup>12</sup> All distribution patterns were presented 105 106 in Supplementary Table S1. In order to gain a clearer view about enzymes distributions of 107 the enzymes along the evolutionary paths, we incorporated phylogenetic trees with our dataset via NCBI taxonomy identifiers.<sup>13</sup> Through a combinational analysis of the pathways 108 109 in the phylogenetic tree, we identified interesting distribution patterns of energy reserves that 110 are linked with specific groups of bacteria and their lifestyle potentials, which may improve 111 our understanding of the functions of energy reserves in bacteria. In addition, systematic 112 analysis also gives us an overview of enzyme distributions, which could serve a guide for 113 further theoretical and experimental analyses of energy reserves metabolism in bacteria.

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## 115 Materials and Methods

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## 117 Proteomes and enzymes collection

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119 Bacterial proteomes were downloaded from UniProt database by using two keywords, Bacteria and Reference Proteomes, as filters.<sup>11</sup> A total of 8282 bacterial proteomes were 120 121 collected at the downloaded time in 2018 and only 8214 bacterial proteomes were kept due to 122 outdated taxonomy identifiers that cannot be identified in NCBI taxonomy database when constructing phylogenetic trees.<sup>13</sup> A complete list of all the bacteria with bacterial names, 123 UniProt proteome identifiers, proteome sizes, and distribution patterns of enzymes is 124 125 available in the **Supplementary Table S1**. As for the metabolism of the five major energy 126 reserves, only key enzymes are considered. For the synthesis of WE and TAG, wax ester 127 synthase/acyl-CoA:diacylglycerol acyltransferase (WS/DGAT) is studied while triacylglycerol lipase (Lip) was screened due to its essential role in the degradation of WE 128 and TAG.<sup>10,14</sup> For metabolism of another neutral lipid polyhydroxyalkanoates, enzymes PhaA, 129 PhaB, PhaC are in the synthesis pathway and PhaZ is in the degradation pathway.<sup>15</sup> There are 130 131 two different PhaZs, that is, intracellular PhaZ and extracellular PhaZ, both of which are 132 analysed in this study. As for polyP, the key enzyme PPK1 for synthesis and two degradation enzymes, intracellular PPK2 and extracellular PPX, are included.<sup>2</sup> Finally, for glycogen 133 metabolism, two synthesis pathways are considered. The first one involves GlgC, GlgA, and 134 GlgB.<sup>4</sup> The second pathway is TreS, Pep2, GlgE, and GlgB.<sup>16</sup> Key enzyme Rv3032 in 135 136 another pathway related with glycogen metabolism and capsular glucan is only briefly

mentioned.<sup>16</sup> In addition, archaeal type GlgB was also included for comparative analysis. For
details of these enzymes, please refer to **Table 1**.

- 139
- 140 De novo construction of HMMs
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142 Seed sequences related with metabolism of energy reserves were selected through a 143 comprehensive up-to-date review of literature and were listed in **Table 1**. These seed proteins 144 were used for constructing statistical sequence models based on HMMs via HMMER package.<sup>12</sup> After obtaining sequences for all seed proteins, remote BLAST was performed to 145 collect homologous sequences for each seed protein from the NCBI non-redundant database 146 of protein sequences.<sup>17</sup> Perl script nrdb90.pl was used to remove the homologous sequences 147 with more than 90% similarity from the selected proteins.<sup>18</sup> The standalone command-line 148 149 version of MUSCLE was used so the MSAs were done automatically.<sup>19</sup> Heads or tails of multiple sequence alignments tend to be more inconsistent.<sup>20</sup> Thus, all MSAs were manually 150 edited to remove heads and tails by using JalView.<sup>21</sup> HMMER was selected for the 151 152 construction of HMMs through hmmbuild command. Since HMMER only recognizes 153 STOCKHOLM format, all MSAs results were converted from FASTA to STOCKHOLM 154 format. For searching homologs in bacterial proteomes, routine procedures are performed by 155 following HMMER User's Guide eddylab.org/software/hmmer3/3.1b2/Userguide.pdf. 156 Results obtained from HMM screening were present in Supplementary Table S1. The 157 presence (copy numbers) or absence of a specific enzyme in a certain bacterial proteome is 158 present.

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Phylogenetic trees were first constructed based on NCBI taxonomy identifiers for all bacteria in this study via commercial web server PhyloT <u>https://phylot.biobyte.de/</u>, which were then visualized through the online interactive Tree of Life (iTOL) server <u>https://itol.embl.de/</u>.<sup>22</sup> Distribution patterns of enzymes and their combinations in terms of energy reserves were added to the trees through iTOL pre-defined tol\_simple\_bar template.<sup>22</sup>

167

168 Statistical analysis

<sup>160</sup> Data visualization

170 Unpaired two-tailed Student's *t*-test was used for statistical analysis. Significant difference

- 171 was defined as *P*-value < 0.05.
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173 **Results** 

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- 175 Wax ester and triacylglycerol
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177 The key enzyme that is involved in WE and TAG synthesis in bacteria is WS/DGAT. 178 Through the screening of HMM-based statistical models, 950 out of 8214 bacterial species 179 harbour single copy or multiple copies of WS/DGAT homologs, which are mainly present in 180 phylum Actinobacteria and the super-phylum Proteobacteria. Only sporadic bacteria in 181 groups such as FCB (a.k.a Sphingobacteria) and PVC (a.k.a. Planctobacteria), etc. have 182 WS/DGAT. No species belonging to phylum Firmicutes has WS/DGAT. As for the 183 unclassified bacteria, although no WS/DGAT is identified, they will not be studied due to 184 their unclear nature at current stage. For details, please refer to Figure 1(A). By comparing 185 the proteome sizes of bacteria species with or without WS/DGAT, we found that bacteria 186 with WS/DGAT have average proteome size of 5200 proteins/proteome while those without 187 WS/DGAT have average proteome size of 3047 proteins/proteome (*P-value*<0.001).

188

189 [insert Figure 1.]

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191 Within the major phylum of *Proteobacteria*, WS/DGAT is not evenly distributed and  $\gamma$ -192 Proteobacteria have more species with multi-copy WS/DGAT. In addition, two orders 193 *Rhodobacterales* (305 species) and *Enterobacterales* (168 species) that belong to  $\alpha$ - and  $\gamma$ -194 Proteobacteria phylum, respectively do not have any WS/DGAT except for one species 195 Ahrensia sp. R2A130. As for the phylum Actinobacteria, three WS/DGAT abundant regions 196 (R1, R2, and R3) and one WS/DGAT absence region (R4) in the phylogenetic tree are worth 197 of further exploration. R1 includes only one family *Mycobacteriaceae* (115 species) in which 198 bacteria have up to 24 homologs of WS/DGAT. R2 includes families of Dietziaceae, 199 Gordoniaceae, Nocardiaceae, Tsukamurellaceae, and Williamsiaceae. R3 includes families 200 of Nocardioidaceae and Pseudonocardiales. R4 is the family Corynebacteriaceae (69 species) 201 that have WS/DGAT-free bacteria only. As for the degradation of TAG and probable 202 degradation of WE in bacteria, Lip plays important roles. Only 394 bacterial species have the

203 enzyme. Distribution analysis showed that this enzyme is almost exclusively present in the

super phylum *Proteobacteria*, especially in the  $\beta$ -,  $\gamma$ -, and  $\delta$ -*Proteobacteria* phylums.

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206 Polyhydroxyalkanoates

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208 Three enzymes (PhaA, PhaB and PhaC) involve in the synthesis of PHAs and two enzymes 209 (intracellular PhaZ and extracellular PhaZ) involve in the utilization of PHAs in bacteria. In 210 this study, we focused on the distribution patterns of PHA synthesis pathway PhaABC and 211 also the two degradation enzymes. Please refer to Figure 1(B) for details. Preliminary 212 analysis showed that 836 bacterial species with average proteome size of 4891 213 proteins/proteome have PhaABC pathway while 536 bacterial species with average proteome 214 size of 718 proteins/proteome do not have the pathway (*P-value*<0.001). In addition, when 215 PhaABC is missing in bacteria, degradation enzymes are also absent except for one species 216 Chloroflexi bacterium. Evolutionary analysis based on phylogenetic tree found that complete 217 PHA synthesis and degradation pathway mainly distribute in  $\alpha$ - and  $\beta$ -*Proteobacteria*. Some 218 bacteria in phylum Actinobacteria and genus Bacillus also harbor PhaABC synthesis pathway. 219 However, intracellular PhaZ is rarely present in these species. That is the major difference 220 when comparing with Proteobacteria phylums.

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#### 222 *Polyphosphate*

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224 Three key enzymes are related with polyP metabolism. PPK1 is responsible for polyP 225 synthesis. A total of 5209 bacterial species has PPK1. PPK2 and PPX are used for polyP 226 degradation intracellularly and extracellularly, respectively. 3330 bacterial species have 227 PPK1, PPK2 and PPX enzymes while 2215 bacteria species do not have any of the three 228 enzymes. Their average proteome sizes are 4459 proteins/proteome and 1618 229 proteins/proteome, respectively (*P-value*<0.001). In our analysis, we independently reviewed 230 the distribution patterns of the three enzymes along phylogenetic trees and the result is 231 displayed in **Figure 1(C)**. The three enzymes are widely distributed across bacterial species. 232 Comparison shows that *Firmicutes* phylum seems to favour PPX more than PPK2 for polyP 233 degradation. In addition, although it was observed that several regions have missing synthesis 234 enzyme or degradation enzyme, only *Mollicutes* class (94 bacterial species) shows apparent 235 lack of the three polyP metabolism enzymes in the phylogenetic tree.

237 Glycogen

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239 Glycogen metabolism in bacteria has multiple pathways, which includes the classical 240 pathway (GlgC, GlgA, GlgB, GlgP and GlgX), trehalose pathway (TreS, Pep2, GlgE, and 241 GlgB), and Rv3032 pathway. In this study, we only focused on the first two glycogen 242 synthesis pathways and compares their distribution patterns in bacteria. In addition, there are 243 two types of glycogen branching enzymes. One is the common bacterial GlgB belonging to 244 GH13 in CATH database and the other one is known as archaeal GlgB belonging to GH57 in CATH database.<sup>23</sup> We also look into their distribution patterns in bacteria since GlgB is 245 246 essential in determining glycogen branched structure. Our study showed that 3924 bacteria 247 has classical synthesis pathway (GlgC, GlgA, and GlgB) and their average proteome size is 248 4163 proteins/proteome while only 489 bacterial species (average proteome size of 1050 249 proteins/proteome) do not have these enzymes (*P-value*<0.001). Comparison of the two 250 synthesis pathways confirmed that classical synthesis pathways are widely distributed across 251 species. Random loss of the pathways can be inferred from Figure 1(D). In contrast, 252 trehalose pathway is tightly associated with Actinobacteria phylum with rarely sporadic 253 presence in other bacterial species. As for the two GlgBs, GH13 GlgB is widely distributed in 254 4451 bacterial species with a trend of random loss while GH57 GlgB is found in 755 bacteria 255 that are mainly belonging to groups such as *Terrabacteria* and PVC, etc.

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### 257 Discussion

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259 From an evolutionary point of view, if an organism can obtain compounds from other sources, 260 it will tend to discard its own biosynthetic pathway.<sup>24</sup> For example, *Rickettsia* species, 261 Mycoplasma species, and Buchnera, etc. have extensively reduced genome and abundant energy metabolism pathways are eliminated.<sup>24</sup> In addition, although common belief is that 262 263 organism will evolve toward complexity, recent analysis supported that reduction and 264 simplification could be the dominant mode of evolution while complexification is just a transit stage based on the neutral genetic loss and streamlining hypothesis.<sup>25</sup> Independent 265 266 analyses of the distribution patterns of the five energy reserves in bacteria found a consistent 267 and statistically significant correlation between energy reserve loss and reduced proteome 268 size. Previous studies have already reported such a correlation for glycogen and polyP in bacteria.<sup>2,4</sup> In this study, we extend this conclusion by the addition of the reserves WE, TAG, 269 270 and PHAs, which has not been reported before. It has been confirmed that most of bacteria

271 losing energy reserve metabolism pathways tend to have a niche-dependent or host-272 dependent lifestyle, which is the case in our study<sup>2,4,6</sup> Thus, by simply looking into bacterial 273 energy reserve metabolism, we could obtain preliminary views in terms of their lifestyles,

though other factors and evidences are required for verification.

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276 WS/DGAT is a bifunctional enzyme and key to the biosynthesis of WE and TAG in bacteria. 277 It was previously thought that WE and TAG are very uncommon lipid storage compounds in 278 bacteria when compared with plants and animals until the novel enzyme was identified.<sup>10</sup> 279 From our analysis, it can be seen that many bacteria belonging to both Gram-positive and 280 Gram-negative categories have the ability to synthesize WE and TAG. However, studies 281 about WS/DGAT are mainly restricted to Mycobacteria genus (Actinobacteria phylum) and 282 Acinetobacter genus ( $\gamma$ -Proteobacteria phylum) due to their clinical significance and 283 industrial use potentials, respectively. It is also apparent to notice that WS/DGAT in phylum 284 Actinobacteria tend to have number of homologs far more than other phylums, especially for 285 the bacteria in the three regions (R1, R2, and R3) mentioned above, which include 286 *Mycobacteriaceae*, Dietziaceae, Gordoniaceae, Nocardiaceae, Tsukamurellaceae, 287 Williamsiaceae, Nocardioidaceae and Pseudonocardiales. On the other hand, no WS/DGAT 288 is found in the family of *Corynebacteriaceae* (R4), although *Corynebacteriaceae* is closely 289 related with *Mycobacteriacea*.<sup>26</sup> In addition, bacteria in phylum *Firmicutes* do not have any 290 WS/DGAT enzyme, neither. Screen of Phospholipid:diacylglycerol acyltransferase (PDAT), an enzyme that catalyses the acyl-CoA-independent formation of triacylglycerol in yeast and 291 plants, found no homologs in bacteria at all.<sup>27</sup> Thus, this enzyme is exclusively present in 292 293 eukaryotic organisms.

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295 The family Corynebacteriaceae contains the genera Corynebacterium and monospecific 296 genus *Turicella.*<sup>28</sup> *Mycobacterium tuberculosis* is the dominant species in *Mycobacteriaceae* 297 (97 species). Mycolic acid (MA) with wax ester is the oxidized form of MA in 298 Mycobacterium tuberculosis, which forms an integrated cell wall and plays essential role in 299 host invasion, environmental persistence, and also drug resistance. In addition, 300 Mycobacterium tuberculosis also relies on wax ester for dormancy, although WE function in 301 M. tuberculosis requires more investigations. Thus, abundance of WS/DGAT in 302 Mycobacteriacea has selective advantages in evolution. Considering the abundance of wax 303 ester and its slow degradation, it could also contribute to the long-term survival (more than 304 360 days) of *M. tuberculosis* in environment.<sup>6</sup> On the other hand, *Corynebacterium* do not

rely on oxidized mycolic acid while *Turicella* does not have mycolic acid at all.<sup>29,30</sup> Thus, 305 306 there is no need for them to be equipped with the WS/DGAT enzyme. However, how 307 Mycobacteriaceae gain WS/DGAT or Corynebacteriaceae lose it is not clear and needs more 308 studies. As for Firmicutes, the low G+C counterpart of the high G+C Actinobacteria, most of 309 its species can form endospores and are resistance to extreme environmental conditions such as desiccation, temperature fluctuation, and nutrient deprivation, etc.<sup>31</sup> Thus, they may not 310 311 need compounds such as WE or TAG for storing energy and dealing with harsh external 312 conditions. How G+C content in the two phylums may impact on the gain or loss of wax 313 ester metabolism is not known.

314

315 PHAs are a group of compounds that include but not limited to components such as polyhydroxybutyrate (PHB) and polyhydroxyvalerate (PHV), etc., among which PHB is the 316 most common and most prominent member in bacteria.<sup>32,33</sup> Synthesis of PHB involves PhaA, 317 PhaB and PhaC.<sup>32</sup> In addition, there are two types of PHB degradation enzymes, intracellular 318 PhaZ and extracellular PhaZ.<sup>34</sup> Phylogenetic analysis revealed that PHB metabolism is 319 320 mainly in *Proteobacteria* and *Actinobacteria* (Figure 1(B)). Moreover, *Bacillus* genus is also 321 abundant in PHB metabolism. The major difference between Proteobacteria and 322 Actinobacteria is that Actinobacteria rarely has intracellular PhaZ and relies mainly on 323 extracellular PhaZ for PHB degradation. The reason behind the difference could be that 324 Actinobacteria has other mechanisms for PHB degradation intracellularly. In addition, Actinobacteria are widespread in water and soil and frequently experience nutrient 325 326 shortage.<sup>35</sup> Thus, they are more focused on storing PHB intracellularly as energy reserve and 327 synthesizing extracellular PhaZ to utilize environmental PHBs released by other organisms.<sup>36</sup> 328 By doing so, they could have great advantage over other organisms in term of viability under 329 harsh conditions. It is also interesting to notice that *Bacillus* genus accumulates PHB 330 intracellularly and has been developed for industrial production of PHB.<sup>37</sup>

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PolyP has been known to be ubiquitous in different life domains and claimed to be present in all cells in nature due to their essential roles as energy and phosphate sources.<sup>2</sup> Although a bunch of enzymes are directly linked with polyP metabolism, we only focused on PPK1, PPK2, and PPX in this study because they are most abundant and essential enzymes. **Figure 1**(**C**) gives an overview of the universally wide distribution of the three enzymes. Although 2215 species across the phylogenetic tree are lack of all three enzymes, an apparent gap was only spotted in the phylum *Tenericutes* and was further confirmed to be *Mollicutes*. A

previous analysis of 944 bacterial proteomes have shown that bacteria with complete loss of polyP metabolism (PPK1, PPK2, PAP, SurE, PPX, PpnK and PpgK) pathway are heavily host-dependent and tend to be obligate intracellular or symbiotic.<sup>2</sup> Consistently, *Mollicutes* is a group of parasitic bacteria that are evolved from a common *Firmicutes* ancestor through reductive evolution.<sup>38</sup> From here, we can infer that not only loss of complete metabolism pathway, but also even loss of key enzymes in an energy reserve metabolism could give a hint about bacterial lifestyle.

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347 For glycogen metabolism, we compared two synthesis pathways, the classical pathway (GlgC, 348 GlgA and GlgB) and the newly identified trehalose-related pathway (TreS, Pep2, GlgE and GlgB).<sup>4,16</sup> Although initial analysis via BLAST search showed that GlgE pathway is 349 350 represented in 14% of sequenced genomes from diverse bacteria in 2011, our studies showed 351 that, when searching for the complete GlgE pathway by including another three enzymes, it is 352 dominantly restricted to Actinobacteria phylum while classical pathway is widely present in the tree as seen in **Figure 1(D**).<sup>16</sup> In addition, the two types of GlgBs also show interesting 353 354 patterns. Although GH13 GlgB is widely identified in 54.18% bacteria, GH57 GlgB is only 355 present in 9.19% bacteria with skewed distribution in groups such as Terrabacteria phylum 356 and PVC group, etc. Another study of 427 archaea proteomes found that the 11 archaea has 357 GH13 GlgB while 18 archaea has GH57 GlgB (unpublished data). Thus, the two GlgBs are 358 rarely present in archaea and mainly exist in bacteria. However, why trehalose-related 359 glycogen metabolism pathway is associated with Actinobacteria phylum still needs more 360 experimental exploration.

361

# 362 Conclusions

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364 Distribution patterns of key enzymes and their combined pathways in bacteria provided a 365 comprehensive view of how energy reserves are present and absent during evolutionary 366 process. In general, polyP is most abundant energy reserve in bacteria while polysaccharide 367 glycogen is the second most abundant compound. However, glycogen has multiple synthesis 368 pathways and its metabolism could have more impacts on bacterial physiology due to such 369 flexibility. For the three neutral lipids, there are comparatively minor energy reserves in 370 bacteria and mainly constrained in super phylum *Proteobacteria* and phylum *Actinobacteria*. 371 Within the group, more bacteria have the capacity to accumulate WE and TAG rather than 372 PHB due to the widespread distribution of wax-dgaT homologs. polyP only acts as a transit

energy reserve while neutral lipids are more sustainable energy provider.<sup>4,39</sup> Thus, neutral 373 374 lipids could be major player for bacterial persistence under harsh conditions such terrestrial 375 and aquatic environments. As for glycogen, its ability for bacterial environmental viability is 376 still controversial due to the consideration of its interior structures. Its widespread distribution 377 in bacteria also indicated that its metabolism is tightly linked with bacterial essential 378 activities. In sum, through this study, we obtained a much clearer picture about how energy 379 reserves are associated with certain types of bacteria. Further investigation via incorporating 380 bacterial physiology and lifestyle could supply much more feasible explanations to illustrate 381 these linkages, although experimental evidences are indispensable to confirm these 382 theoretical analyses.

383

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385

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391

#### **392** Author Contributions

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LW conceived the core idea of this study. LW, MJW, JY, YH, QL, and YX did all datacollection, data visualization, and statistical analysis.

396

#### **397 Declaration of Conflicting Interests**

- 398
- 399 The author declares that there is no conflict of interests.

**Table 1** Key enzymes and corresponding UniProt sequences used in this study for statistical modelling via HMMER package.

<b>Reference Species</b>	Gene	Enzyme	Length	UniProt ID
Haladaptatus paucihalophilus	ppk1	Polyphosphate kinase	707	E7QTB5
Thiomicrospira cyclica	ppk2	Polyphosphate kinase 2	264	F6DAB2
Metallosphaera sedula	gppA	Ppx/GppA phosphatase	420	A4YFE8
Haloferax massiliensis	glgC	Glucose-1-phosphate adenylyltransferase	322	A0A0D6JRD4
Pyrococcus abyssi	glgA	Glycogen synthase	437	Q9V2J8
Thermococcus kodakaraensis	$glgB^*$	1,4-alpha-glucan branching enzyme (GH57)	675	Q5JDJ7
Escherichia coli	glgB	1,4-alpha-glucan branching enzyme (GH13)	728	P07762
Mycobacterium tuberculosis	treS	Trehalose synthase/amylase	601	P9WQ19
Mycobacterium tuberculosis	pep2	Maltokinase	455	Q7DAF6
Picrophilus torridus	glgE	Alpha-1,4-glucan: maltose-1-phosphate maltosyltransferase	630	Q6L2Z8
Mycobacterium tuberculosis	Rv3032	Glycogen synthase	414	P9WMY9
Haloferax mediterranei	phaA	Beta-ketothiolase	383	I3R3D1
Haloarcula hispanica	phaB	Acetoacetyl-CoA reductase	247	E1U2R6
Haloarcula hispanica	phaC	PHA synthase subunit C	474	G0HQZ6
Burkholderia pseudomallei	phaZ <sup>&amp;</sup>	Intracellular polyhydroxyalkanoate depolymerase	423	Q3JIM5
Rhizobium fredii	phaZ	Extracellular polyhydroxyalkanoate depolymerase	369	G9AII6
Saccharomyces cerevisiae	PDAT <sup>#</sup>	Phospholipid: diacylglycerol acyltransferase	661	P40345
Acinetobacter baylyi	wax-dgaT	Wax Ester Synthase/Acyl Coenzyme A: Diacylglycerol Acyltransferase	458	Q8GGG1

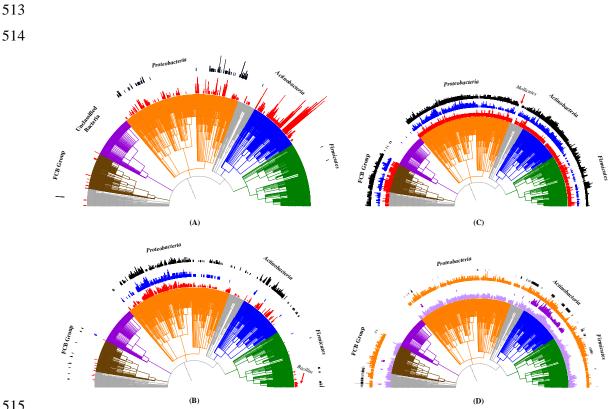
	Pseudomonas aeruginosa	lip	Triacylglycerol lipase	311	P26876				
402				I					
403	*Archaeal type of glycogen branching enzyme (encoded by glgB gene) belonging to GH57 class in CATH database. *Specialized intracellular								
404	PHA depolymerase. <sup>#</sup> TAG synthesis enzyme exclusively present in eukaryotes.								
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516 Figure 1 Evolutionary analysis of metabolic pathway distributions of energy reserves in 8214 517 bacterial species. Four groups of bacteria are highlighted, which are *Firmicutes* (green), 518 Actinobacteria (red), Proteobacteria (orange), Unclassified Bacteria (violet), and FCB group 519 (brown). (A) Distribution patterns of key enzyme WS/DGAT (red bar) and Triacylglycerol 520 lipase Lip (black bar) along the evolutionary tree that is responsible for the synthesis and 521 utilization of neutral lipids in bacteria. WS/DGAT is abundant in Actinobacteria with 522 multiple homologs while Firmicutes do not have any WS/DGAT-harboring organisms. 523 Proteobacteria has moderate number of bacteria with WS/DGAT enzymes. For FCB group 524 and unclassified bacteria, WS/DGAT is only sporadically present. As for the utilization of 525 neutral lipids, the enzyme Lip is almost exclusively restricted to the phylum Proteobacteria 526 ( $\beta$ -,  $\gamma$ -,  $\delta$ , and  $\epsilon$ -). Only one organisms belonging to  $\alpha$ -proteobacteria has Lip homologous 527 enzyme. (B) Distribution patterns of PHB synthesis pathway (PhaA, PhaB and PhaC) in red 528 bar and degradation enzymes intracellular PhaZ (blue bar) and extracellular PhaZ (black bar) 529 along the evolutionary tree. For FCB group and unclassified bacteria, almost no PHB 530 metabolism exists. Proteobacteria are abundant in terms of PHB synthesis pathway and the 531 two types of degradative enzymes while Actinobacteria have moderate level of synthesis 532 ability and extracellular PhaZ. The intracellular PhaZ is largely missing in Actinobacteria. As

533 for *Firmicutes*, the PHB metabolism mainly distributes in the genus of *Bacillus* (red arrow). 534 (C) Distribution patterns of key enzyme PPK1 (red bar), PPK2 (blue bar), and PPX (black 535 bar) along the evolutionary pathway that is responsible for main synthesis and degradation 536 pathways of polyphosphate in bacteria. Polyphosphate metabolism is widely distributed in 537 bacteria. Unclassified bacteria and the class of *Mollicutes* (red arrow) belonging to phylum 538 *Tenericutes* have apparent loss of polyphosphate metabolism in the tree, although data 539 analysis showed 2215 bacterial species do not have PPK1, PPK2 and PPX. (D) Distribution 540 patterns of two glycogen synthesis related pathways and two glycogen branching enzymes 541 (GH13 GlgB and GH57 GlgB) along the evolutionary tree. GlgB is responsible for the highly 542 branched structure of glycogen in bacteria. Full glycogen synthesis pathway includes GlgC, 543 GlgA and GlgB (light violet bar), which distributes widely in bacteria. Trehalose-based 544 glycogen synthesis pathway includes TreS, Pep2, GlgE, GlgB (dark violet bar) and is mainly 545 concentrated in the Actinobacteria phylum. Distributions of the two GlgB enzymes show that 546 GH57 GlgB (black bar) is mainly present in *Terrabacteria* group. In addition, GH57 GlgB is 547 also identified in PVC group, Spirochaetes, Acidobacteria, Fusobacteria, Thermotogae, 548 Nitrospirae, Aquificae, Synergistetes, Elusimicrobia, Nitrospinae/Tectomicrobia group, 549 Thermodesulfobacteria, Rhodothermaeota, and Dictyoglomi. In contrast, GH13 GlgB is 550 widely distributed in bacterial species.