

ORIGINAL ARTICLE

Evolutionary origin of a streamlined marine bacterioplankton lineage

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Planktonic bacterial lineages with streamlined genomes are prevalent in the ocean. The base composition of their DNA is often highly biased towards low G + C content, a possible source of systematic error in phylogenetic reconstruction. A total of 228 orthologous protein families were sampled that are shared among major lineages of Alphaproteobacteria, including the marine free-living SAR11 clade and the obligate endosymbiotic *Rickettsiales*. These two ecologically distinct lineages share genome sizes of <1.5 Mbp and genomic G + C content of <30%. Statistical analyses showed that only 28 protein families are composition-homogeneous, whereas the other 200 families significantly violate the composition-homogeneous assumption included in most phylogenetic methods. RAXML analysis based on the concatenation of 24 ribosomal proteins that fall into the heterogeneous protein category clustered the SAR11 and *Rickettsiales* lineages at the base of the Alphaproteobacteria tree, whereas that based on the concatenation of 28 homogeneous proteins (including 19 ribosomal proteins) disassociated the lineages and placed SAR11 at the base of the non-endosymbiotic lineages. When the two data sets were concatenated, only a model that accounted for compositional bias yielded a tree identical to the tree built with composition-homogeneous proteins. Ancestral genome analysis suggests that the first evolved SAR11 cell had a small genome streamlined from its ancestor by a factor of two and coinciding with an ecological transition, followed by further gradual streamlining towards the extant SAR11 populations.

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Introduction

Planktonic bacterial lineages with streamlined genomes are widespread in the ocean (Swan *et al.*, 2013; Giovannoni *et al.*, 2014). Prominent examples are alphaproteobacterial SAR11 (Giovannoni *et al.*, 2005), gammaproteobacterial SAR86 (Dupont *et al.*, 2012), cyanobacterial *Prochlorococcus* (Dufresne *et al.*, 2003; Rocap *et al.*, 2003) and betaproteobacterial OM43 (Giovannoni *et al.*, 2008). Members of these lineages are either uncultivated or difficult to propagate when cultures are available. It is generally assumed that these streamlined bacteria evolved from lineages with larger genomes through genome reduction processes. To address this hypothesis, the evolutionary relationships of the streamlined lineages and their non-streamlined relatives need to be resolved. For instance, ancestral reconstruction based on a robust phylogeny in which *Prochlorococcus* evolved from their larger *Synechococcus* relatives supported the genome streamlining hypothesis for *Prochlorococcus* (Luo *et al.*, 2011).

In the case of SAR11, however, several alternate evolutionary positions have been proposed in the Alphaproteobacteria tree, all of which have strong statistical support in the evolutionary model underlying the analysis (Thrash *et al.*, 2011; Rodríguez-Ezpeleta and Embley, 2012; Viklund *et al.*, 2012; Luo *et al.*, 2013) (Figure 1). Although the first evolved SAR11 cell is consistently predicted to have a streamlined genome, the genome size of its immediate ancestor varies considerably depending on where SAR11 is located in the Alphaproteobacteria tree (Luo *et al.*, 2013). If SAR11 and *Rickettsiales* form a monophyletic clade at the basal node of the tree (Thrash *et al.*, 2011; Figure 1a), it is predicted that the immediate ancestor had a similar genome size as the first SAR11 cell, and thus genome streamlining following the divergence of the SAR11 lineage is not well supported. If SAR11 does not cluster with *Rickettsiales* but is basal to other Alphaproteobacteria lineages (Luo *et al.*, 2013; Figure 1b), the first SAR11 cell is predicted to be a descendant of an intermediate-size ancestor. If SAR11 is positioned at the middle of the non-endosymbiotic lineages (Viklund *et al.*, 2012; Luo *et al.*, 2013; Figures 1c and d), the first SAR11 is predicted to have evolved from an ancestor with a large genome size, and the genome streamlining hypothesis is most strongly supported. Therefore, collecting additional evidence to help resolve the

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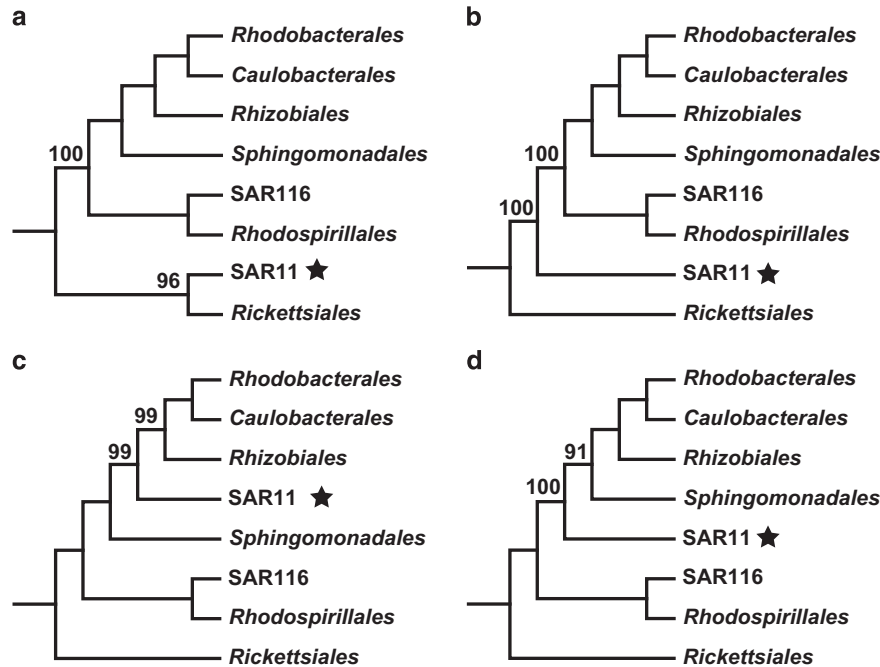


Figure 1 Four alternate evolutionary positions of the SAR11 clade in the Alphaproteobacteria phylogeny. The statistical support values were obtained from previous publications (Thrash *et al.*, 2011; Viklund *et al.*, 2012; Luo *et al.*, 2013).

evolutionary position of SAR11 was the primary goal of the present study.

Materials and methods

Taxon sampling

A total of 66 alphaproteobacterial and 8 gammaproteobacterial and betaproteobacterial outgroup genome sequences were obtained from GenBank. The alphaproteobacterial genomes include 10 associated with the marine Roseobacter clade, 1 with *Parvularculales*, 3 with *Hyphomonadaceae*, 5 with *Caulobacterales*, 14 with *Rhizobiales*, 6 with *Sphingomonadales*, 5 with the marine SAR116 clade, 7 with *Rhodospirillales*, 8 with the marine SAR11 clade and 7 with *Rickettsiales*. Among the 10 Roseobacter clade members, genomes of five strains are closed and the remaining were estimated to be complete or nearly so (Luo *et al.*, 2013). Among the eight SAR11 genomes, all are closed except that strain HIMB114 consists of scaffold with one contig (Grote *et al.*, 2012). Among the five SAR116 genomes, one (HIMB100) has 10 contigs (Grote *et al.*, 2011) and three are uncultivated single cell genomes (SCGC AAA015-N04, SCGC AAA536-K22, SCGC AAA536-G10) with a variable success in recovering the genomic DNA (69%–91%) (Swan *et al.*, 2013). Genomes of all other lineages are closed. In the subsequent analyses, all of the 66 alphaproteobacterial genomes were used in phylogenetic tree reconstructions, whereas the three single-cell genomes and HIMB100 were not included in ancestral genome reconstruction because of their relatively low recovery of genome content. Taxon sampling was carried out to maximize the

phylogenetic diversity by sampling the major taxonomic units (Family/Genus) in each well-accepted Order of Alphaproteobacteria, and to minimize the total number of taxa so that the computation for phylogenomic reconstruction could be completed with a reasonable amount of time. Under this principle, the strains used for phylogenomic analyses were chosen randomly.

Ortholog identification, character selection and phylogenomic tree reconstruction

Orthologous gene families among the above 74 genomes were identified using the OrthoMCL software (Li *et al.*, 2003). Inparalog, copies in a gene family were discarded. A total of 228 gene families, including 43 ribosomal protein families, were chosen for phylogenetic analyses, each of which contains at least 6 gene members affiliated with the Roseobacter clade, 3 with *Caulobacterales*, 8 with *Rhizobiales*, 4 with *Sphingomonadales*, 4 with marine SAR116 clade, 4 with *Rhodospirillales*, 5 with the marine SAR11 clade and 5 with *Rickettsiales*, and 4 with outgroup. This relatively small number of shared genes is presumably influenced by the inclusion of the free-living marine SAR11 clade and the endosymbiotic *Rickettsiales*, two streamlined lineages with their genomic content shaped by their distinct environments, and by the presence of partial genomes of three single cells.

To obtain a more reliable alignment, seven independent alignment programs were used to align the orthologous amino acid sequences for each of the selected gene families. These programs are ClustalW (Larkin *et al.*, 2007), MAFFT (Katoh *et al.*, 2005),

MUSCLE (Edgar, 2004), T-coffee (Notredame *et al.*, 2000), DIALIGN (Morgenstern, 2004), Kalign (Lassmann and Sonnhammer, 2005) and OPAL (Wheeler and Kececioglu, 2007). Unreliable regions of the alignment were trimmed using the trimAl software (Capella-Gutiérrez *et al.*, 2009) using the parameters '-automated1 -reoverlap 0.55 -seqoverlap 60'. Some short partial sequences were automatically discarded using the above parameter setting; this is important in the analysis because of the many missing nucleotides in parts of the single cell genomes. The seven trimmed alignments for each gene family were then compared using trimAl and the one with the largest fraction of sites showing consistency with other alignments was selected. The selected alignments were subject to a ProtTest (Abascal *et al.*, 2005) analysis, which determines the best-fit amino acid substitution matrix and whether the among-site rate heterogeneity model is applicable.

As there is a substantial variation of G + C content among lineages, which is known to result in compositional heterogeneity among lineages at the amino acid sequence level (Gu *et al.*, 1998; Foster and Hickey, 1999; Singer and Hickey, 2000), the validity of the stationarity (compositional homogeneity) assumption for each of the 228 families was specifically tested using the posterior predictive simulation implemented in the P4 Bayesian phylogenetic software package (Foster, 2004).

For phylogenomic analyses, three data sets were compiled: the concatenation of the 28 composition-homogenous proteins (including 19 ribosomal proteins), of the 24 composition-heterogeneous ribosomal proteins and of the combined 52 proteins. The standard maximum likelihood method implemented in the MPI version of RAxML v7.3.0 software (Stamatakis, 2014) was used to analyze the three data sets separately. To account for the possibility that different proteins may have undergone distinct patterns of amino acid replacement, a data partition model was applied so that proteins are grouped into categories and proteins within each category have similar substitution patterns. The optimal partitioning scheme for each of the three data sets was determined separately by the PartitionFinder software (Lanfear *et al.*, 2012) according to Bayesian information criterion score. The RAxML tree was constructed using the 'PROTGAMMALG' model, which assumes amino acid substitution rates among sites follow a gamma distribution. The concatenated super-alignment was partitioned according to the optimal partitioning scheme. To obtain statistical confidence of internal branches, 100 pseudoreplicates were generated using the 'rapid bootstrap' method in RAxML.

Phylogenomic tree reconstruction using a Bayesian nonstationary model

Reduced alphabets were used to overcome the computational inefficiency issue of P4 (Foster, 2004) and alleviate the compositional bias by recoding the

amino acid sequences (with 20 character states) into the following six Dayhoff groups that correspond to most amino acid substitution matrices (Hrdy *et al.*, 2004): (cysteine), (alanine, serine, threonine, proline, glycine), (asparagine, aspartic acid, glutamic acid, glutamine), (histidine, arginine, lysine), (methionine, isoleucine, leucine, valine), (phenylalanine, tyrosine, tryptophan). This recoding scheme has been used to improve topological estimation in the presence of compositional heterogeneity in a number of phylogenomic studies (Cox *et al.*, 2008; Foster *et al.*, 2009; Nesnidal *et al.*, 2010), including a recent study of the evolutionary placement of the SAR11 clade (Rodríguez-Ezpeleta and Embley, 2012). The Dayhoff-recoded concatenated datasets of the 52 protein sequences (the 28 homogeneous and the 24 heterogeneous ribosomal proteins) were analyzed using multiple configurations of the NDCH (node-discrete composition heterogeneity) and NDRH (node-discrete rate matrix heterogeneity) models, general time reversible (GTR) substitution matrix plus four Gamma-distributed rate categories, and employing the polytomy prior (Lewis *et al.*, 2005). Ten replicate runs were performed for each configuration. In each replicate run, one cold and three heated MCMC chains were run for a total of 1 500 000 generations with trees sampled every 1000 generations. The first 500 000 generations were discarded as 'burn-in'. The model adequacy with respect to composition was assessed using the χ^2 homogeneity test on posterior distributed samples which were generated by posterior predictive simulation in P4. This test rejected the stationary model (1 composition vector plus 1 GTR rate matrix across the tree) ($P < 0.05$), while it suggested that a composition-heterogeneous model (two composition vector plus two GTR rate matrix across the tree) was adequate ($P > 0.05$). The phylogenomic trees were reconstructed using both the stationary and nonstationary models. The average standard deviation of split support was < 0.01 suggesting convergence was reached for all phylogenetic reconstructions. A majority-rule consensus tree was constructed from the post-burn-in trees.

Phylogenomic tree reconstruction using a Bayesian mixture model

Among-site compositional heterogeneity was accounted for by the CAT Bayesian mixture model (Lartillot and Philippe, 2004) implemented in the PhyloBayes MPI software package (Lartillot *et al.*, 2013). The Bayesian MCMC analyses were run with CAT-GTR model with a Gamma distribution of rates among sites using the concatenated datasets of the 52 protein sequences. Two independent MCMC runs were performed, each with $> 100\,000$ cycles. The first 20% of all runs were discarded as 'burn-in'. Convergence was reached with the maxdiff statistic of 0.08 and an effective sample size > 400 .

Computational time of the phylogenomic analyses

Phylogenomic analyses using the PhyloBayes MPI software and the P4 software are computationally expensive. All analyses were performed using a Linux cluster consisting of multiple 8-core or 12-core nodes (Intel-Xeon processors with different model numbers, including E5410, E5504, E5530 and X5650) varying in their clock speeds from 2.00 to 2.67 GHz. It took 56 days with 75 cores to complete each of the two independent PhyloBayes runs of the concatenated 52 protein sequences (74 taxa and 12 987 sites) employing the CAT-GTR model, with a maximum virtual memory used by all MPI processes of ~20 GB. The P4 software is not coded for parallel computing, and thus only one CPU core can be assigned to run the jobs. It took on average 25 days to complete each of the 10 replicate runs of the Dayhoff recoded data set of the 52 proteins for each configuration of the NDCH and NDRH models, with a maximum virtual memory use of ~2 GB. This computational burden imposed a constraint in the number of taxa that could be used in these phylogenomic analyses, considering that computational time rapidly increases as the number of taxa increases.

Reconstruction of ancestral genomes

For ancestral genome reconstruction using a maximum likelihood birth-and-death model implemented in the COUNT software (Csürös and Miklós, 2009; Csürös, 2010), the phyletic pattern (gene family presence/absence and gene copy number) of the 62 complete or nearly complete Alphaproteobacteria genomes was mapped to a rooted and compositionally unbiased Alphaproteobacteria phylogeny. The orthologous gene family table of these 62 genomes was obtained by clustering all of the predicted protein sequences from these genomes using OrthoMCL (Li *et al.*, 2003). The procedure was repeated with 100 bootstrap data sets generated by randomly sampling the gene families (with repetitions). The number of genes in the ancestral lineages was predicted through regression analysis between the number of gene families and the number of genes at the leaf nodes. The details of the procedure follows a recent publication (Luo *et al.*, 2013).

Results

Identification of composition-homogeneous protein families

A total of 228 orthologous gene families (Supplementary Table S1), including 43 encoding for ribosomal proteins, were selected for phylogenetic analyses at the amino acid level. These families occur across major lineages of Alphaproteobacteria. Although a majority of the included lineages are represented by members with high genomic G+C content (50–70%), the marine SAR11 clade, the *Rickettsiales* and a lineage in the marine SAR116 clade represented by three single

cells (SCGC AAA015-N04, SCGC AAA536-K22, SCGC AAA536-G10) have low genomic G+C content (30% and below). Posterior predictive simulation generated posterior distributed samples for each of the families, and χ^2 homogeneity test on the posterior samples showed that the composition-homogeneous model is adequate ($P > 0.05$) in only 28 functionally conserved families (Supplementary Table S1), of which 19 encode for ribosomal proteins (Table 1). Among the remaining 200 composition-heterogeneous families, 24 encode for ribosomal proteins (Table 1).

Phylogenetic position of SAR11 using composition-homogeneous and -heterogeneous data

To investigate the effect of character sampling on phylogenetic reconstruction of genomes displaying striking compositional variation, two independent data sets of amino acid sequences were compiled: the concatenated 28 composition-homogeneous proteins and the concatenated 24 composition-heterogeneous ribosomal proteins. Intriguingly, the maximum likelihood RAXML software (Stamatakis, 2014) places the SAR11 bacteria in different evolutionary positions depending on which data set is used, whereas the branching order of other alphaproteobacterial lineages remains identical. The composition-homogeneous protein set places *Rickettsiales* at the base of Alphaproteobacteria phylogeny and SAR11 at the base of the remaining lineages (Figure 2a), whereas the composition-heterogeneous protein set clusters SAR11 and *Rickettsiales* at the base of the tree in a monophyletic group (Figure 2b). The different branching patterns in these analyses suggest that the clustering of SAR11 with *Rickettsiales*, as has been reported previously (Thrash *et al.*, 2011), is an artifact due to the attraction of sequences with compositional similarity.

With this composition-unbiased data set of 28 concatenated homogeneous protein sequences, testing was carried out in the alternate SAR11 evolutionary positions that have been reported (Figure 1) using the approximately unbiased test (Shimodaira, 2002) and the more conservative Shimodaira-Hasegawa test (Shimodaira and Hasegawa, 1999), both allowing for statistical comparison of tree topologies. These methods strongly support the tree in Figure 2a (as outlined in Figure 1b), lend weak support ($P = 0.051$) to the tree in Figure 2b (as outlined in Figure 1a) and strongly reject ($P < 0.001$) other placements of SAR11 (Figures 1c and d).

Phylogenetic position of SAR11 using different models

Most phylogenomic analyses do not separate proteins into homogeneous and heterogeneous classes in regard to composition, and often combined data sets with both homogeneous and heterogeneous sequences are used. The ability of phylogenetic

Table 1 List of 28 composition-homogeneous and 24 composition-heterogeneous ribosomal proteins

<i>Composition-homogeneous</i>		<i>Composition-heterogeneous</i>	
<i>COG</i>	<i>Protein</i>	<i>COG</i>	<i>Protein</i>
COG0522	Ribosomal protein S4	COG0261	Ribosomal protein L21
COG0096	Ribosomal protein S8	COG0203	Ribosomal protein L17
COG0100	Ribosomal protein S11	COG0359	Ribosomal protein L9
COG0238	Ribosomal protein S18	COG0200	Ribosomal protein L15
COG0199	Ribosomal protein S14	COG0098	Ribosomal protein S5
COG0093	Ribosomal protein L14	COG0256	Ribosomal protein L18
COG0186	Ribosomal protein S17	COG0097	Ribosomal protein L6P/L9E
COG0197	Ribosomal protein L16/L10E	COG0094	Ribosomal protein L5
COG0091	Ribosomal protein L22	COG0092	Ribosomal protein S3
COG0185	Ribosomal protein S19	COG0089	Ribosomal protein L23
COG0090	Ribosomal protein L2	COG0088	Ribosomal protein L4
COG0051	Ribosomal protein S10	COG0049	Ribosomal protein S7
COG0222	Ribosomal protein L7/L12	COG0081	Ribosomal protein L1
COG0080	Ribosomal protein L11	COG0539	Ribosomal protein S1
COG0211	Ribosomal protein L27	COG0268	Ribosomal protein S20
COG0099	Ribosomal protein S13	COG0103	Ribosomal protein S9
COG0102	Ribosomal protein L13	COG0360	Ribosomal protein S6
COG0184	Ribosomal protein S15P/S13E	COG0087	Ribosomal protein L3
COG0048	Ribosomal protein S12	COG0244	Ribosomal protein L10
COG1278	Cold shock proteins	COG0198	Ribosomal protein L24
COG0050	GTPases—translation elongation factors	COG0227	Ribosomal protein L28
COG0361	Translation initiation factor 1	COG0335	Ribosomal protein L19
COG1158	Transcription termination factor	COG1825	Ribosomal protein L25
COG0055	F0F1-type ATP synthase, beta subunit	COG0228	Ribosomal protein S16
COG3118	Thioredoxin domain-containing protein		
COG0740	ATP-dependent Clp proteases		
COG0468	RecA/RadA recombinase		
COG0443	Molecular chaperone		

The COG (Cluster of Orthologous Groups) annotations of these protein families are provided.

models to accommodate heterogeneity was thus tested using the concatenation of the 28 homogeneous and 24 heterogeneous ribosomal proteins. As expected, the RAxML software (Stamatakis, 2014) clustered SAR11 and *Rickettsiales* at the base of the tree (Supplementary Figure S1), but this clustering had less statistical support (Supplementary Figure S1) compared with that of the RAxML tree based solely on the 24 heterogeneous proteins (Figure 2b), as a result of conflicting phylogenetic signals contained in the two protein subsets. Intriguingly, the CAT model (Lartillot and Philippe, 2004) in the PhyloBayes MPI software (Lartillot *et al.*, 2013) yielded a phylogeny (Supplementary Figure S2) displaying an identical topology to the RAxML tree (Supplementary Figure S1), which is at odds with the previous PhyloBayes analyses that were based on concatenated data sets that, although distinct from this 52-protein data set, also consist of both composition-homogeneous and heterogeneous protein sequences (Viklund *et al.*, 2012; Luo *et al.*, 2013; Viklund *et al.*, 2013); these previous analyses placed SAR11 in the middle of the non-endosymbiotic lineages (Figures 1c and d).

The P4 Bayesian software offers the NDCH model that allows the amino acid composition to vary across lineages (Foster, 2004). This NDCH model generated a P4 phylogeny (Figure 3a) with a branching order identical to the RAxML tree based

on the 28 homogeneous proteins (Figure 2a). When this model was not invoked, the resulting P4 tree (Figure 3b) displayed a topology identical to the RAxML tree based on the 24 heterogeneous proteins (Figure 2b). The robustness of this NDCH model is further confirmed by the posterior predictive simulation, followed by the χ^2 -test showing that this 52-protein data set can be adequately modeled ($P > 0.05$) only when the NDCH model is invoked. These analyses strongly support the disassociation of SAR11 and *Rickettsiales* as outlined in Figure 1b.

Reconstruction of ancestral processes giving rise to the SAR11 bacteria

Ancestral genome content reconstruction requires a rooted species tree topology and phyletic pattern (presence/absence and copy number variation) of orthologous gene families in extant genomes. On the basis of the analyses above, the tree topology shown in Figure 2a (and Figure 3a) was selected for reconstruction. A maximum-likelihood ancestral reconstruction approach using the phylogenetic birth-and-death model (Csürös, 2010) predicted that the first evolved SAR11 cell contained approximately 1800 genes, while its immediate ancestor had >4000 genes (Figure 4). Although over half of the genome content was lost at this early stage, genome streamlining continued until the extant lineages that

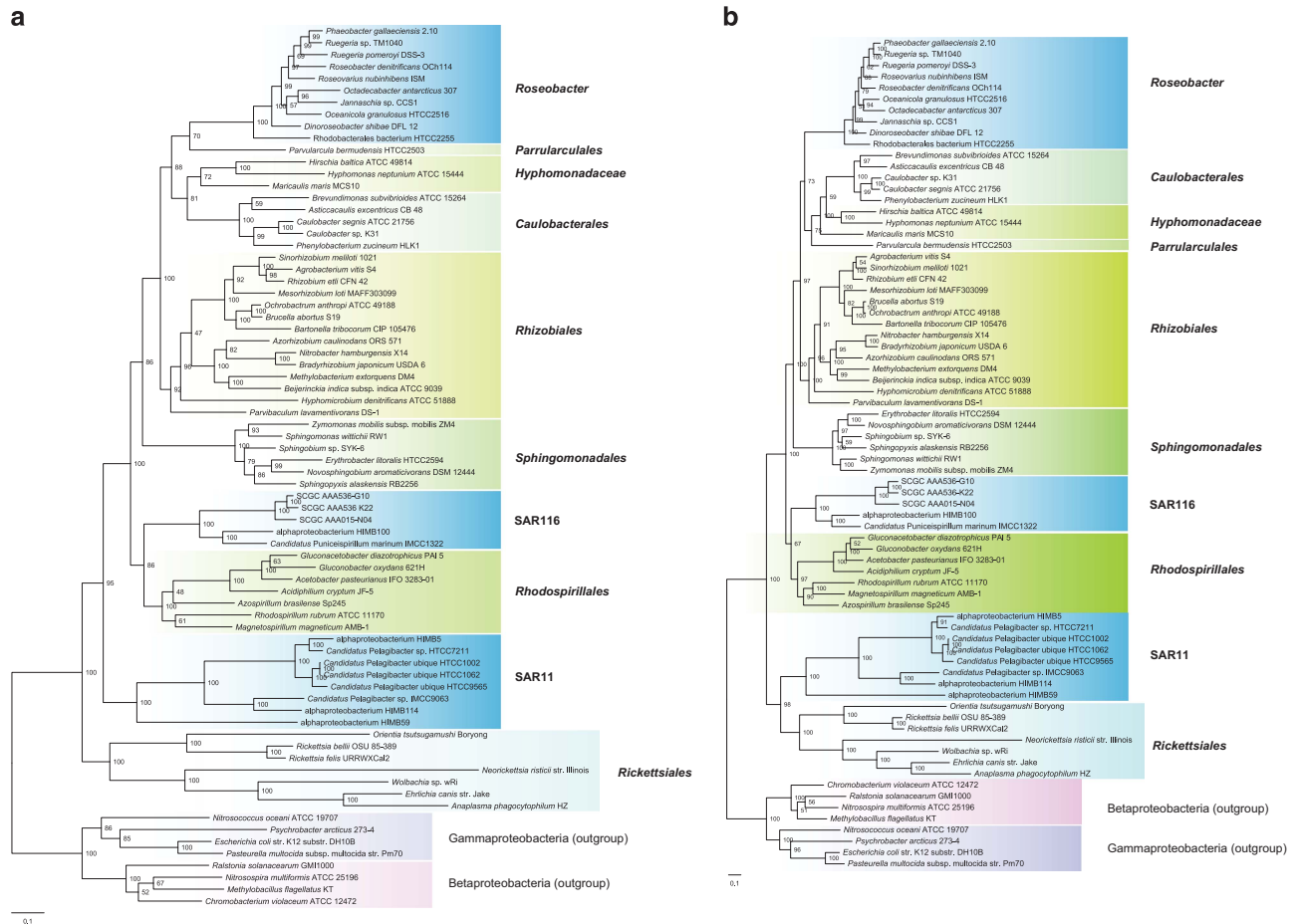


Figure 2 Maximum likelihood phylogeny of Alphaproteobacteria using the RAxML v7.3.0 software. **(a)** Tree based on a concatenation of the 28 composition-homogeneous proteins, in which 19 are ribosomal proteins. **(b)** Tree based on a concatenation of the 24 composition-heterogeneous ribosomal proteins. A data partition model was employed to allow subsets of component proteins to evolve independently in amino acid replacement processes, which was determined using the PartitionFinder software. Values at the nodes show the number of times the clade defined by that node appeared in the 100 bootstrapped datasets. Trees are rooted using species from Betaproteobacteria and Gammaproteobacteria.

contain approximately 1300–1500 genes (Figure 4). The predicted genome content of the first SAR11 (Supplementary Table S2) and its immediate ancestor (Supplementary Table S3) is significantly different according to functional categorization by Clusters of Orthologous Groups (Tatusov *et al.*, 1997) (χ^2 -test; $P < 0.001$). Using the Xipe resampling technique (Rodríguez-Brito *et al.*, 2006), the latter genome was predicted to have been significantly enriched in transcriptional regulation, signal transduction, cell motility, and lipid transport and metabolism, which are characteristic functional categories of patch-adapted marine bacteria (Luo *et al.*, 2013), whereas the former was significantly enriched in translation, ribosomal structure and biogenesis, amino acid transport and metabolism, nucleotide transport and metabolism, as well as coenzyme transport and metabolism, which are diagnostic categories of free-living planktonic cells (Luo *et al.*, 2013) ($P < 0.01$). This evidence for systematic gene loss implies that a change in ecological strategy accompanied the origin of SAR11.

Discussion

Free-living planktonic marine bacteria with streamlined genomes have reduced the metabolic cost and increased the surface-to-volume ratio (because cell size can be correspondingly smaller) for efficient nutrient uptake, and thus streamlining has been considered an ecological advantage in inhabiting nutrient-poor ocean waters (Giovannoni *et al.*, 2014). Study of the origin of the SAR11 lineage, the most abundant and streamlined bacterioplankton in the global oceans, requires resolving its evolutionary position in the Alphaproteobacteria tree. This is a challenge because genomes of the ecologically distinct SAR11 and *Rickettsiales* lineages consistently exhibit low G+C content whereas most members of the remaining alphaproteobacterial lineages contain G+C-rich genomes. Such variability in nucleotide ratios frequently results in a clustering pattern influenced by compositional similarity rather than biological relatedness in phylogenomic reconstruction

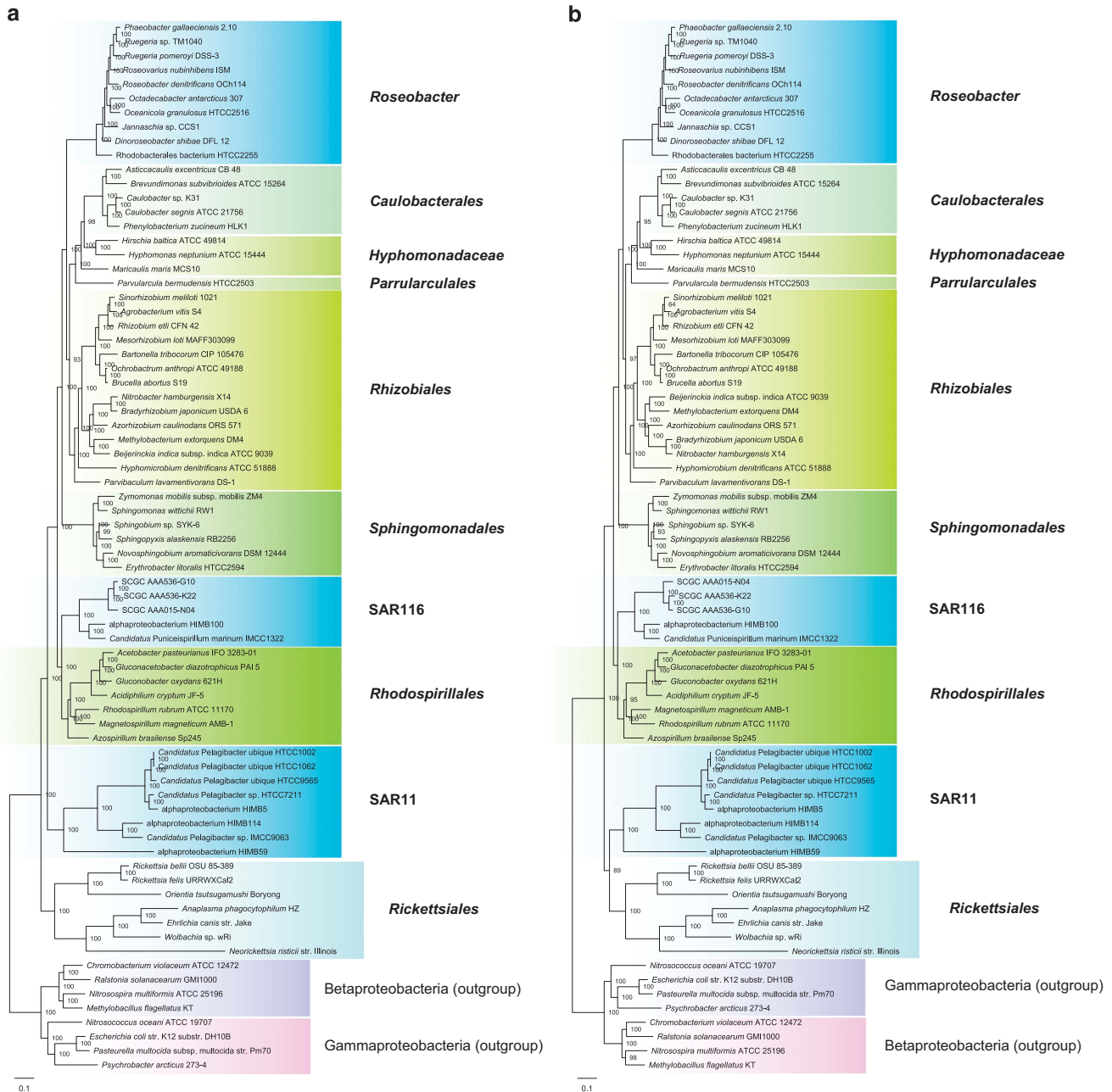


Figure 3 Bayesian phylogeny of Alphaproteobacteria using the P4 software. **(a)** Tree employing a composition-heterogeneous model that is adequate to the data. **(b)** Tree employing a composition-homogeneous model that significantly violates the data. Both trees are based on a Dayhoff-recoded sequence with a concatenation of 52 proteins, in which 28 are composition-homogeneous while the remaining 24 are composition-heterogeneous. The value near each internal branch is the posterior probability for that branch. Trees are rooted using species from Betaproteobacteria and Gammaproteobacteria.

(Galtier and Gouy, 1995; Jermin *et al.*, 2004; Collins *et al.*, 2005; Cox *et al.*, 2008; Foster *et al.*, 2009; Sheffield *et al.*, 2009; Nesnidal *et al.*, 2010; Guy *et al.*, 2014). Here, the evolutionary position of the SAR11 clade was shown to be better resolved in two ways, either by applying a standard phylogenetic program (for example, RAxML) to a least biased data set, or by applying a composition-heterogeneous model to a data set that contains bias. With both approaches, the G + C-poor SAR11 and *Rickettsiales* lineages do not emerge as a

monophyletic lineage at the base of the Alphaproteobacteria tree.

Half of the ribosomal protein families were shown to have biased amino acid composition across the alphaproteobacterial lineages and their inclusion resulted in distorted phylogenetic structure. This compositional issue has not been reported in previous studies using the ribosomal proteins as phylogenetic characters. In fact, using a concatenated sequence based on a full set of ribosomal proteins has become a common approach to resolve

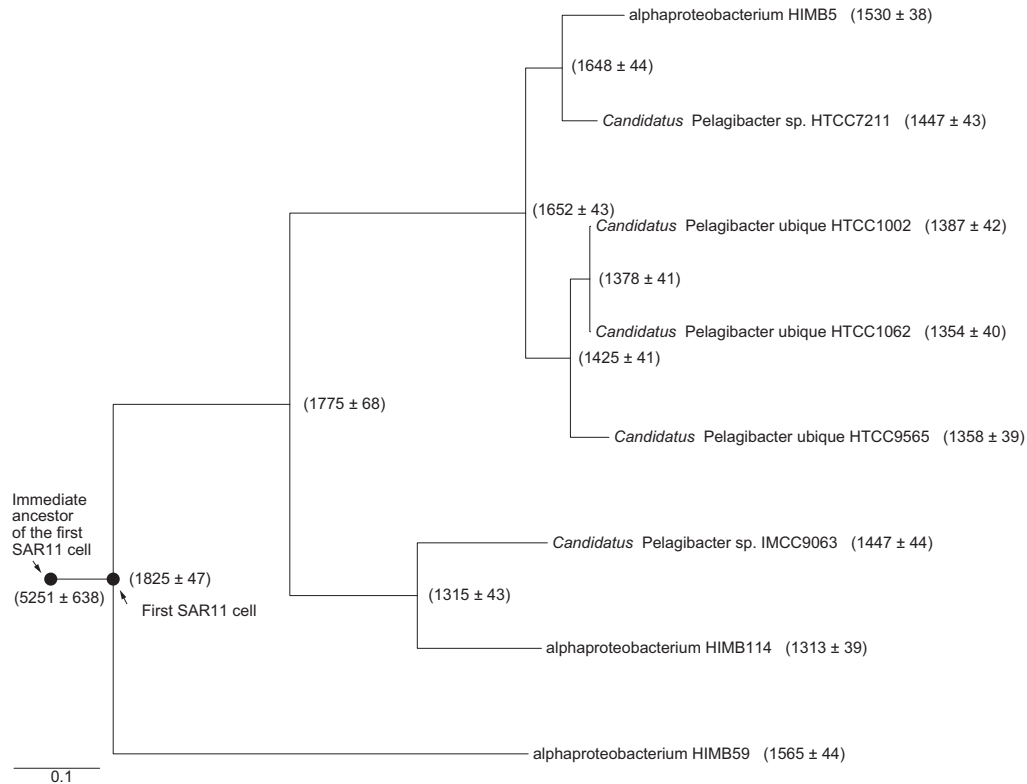


Figure 4 Reconstructed gene numbers of each ancestral node associated with the marine SAR11 clade using the COUNT software. The standard deviation was calculated based on maximum likelihood mapping of each of 100 bootstrap data sets generated by randomly sampling the gene families (with repetitions). Closed circles represent the first SAR11 cell and its immediate ancestor.

deep evolutionary relationships in prokaryotic phylogenomics (Matte-Tailliez *et al.*, 2002; Brochier-Armanet *et al.*, 2008; Fournier and Gogarten, 2010; Lasek-Nesselquist and Gogarten, 2013). The major advantage of using these proteins as phylogenomic markers for prokaryotic organisms is that these genes are rarely subject to horizontal gene transfer (Ciccarelli *et al.*, 2006; Ramulu *et al.*, 2014), which has been generally accepted as the prevalent source of error in prokaryotic systematics (Bapteste and Boucher, 2008). Results from the current study showing different branching patterns depending on which ribosomal proteins are used caution against their indiscriminate use for systematics of Proteobacteria and perhaps other prokaryotic groups.

In addition to the ongoing debate of the phylogenetic placement of the SAR11 clade, there has been disagreement in regard to the monophyly of the strain HIMB59 and other SAR11 lineages (Rodríguez-Ezpeleta and Embley, 2012; Viklund *et al.*, 2013). These studies suggest that a monophyletic cluster of these bacteria as frequently observed in phylogenomic trees (Thrash *et al.*, 2011; Luo *et al.*, 2013) is a result of compositional attraction (Rodríguez-Ezpeleta and Embley, 2012; Viklund *et al.*, 2013), and that HIMB59 is more likely to be related to the marine SAR116 clade (Rodríguez-Ezpeleta and Embley, 2012) or a broader group of *Rhodospirillales* that includes SAR116 (Viklund *et al.*, 2013). Although the current study

was not designed to address this question, it found no evidence to support a disassociation of HIMB59 with other SAR11 bacteria. All phylogenomic trees from the current study confidently rejected an evolutionary relatedness of HIMB59 to the SAR116 clade, even though a SAR116 lineage was included consisting of three single cells with low genomic G + C content ($\sim 30\%$) that is nearly identical to that of HIMB59 (32%).

Identifying an exact evolutionary position of SAR11 requires a better sampling of major Alphaproteobacteria lineages. While eight well-accepted Orders were included here, a few under-represented but deeply branching lineages are missing in both the current and previous phylogenomic studies. A few examples are *Kiloniellales*, *Kopriimonadales*, *Kordiimonadales*, *Sneathiellales*, *Rhodothalassiales* and *Magnetococcales* (Ferla *et al.*, 2013). Indeed, the ribosomal gene trees consistently resolved *Magnetococcales* as the basal Order of the Alphaproteobacteria phylogeny (Bazyliński *et al.*, 2013; Ferla *et al.*, 2013), and availability of the genomic sequence from *Magnetococcus marinus* MC-1 affiliated with this lineage allows phylogenomic validation of its basal position among the included alphaproteobacterial lineages (Supplementary Figure S3). Another consideration in future phylogenomic studies of Alphaproteobacteria and the phylogenetic placement of SAR11 is to examine the effect of taxon sampling on the resulting tree,

since Ferla *et al.* (2013) showed that taxon selection greatly affects the branching order and monophyly of a few major lineages in the Alphaproteobacteria tree, though their analysis was based on a concatenation of easily accessible small and large subunits of rRNA genes.

Recent studies using various approaches have consistently identified statistical correlations between the ecological strategies and genome content in marine bacteria (Lauro *et al.*, 2009; Yooseph *et al.*, 2010; Luo *et al.*, 2012; Luo *et al.*, 2013). Gene functional categories involved in cell–cell interactions, such as motility, secondary metabolite synthesis and degradation, and defense mechanisms, are repeatedly found to be enriched in the genomes of marine bacteria that are associated with particles and take advantage of ephemeral patchiness of nutrients (Moran *et al.*, 2004; Newton *et al.*, 2010; Luo *et al.*, 2013), while they are depleted in the genomes of marine bacteria that live as single cells in nutrient-poor bulk seawater (Giovannoni *et al.*, 2005; Giovannoni *et al.*, 2008). This characteristic genome content was also hypothesized in the present study, suggesting the evolutionary origin of marine SAR11 bacteria at the base of the non-endosymbiotic Alphaproteobacteria lineages may have coincided with an ecological transition from a patch-associated life-style to a free-living planktonic strategy.

Conflict of Interest

The authors declare no conflict of interest.

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