### Phylogenetic Diversity of the Enteric Pathogen Salmonella enterica subsp. enterica Inferred from Genome-Wide Reference-Free SNP Characters

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Data Deposition: GenBank accession numbers for the 156 genomes used in this analysis are listed in Supplementary Table S1, Supplementary Material online. The 102 newly sequenced genomes are listed in the Data Deposition section of the Materials and Methods. The SNP matrix and phylogenetic trees are available at TreeBase.org, study number S14912. Individual SNPs were deposited at dbSNP database at NCBI under the accession range ss749616252–ss749736198.

### Abstract

The enteric pathogen *Salmonella enterica* is one of the leading causes of foodborne illness in the world. The species is extremely diverse, containing more than 2,500 named serovars that are designated for their unique antigen characters and pathogenicity profiles—some are known to be virulent pathogens, while others are not. Questions regarding the evolution of pathogenicity, significance of antigen characters, diversity of clustered regularly interspaced short palindromic repeat (CRISPR) loci, among others, will remain elusive until a strong evolutionary framework is established. We present the first large-scale *S. enterica* subsp. *enterica* phylogeny inferred from a new reference-free k-mer approach of gathering single nucleotide polymorphisms (SNPs) from whole genomes. The phylogeny of 156 isolates representing 78 serovars (102 were newly sequenced) reveals two major lineages, each with many strongly supported sublineages. One of these lineages is the *S*. Typhi group; well nested within the phylogeny. Lineage-through-time analyses suggest there have been two instances of accelerated rates of diversification within the subspecies. We also found that antigen characters and CRISPR loci reveal different evolutionary patterns than that of the phylogeny, suggesting that a horizontal gene transfer or possibly a shared environmental acquisition might have influenced the present character distribution. Our study also shows the ability to extract reference-free SNPs from a large set of genomes and then to use these SNPs for phylogenetic reconstruction. This automated, annotation-free approach is an important step forward for bacterial disease tracking and in efficiently elucidating the evolutionary history of highly clonal organisms.

Key words: H antigens, serovar, O antigens, CRISPR, lineage-through-time plot, comparative method.

### Introduction

Salmonella enterica is one of the primary causes of foodborne illness in the United States, leading to more deaths than any other food-related pathogen (Scallan et al. 2011). However, using the single label Salmonella for all these cases is somewhat deceptive; this is an extremely diverse species composed of six subspecies and more than 2,500 named serovars (Grimont and Weill 2007). Although the ultimate goal is to recover a fine-scaled, accurate phylogeny of global Salmonella serovar diversity, our efforts are focused on serovar diversity within *S. enterica* subsp. *enterica*, a pathogenic lineage that accounts for most of the clinical isolates from human and domestic animals. Past investigations of *Salmonella* phylogeny have focused primarily on species and subspecies level resolution (Boyd et al. 1996; Brown et al. 2002; McQuiston et al. 2008; Trujillo et al. 2011; Desai et al. 2013) using tools that sampled a subset of the genome, such as multilocus enzyme electrophoresis, pulsed-field gel electrophoresis (PFGE), and targeted protein coding regions. The most recent of these by Desai et al. (2013) used whole genome data from 21

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individuals, 11 within *S. enterica* subsp. *enteria*, and two from each of the other five *S. enterica* subspecies, although the phylogenetic discussion focused mainly on subspecies relationships. Unfortunately, these previous studies did not have either the data or taxon sampling required for phylogenetic reconstruction at the interserovar level or intraserovar level in *S. enterica* subsp. *enterica*. By contrast, next-generation DNA sequencing (NGS) and computationally efficient analysis methods now enable us to utilize variation across the entire bacterial genome, extracting all of the rare microevolutionary changes useful for investigating evolutionary questions and also for diagnostics and traceback investigations of foodborne outbreaks.

Traditionally, phylogenomic analyses used multilocus seguence alignments, in which orthologous genes were determined across the taxa of interest, and then aligned orthologs were concatenated for downstream analyses. However, this approach leaves at least four areas of uncertainty. First, ortholog determination is a hypothesis of shared ancestry, causing systematic errors if the original determination is incorrect. Second, this step can require many iterations to find the correct number and diversity of loci to include, which can be very time consuming and delay the prompt traceback of contaminated foods or confirmation of an outbreak. Third, when working with diverse taxon sets, multigene alignments often have lots of missing data (i.e., gene presence/absence is highly variable). Finally, multigene alignments can be very long (more than 4 Mb in the case of Salmonella genomes), requiring vast computational resources for analysis and result interpretation.

By contrast, our approach of building a matrix composed only of the variants, or single nucleotide polymorphisms (SNPs), is relatively new and overcomes these challenges. Preliminary studies reveal this method to be fast and accurate (Snitkin et al. 2012; Allard et al. 2013). Nevertheless, we do foresee a few potential drawbacks for this methodology. One is the unknown effect of applying traditional nucleotide maximum-likelihood (ML) models to SNP matrices. Another is the inability to analyze gene trees separately, reducing the ability to identify and isolate incongruent phylogenetic signals caused by horizontal gene transfer (HGT). Despite these drawbacks, the vast amount of fine-resolution SNP data available holds great promise for shedding light on previously unresolved evolutionary relationships.

A few pioneering studies have shown that serovar-level resolution using whole genome sequence data is possible for this species (den Bakker, Switt, Govoni, et al. 2011; Fricke et al. 2011; Leekitcharoenphon et al. 2012; Desai et al. 2013). Most of the serovar diversity (~1,500 serovars) lies within one subspecies, *S. enterica* subsp. *enterica*. These serovars were originally described based on their unique somatic (O) and flagellar (H) antigenic formulas (Grimont and Weill 2007). As with most historical methods for delimiting taxonomic groups, whether this categorization scheme, which is based on antigenic formulas, reflects evolutionary relatedness is an open question in the field. Preliminary sampling in

*S. enterica* subsp. *enterica* serovar Newport (*S.* Newport) reveals at least three independent lineages rendering it polyphyletic (Sangal et al. 2010; Achtman et al. 2012; Cao et al. 2013), but similar taxon sampling in *S.* Typhimurium (Sangal et al. 2010; Trujillo et al. 2011) and *S.* Enteritidis (Allard et al. 2013) appears to support those serovars as monophyletic. This early look at the correlation between evolutionary history and O and H antigens suggests both patterns (i.e., monophyly and polyphyly) probably exist among the 1,500 *S. enterica* subsp. *enterica* serovars.

Identifying instances of incongruence between antigenic similarities and phylogeny is important for two reasons. First, investigating the cause of incongruence can likely yield important insights into the evolution of bacterial diversity at both the macro- and microevolutionary scale. Second, assigning serovar names that communicate monophyletic lineages is paramount for correctly characterizing and communicating outbreaks. For example, reporting an outbreak of illness as "*S*. Newport" would not be sufficient to identify the pathogen involved; instead, outbreak data should be described as a specific *S*. Newport lineage (I, II, or III) to correctly communicate which microorganism is involved (Cao et al. 2013). Thus, a prime focus of this study is assessing the validity of these named categories by thorough taxon sampling across a diversity of *S*. *enterica* subsp. *enterica* serovars.

Once a strong backbone serovar phylogeny is established, there are several hypotheses we can test. For example, does the current taxonomic alignment reflect distinct taxonomic groups as defined under the genealogical species concept (i.e., all individuals assumed to represent the same taxonomic group form a monophyletic lineage to the exclusion of any putative heterospecific samples [Baum and Shaw 1995])? Along similar lines, we can investigate whether the diversity and specificity of O and H antigen characters contain phylogenetic signal or whether they occur independently of the phylogeny. Can we find evidence that one or both of these characters are freely exchanged through HGT? Alternatively, is it possible that the same antigen characters could have evolved through convergent evolution? Recent studies in Escherichia coli suggest that H antigens may be useful for tracking evolutionary history, whereas O antigens are not (Iguchi et al. 2012; Ju et al. 2012). Because we rely on O and H antigens when typing Salmonella serovars, it is important that we understand whether they also allow us to predict evolutionary relationships between serovars.

A second set of questions arise from previous studies that identified a deep split of *S. enterica* subsp. *enterica* into two major lineages, Clade A and Clade B (Falush et al. 2006; den Bakker, Switt, Govoni, et al. 2011). Is this split an artifact of the size of earlier data sets, or does this split hold when taxon sampling is substantially increased? If so, can whole genome sequencing enable us to identify which SNPs define each major clade? Extending beyond the two-clade issue, can we uncover historical fluctuations in the rate of diversification? In other words, has the diversification rate been stable over time or is there evidence of radiation bursts early or late in the phylogeny? We can also elucidate the degree to which incomplete lineage sorting and/or introgression may have confounded previous phylogenetic studies by determining the number of SNPs that are shared among the major groups.

Third, there is an interest in utilizing clustered regularly interspaced short palindromic repeat (CRISPR) regions in Salmonella as a typing method (Fabre et al. 2012). In contrast to traditional DNA sequence evolution (i.e., base substitutions, insertions and deletions, inversions, etc.), CRISPR's small RNAmediated system evolves through the precise incorporation of phage DNA/RNA fragments into the bacterial chromosome (Bhaya et al. 2011; Barrangou and Horvath 2012). This process is thought to confer host immunity, although its exact function in Salmonella is purely conjectural. Because of this unique pattern of evolution, the CRISPR region has been analyzed for use in typing (serovar-level identification; Fricke et al. 2011; Fabre et al. 2012). By examining the level of CRISPR variation across our serovar-level phylogeny, we can test the hypothesis that CRISPR region variations can be used to determine serovar identity with appropriate sensitivity and specificity.

The first step in answering these three questions requires a comprehensive genome-scale analysis using assembled S. enterica genomes, many of which were generated for this study. Our taxon sampling included five of the six Salmonella enterica subspecies: S. enterica subsp. salamae. S. e. diarizonae, S. e. houtenae (two serovars), S. e. indica, and S. e. enterica (78 serovars). We used a nonreference-based approach to extract SNPs. This yielded a large SNP matrix that we used to reconstruct the evolutionary history of this diverse pathogen. Using this phylogeny, we explicitly tested the accuracy of current taxonomic alignments and the phylogenetic signals contained within the O and H antigenic data. We also extracted all CRISPR regions from whole genomes and explored the utility of such regions for typing and subtyping. Aside from our specific research questions, this study accompanies the new release of more than 100 diverse Salmonella genomes to National Center for Biotechnology Information (NCBI), ~200,000 Salmonella SNPs to NCBI's dbSNP database, and a rigorous phylogenetic tree deposited at TreeBase.org, study number \$14912. These data will benefit public health by drastically increasing publicly available reference genomes and expanding the phylogenetic context for monitoring Salmonella, which will help resolve future outbreaks.

### **Materials and Methods**

### Salmonella Strains

A set of 102 *S. enterica* strains were gathered from in-house strain collections at the Center for Food Safety and Applied Nutrition (FDA-CFSAN) and US Department of Agriculture (USDA) and used for whole genome sequencing. Our sampling focused on *S. enterica* subsp. *enterica* with 151 strains spanning the diversity of this subspecies. We gathered four outgroups, one in each of the following subspecies of *S. enterica*: *S. e. diarizonae, S. e. houtenae, S. e. indica,* and *S. e. salamae.* Fifty-four public genomes were also included in the study, producing our final data set of 156 strains that represented 78 *S. enterica* subsp. *enterica* serovars. (supplementary data S1, Supplementary Material online)

### Growth of Bacterial Strains and Genomic Isolation

For each strain, a pure culture sample was taken from frozen stock, plated on Trypticase Soy Agar, and incubated overnight at  $37 \,^{\circ}$ C. The following day, cells were taken from the plate and inoculated into Trypticase Soy Broth culture for DNA extraction. All samples were representative cultures from a full-plate inoculation and were not single colonies. Genomic DNA was extracted using the Qiagen DNeasy kit (Qiagen, Valencia, CA).

### Genome Sequencing, Assembly, and Annotation

Most isolates for this study were shotgun sequenced using Roche 454 GS Titanium technology (Roche Diagnostics Corp., Indianapolis, IN). The 454 isolates were run on a quarter of a titanium plate. This produced roughly 250,000 reads per draft genome.

Approximately 20 isolates were prepared using the Nextera Sample Preparation Kit (Illumina, San Diego, CA) and then sequenced on an Illumina MiSeq (Illumina) for  $2 \times 151$  cycles.

De novo assemblies were generated from all raw sequence data. The 454 reads were assembled using Roche's Newbler Assembler v. 2.3–2.6 (Margulies et al. 2005). The Illumina reads were assembled with Ray v. 2.2.0 (Boisvert et al. 2010). Default parameters were used in all cases. The contigs for each isolate (draft genomes) were annotated using NCBI's Prokaryotic Genomes Automatic Annotation Pipeline.

### Comparative Genomic and Diversification Analyses

Fifty-nine complete or draft genomes were downloaded from NCBI and included in this study, producing our final data set of 156 annotated genomes. A concatenation of SNPs were gathered in a data matrix (95% majority SNP matrix) using the program kSNP v. 2 ([Gardner and Slezak 2010] http://source forge.net/projects/ksnp, last accessed June 3, 2013). The following kSNP parameters were used: k-mer size 25 and SNP locations determined based on the complete annotated genome S. Typhimurium str. LT2 (GenBank: AE006468). One advantage of kSNP is that the putative SNPs are extracted from kmers (one SNP per 25mer in our analysis), which effetely eliminates issues with assembly error in the input draft genomes. Also, raw reads can be used instead of draft assemblies with similar results. Tree inference was performed using RAxML-HPC2 version 7.3.2 (Stamatakis 2006; Stamatakis et al. 2008) under the GTRCAT model for the rapid

bootstrapping phase, and GTRGAMMA for the final best scoring ML tree. Bootstrapping was performed under auto Majority Rule Criterion (autoMRE).

We constructed lineage through time plots using the APE (Paradis et al. 2004) package in R (R Core Development Team 2012), which provides information regarding historical fluctuations in the rate of diversification within *S. enterica*. Because the analysis requires an ultrametric tree, one was constructed using a penalized likelihood method also implemented in ape. We evaluated the sensitivity of the analysis to taxon sampling by constructing plots on both the original data set with 156 tips and on a pruned tree of 126 tips that contained only one representative from each monophyletic serovar group. Results were consistent between the two data sets, and we present results based on the 156 strain data set.

We used GSI (Cummings et al. 2008) to statistically evaluate the degree of genealogical exclusivity among isolates assumed to represent the same serovar. The GSI statistics range from 0 to 1, where 0 means a random distribution of isolates from the same serovar in the phylogeny and 1 represents a monophyletic group. We calculated the weighted statistic that accounts for topological uncertainty by estimating the GSI for each group on each of the 100 randomly selected bootstrap replicates from the phylogenetic analyses. Statistical significance was based on 10,000 random replicates where GSI was calculated for each group after the isolates were randomly assigned to the tips of each bootstrap replicate.

### Comparative Method

One goal was to determine if/how targeted characters evolved across the *Salmonella* phylogeny. We tested several hypotheses, including the following: 1) do the O and H antigen states show phylogenetic signal? 2) are the O and H antigen (Phase\_1) characters coevolving? and 3) do the CRIPSR1 and CRISPR2 loci categories show phylogenetic signal or are they distributed randomly across the phylogeny?

Because the O and H antigen characters were collected from the literature (Grimont and Weill 2007), there was no opportunity for strains within a named serovar to have different antigen formulas. For this reason, the 156-taxon ML tree was pruned to allow only one strain per serovar (additional strains were allowed for polyphyletic serovars). Tests for phylogenetic signal were performed using the fitDiscrete function within the Geiger (Harmon et al. 2008) package in R (R Core Development Team 2012). Two ML scores were determined: One with the character mapped onto the pruned ML tree (converted to be ultrametric with a penalized likelihood approach) and the other with the character mapped onto a star phylogeny. The best-fit model was determined by a likelihood ratio test followed by a chi-square. We used the GSI statistic to test the genealogical exclusivity, or degree of monophyly, among the antigen character states for three antigen characters (the O group and two flagellar antigens).

### Phylogenetic Independent Clustering

To further explore the genomic similarities among isolates, we clustered samples into groups using the model-based Bayesian clustering method implemented in the program STRUCTURE (Falush et al. 2003, 2007). This method does not incorporate any a priori information about group membership but rather assigns samples to "populations" based on similarities in multilocus genotpyes. We used the SNP matrix produced by kSNP as the input and ran the program at values of k (i.e., the number of clusters) 2–5. Given the limitations of the method to infer and graphically represent a large number of clusters, we focused on these values of k to elucidate the coarser genomic similarities among the isolates, such as whether we saw support for the two major clades previously identified. Analyses were run using the admixture model with correlated allele frequencies and consisted of 60,000 generations, the first 10,000 of which served as burnin.

### **CRISPR** Analysis

Salmonella CRISPR loci 1 and 2 were extracted from 128 of our genomes (in-house draft assemblies plus published complete genomes). Spacers and repeats were visualized with the CRISPR DB II Excel Macro (DuPont Inc., Barrangou R, unpublished data), as previously used (Horvath et al. 2008). Repeats were removed to determine the homology of spacers across strains, and the CRISPR spacer array was manually aligned to optimize the homology of spacers across *Salmonella* strains. This was performed separately for CRISPR 1 and CRISPR 2. To analyze the CRISPR diversity across *S. enterica* subsp. *enterica*, we extracted the four most ancestral spacers from the alignment and assigned a category based on their similarity to other strains. Strains within the same category number have the exact same spacer sequence for their first four spacers. The spacer number within each CRISPR locus was collected without reference to the alignment.

### Data Deposition

The SNP matrix and phylogenetic trees are available at TreeBase. org, study number S14912. Individual SNPs were deposited at dbSNP database at NCBI under the accession range ss749616252–ss749736198. GenBank accession numbers for the 156 genomes used in this analysis are listed in supplementary table S1, Supplementary Material online. The newly 107 newly sequenced genomes are summarized here in the following format: S. serovar str. ID: WGS accession number.

S. Abaetetuba str. ATCC 35640: APAQ00000000; S. Abony str. 0014: APAB00000000; S. Agona str. 419639 2-1: AOZV00000000; S. Agona str. 632182-2: AOZY00000000; S. Agona str. 648586-1: AOZU00000000; S. Agona str. ATCC 51957: AOZX00000000; S. Albany str. ATCC 51960: AOZW00000000; S. Anatum str. ATCC BAA-1592: AOZZ00 000000; S. Anatum str. USDA\_100: APAA00000000; S. Bareilly str. 2780: AOZP00000000; S. Bareilly str. ATCC 9115: AOZN0000000; S. Bareilly str. CFSAN000183: AOZT0000000; S. Bareilly str. CFSAN000189: AOZS000000 00; S. Bareilly str. CFSAN000197: AOZR00000000; S. Bareilly str. CFSAN000200: AOZQ0000000; S. Berta str. ATCC 8392: AOZO0000000; S. Braenderup str. ATCC BAA-664: AOZM0000000; S. Braenderup str. CFSAN000756: APAP00000000; S. Bredeney str. CFSAN001080: APAJ0000 0000; S. Cerro str. 818: AOZJ0000000; S. Chester str. ATCC 11997: AOZI00000000: S. Choleraesuis str. 0006: AOZL0000000; S. Choleraesuis str. ATCC 10708: AOZK00 000000; S. Cubana str. CFSAN001083; APAG00000000; S. Derby str. 626: AOZH0000000; S. Dublin str. HWS51: AHUK0000000; S. Dublin str. SL1438: AHUJ00000000; S. Eastbourne str. CFSAN001084: APAF00000000; S. Enteritidis str. 436: AHUO00000000; S. Enteritidis str. 81-2625: ALIBO0 000000; S. Gallinarum str. 9184: AHUH00000000; S. Gaminara str. ATCC BAA-711: AOZF0000000; S. Give str. 564: AOZG0000000; S. Hadar str. ATCC 51956: AOZE0000 0000; S. Hartford str. CFSAN001075: APAO00000000; S. Havana str. CFSAN001082: APAH00000000; S. Heidelberg str. 82-2052: AMMX0000000; S. Heidelberg str. SARA35: AMLT0000000; S. Indiana str. ATCC 51959: AOZC000000 00; S. Inverness str. ATCC 10720: AOZD00000000; S. Javiana str. 10721: AOZA0000000; S. Javiana str. PRS 2010 0720: AOZB0000000; S. Kentucky str. 5349: AOYZ0000000; S. Kentucky str. ATCC 9263: AOYY00000000; S. Litchfield str. CFSAN001076: APAN0000000; S. London str. CFSAN00 1081: APAI0000000; S. Manhattan str. CFSAN001078: APAL00000000; S. Mbandaka str. ATCC 51958: AOYR0000 0000; S. Meleagridis str. 0047: AOYN00000000; S. Miami str. 1923: AOYS0000000; S. Minnesota str. ATCC 49284: AOYO0000000; S. Montevideo str. 8387: AOYQ00000000 S. Muenchen str. ATCC 8388: AOXN0000000; S. Muenchen str. baa1594: AOYV00000000; S. Muenchen str. baa1674: AOYT0000000; S. Muenster str. 0315: AOYX0000 0000; S. Muenster str. 420: AOYW00000000; S. Nchanga str. CFSAN001091: APAE00000000; S. Nchanga str. CFSAN00 1092: APAD0000000; S. Norwich str. CFSAN001077 Serovar:APAM0000000; S. Ohio str. CFSAN001079: APAK0000000; S. Oranienburg str. 0250: AOYM00000000 ; S. Oranienburg str. 701: AOYL0000000; S. Panama str. ATCC 7378: AOYJ0000000; S. Paratyphi A str. ATCC 11511: AOYH0000000; S. Paratyphi B str. ATCC 10719: AOYF0000000; S. Paratyphi B str. ATCC 19940: AOYD00 000000; S. Paratyphi B str. ATCC 51962: AOYC00000000; S. Paratyphi B str. ATCC 8759: AOYE00000000; S. Paratyphi B str. ATCC BAA-1585: AOYG0000000; S. Paratyphi B str. SARA42: AOYB0000000; S. Paratyphi B str. SARA56: AOXH0000000; S. Paratyphi B str. SARA62: AOXG000000 00; S. Poona str. ATCC BAA-1673: AOYK0000000; S. Pullorum str. 19945: AOYI0000000; S. Pullorum str. 9120: AMYM0000000; S. Rubislaw str. ATCC 10717: AOYA0000 0000; S. Saintpaul str. JO2008: AOXY00000000; S. Saintpaul str. SARA26: AOXF0000000; S. Senftenberg str. 316235162: AOYU0000000; S. Senftenberg str. 423984-2: AOYP0000 0000; S. Senftenberg str. 604314: AOXW0000000; S. Senftenberg str. ATCC 43845: AOXX0000000; S. Senftenberg str. ATCC 8400: AOXU0000000; S. Sloterdijk str. ATCC 15791: AOXT0000000; S. Soerenga str. 695: AOXZ0000000; S. Stanley str. ATCC 7308: AOXV000000 00; S. Stanleyville str. CFSAN000624: APAR0000000; S. subsp. diarizonae ser. 60:r:e,n,x,z15 str. 01-0170: APAC00 000000; S. subsp. houtenae ser. 50:g,z51:- str. 01-0133: AOXJ0000000; S. subsp. indica ser. 6,14,25:z10:1,(2),7 str. 1121: AOXI0000000; S. subsp. salamae ser. 58:1,z13,z28:z6 str. 00-0163: AOXE0000000; S. Tallahassee str. 0012: AOXS0000000; S. Tennessee str. TXSC\_TXSC08-19: AOXR0000000; S. Tennessee str. TXSC TXSC08-21: AOX Q00000000; S. Thompson str. ATCC 8391: AOXP00000000; S. Typhimurium str. AZ 057: AOXC0000000; S. Typhimurium str. SARA13: AOXO0000000; S. Typhimurium str. ST4581: AOXD0000000; S. Urbana str. ATCC 9261: AOXM000000 00; S. Virchow str. ATCC 51955: AOXL0000000; S. Worthington str. ATCC 9607: AOXK0000000.

### Results

### Whole Genome Sequencing and SNP Discovery

Our total data set of 156 S. enterica genomes included 102 newly sequenced draft genomes and 49 published genomes (13 complete and 41 drafts available at NCBI). The final taxon sampling was composed of five outgroup and 151 ingroup S. enterica subsp. enterica strains, spanning 78 serovars (supplementary data S1, Supplementary Material online). Three SNP matrices were determined for this data set: A core matrix containing 6,827 SNPs, a 95% majority matrix (kmer present in >95% of isolates) containing 119,750 SNPs, and a total matrix containing 653,038 SNPs. The inclusion of draft genomes allowed us to use standard NGS technology to collect genomescale data, although the data missing from these genomes meant that our core SNP matrix was too conservative to allow us to perform downstream phylogenetic analyses because such analyses require that SNPs be present in each of the genomes used. The opposite held true for the total SNP matrix, which included all SNPs present for every genome, including SNPs derived from mobile elements (phages and plasmids), SNPs present in lineage-specific genes, and SNPs called due to sequence error. The 95% majority SNP matrix included SNPs that were present in 95% of the taxa or 148 of the 156 genomes. They accounted for inherent missing data in the draft genomes while omitting mobile regions and low-quality SNPs that could potentially add noise or obscure phylogeny (supplementary data S2, Supplementary Material online).

### Phylogeny and Diversification

Phylogenetic analysis of the 95% majority matrix resulted in an ML tree with strong support for the monophyly of subspecies *S. enterica* subsp. *enterica* (fig. 1). Within the *S. enterica* 

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Fig. 1.—Phylogenetic tree based on the maximum-likelihood method implemented in RAXML. Bold black branches represent 90–100% bootstrap support. Bold gray branches represent 70–90% bootstrap support. Numbers associated with branches are SNPs unique to that lineage. For the purposes of this figure, the long outgroup branches were shortened; however, the original tree is available for download at TreeBase.org. Three antigen characters are mapped onto this phylogeny: O group, Phase 1 (H) flagellar antigen, and Phase 2 (H) flagellar antigen.

subsp. *enterica* subspecies, we uncovered a deep split that delineates two sister lineages, Clade A and Clade B, which confirms what others have previously reported (Falush et al. 2006; den Bakker, Switt, Govoni, et al. 2011). In addition to very strong bootstrap support for both clades, we also uncovered 24 unique SNPs for Clade A and six unique SNPs for Clade B.

Figure 1 shows both clades and their sublineages. Within Clade B, S. Infantis (B1 in fig. 1) is an early diverging lineage and the sister group to the remaining serovars in Clade B. Several strongly supported lineages emerge from this group, some of which were suggested in the den Bakker et al.'s Figure 1 phylogeny (den Bakker, Switt, Govoni, et al. 2011). We also found two strongly supported lineages: B2 (S. Miami + S. Javiana) and B3 (S. Poona + S. Rubislaw + S. Abaetetuba) that diverge before the well-supported Clade B4 lineage that contains the most serovar diversity. The majority of serovars (18 out of 20) in Clade B are monophyletic. Two serovars do not appear to be natural groups: S. Abaetetuba is nested within a paraphyletic S. Rubislaw, and S. Give appears to be polyphyletic with two strains that arose independently. Across the monophyletic serovars, there are very strong bootstrap values along with numerous unique SNPs defining each of them (listed above the branches in fig. 1). Salmonella Montevideo revealed the most diversity with three divergent lineages.

Two major lineages comprise Clade A: A1 and A2 (fig. 1). Within lineage A1, there are 17 serovars, of which four serovars are polyphyletic: S. Agona, S. Senftenberg, S. Kentucky, and S. Paratyphi B. Clade A2 contains 45 serovars, demonstrating the most diversity within the S. enterica subsp. enterica. Salmonella Typhi, S. paraphyphi A, and S. Mississippi group into a well-supported lineage we are calling "Section Typhi" (fig. 1). Salmonella Paratyphi C is sister to S. Choleraesuis with very strong support, and three other independent lineages of S. Paratyphi B are scattered throughout group A2. Although there is only moderate support for most of the deep nodes in A2, there are several very strongly supported sublineages. For example, a group we call "Section Enteritidis" is composed of the serovars S. Enteritidis, S. Gallinarum, S. Pullorum, S. Dublin, and S. Berta, which have a welldocumented relationship (Vernikos et al. 2007; Achtman et al. 2012; Allard et al. 2013). "Section Typhimurium" contains the S. Typhimurium + S. 4,[5],12:I- complex, along with S. Saintpaul, part of S. Paratyphi B, S. Heidelberg, and S. Virchow. What we refer to as "Section Newport II" contains a diverse set of S. Newports, one S. Muenchen, and one S. Litchfield. The remaining lineages in A2 were well-supported but contained fewer taxa. Although most of the serovars appear to be monophyletic, several were not. Our analysis revealed multiple independent lineages of S. Newport, two of S. Bareilly, two of S. Saintpaul, and two of S. Muenchen.



Fig. 2.—Lineage-through-time plots illustrating fluctuations in diversification rate throughout the evolutionary history of *S. enterica*.

Clade A2 also exhibits high pathogenicity. Six serovars in this lineage are on the Center for Disease Control's top ten list for foodborne diseases: *S.* Enteritidis (the most prevalent foodborne pathogen in the world), *S.* Typhimurium, I4, [5],12:i:-, *S.* Newport, *S.* Muenchen, and *S.* Heidelberg (http://www.cdc. gov/foodnet/data/trends/tables/table5.html, last accessed June 3, 2013). Also present in A2 are the typhoidal *Salmonella: S.* Typhi and *S.* Paratyphi A, B, and C.

We also looked at broader patterns of diversification across the ML phylogeny (fig. 1). A lineage-through-time plot showed evidence for two episodes of elevated serovar diversification (fig. 2). Early in the evolutionary history of *S. enterica*, there appears to have been a relatively long period of gradually increasing diversity followed by a plateau representing a constant rate of diversification. A second much more punctual increase in the diversification rate appears to have occurred within the recent past. This pattern is congruent with our phylogeny, which showed high levels of diversification early in the divergence process followed by relatively long branches with additional short branches indicative of diversification at the tips (fig. 1).

The degree of genealogical exclusivity exhibited by the 35 serovars for which we had multiple samples was generally quite high (table 1). Specifically, 22 serovars had genealogical sorting index (GSI) values of 1, indicating that all samples from these serovars formed a monophyletic group. Thirteen other serovars had GSI values <1, and only one serovar (*S.* Give) showed a phylogenetic distribution that was not significantly different from random. Among serovars that were not monophyletic (i.e., GSI < 1), isolates were clustered relatively close to one another in a way that statistically supported describing them as genealogically exclusive groups. This was true even for the polyphyletic *S.* Newport samples, which formed two clades.

### Genetic Clusters

Using a model-based Bayesian clustering method, we found that samples generally clustered in a pattern matching the phylogenetic analyses (fig. 3). Focusing on broader groups, at k = 2 (i.e., the number of clusters to which samples could

### Table 1

Serovar-Level Characters and Statistics

Salmonella	Number	GSI	Antigen Characters		
enterica subsp.	of Strains				
enterica serovar			O Group	H Phase 1	Phase 2
4,[5],12:i:-	2	0.245	4	i	_
Abaetetuba	1	NA	11	k	1,5
Abony	1	NA	4	b	e,n,x
Adelaide	1	NA	35	f,g	_
Agona	4	0.258	4	f,g,s	[1,2]
Alachua	1	NA	35	z4,z23	—
Albany	1	NA	8	z4,z24	—
Anatum	2	1.000	3,10	e,h	1,6
Baildon	1	NA	9,46	а	e,n,x
Bareilly	6	0.364	7	у	1,5
Berta	1	NA	9	[f],g,[t]	—
Braenderup	2	1.000	4	e,h	e,n,z15
Bredeney	1	NA	4	l,v	1,7
Cerro	1	NA	18	z4,z23	[1,5]
Chester	1	NA	4	e,h	e,n,x
Choleraesuis	3	1.000	7	с	1,5
Cubana	1	NA	13	z29	_
Derby	1	NA	4	f,g	[1,2]
Dublin	2	1.000	9	g,p	_
Eastbourne	1	NA	9	e,h	1,5
Enteritidis	3	1.000	9	g,m	_
Gallinarum	2	0.497	9	_	_
Gaminara	2	1.000	16	d	1,7
Give	2	0.105	3,10	l,v	1,7
Hadar	2	1.000	8	z10	e,n,x
Hartford	1	NA	7	у	e,n,x
Havana	1	NA	13	f,g,[s]	_
Heidelberg	3	1.000	4	r	1,2
Hvittingfoss	1	NA	16	b	e,n,x
Indiana	1	NA	4	z	1,7
Infantis	1	NA	7	r	1,5
Inverness	2	1.000	38	k	1,6
Javiana	3	1.000	9	l,z28	1,5
Johannesburg	1	NA	40	b	e,n,x
Kentucky	4	0.235	8	i	z6
Litchfield	1	NA	8	l,v	1,2
London	1	NA	3,10	l,v	1,6
Manhattan	1	NA	8	d	1,5
Mbandaka	1	NA	7	z10	e,n,z15
Meleagridis	1	NA	3,10	e,h	l,w
Miami	1	NA	9	a	1,5
Minnesota	2	1.000	21	b	e.n.x
Mississippi	1	NA	13	b	1,5
Montevideo	5	1.000	7	g,m,[p],s	[1,2,7]
Muenchen	3	0.392	8	d	1,2
Muenster	2	1.000	3,10	e,h	1,5
Nchanga	2	1.000	3.10	l,v	1,2
Newport	7	0.480	8	, e,h	1,2
Norwich	1	NA	7	e,h	1.6
Ohio	1	NA	7	-, b	Lw
Oranienburg	2	1.000	, 7	~ m.t	[257]
Panama	- 1	NΔ	, 28	Lv	1.5
	'		20	.,.	.,.

(continued)

Salmonella Num		GSI	Antigen Characters			
<i>enterica</i> subsp. <i>enterica</i> serovar	of Strains		O Group	H Phase 1	Phase 2	
Paratyphi A	3	1.000	2	а	[1,5]	
Paratyphi B	9	0.270	4	b	1,2	
Paratyphi C	1	NA	6,7	с	1,5	
Pomona	1	NA	28	у	1,7	
Poona	1	NA	13	Z	1,6	
Pullorum	2	1.000	9	_	_	
Rissen	1	NA	7	f,g	_	
Rubislaw	2	0.497	11	r	e,n,x	
Saintpaul	4	0.216	4	e,h	1,2	
Schwarzengrund	2	1.000	4	d	1,7	
Senftenberg	6	0.397	1,3,19	g,[s],t	_	
Sloterdijk	1	NA	4	z35	z6	
Soerenga	1	NA	30	i	l,w	
Stanley	1	NA	4	d	1,2	
Stanleyville	1	NA	4	z4,z23	[1,2]	
Tallahassee	1	NA	8	z4,z32	_	
Tennessee	3	1.000	7	z29	[1,2,7]	
Thompson	1	NA	7	k	1,5	
Typhi	2	1.000	9	d	_	
Typhimurium	4	0.745	4	i	1,2	
Uganda	1	NA	3,10	l,z13	1,5	
Urbana	2	1.000	30	b	e,n,x	
Virchow	2	1.000	7	r	1,2	
Wandsworth	1	NA	39	b	1,2	
Weltevreden	1	NA	3,10	r	z6	
Worthington	1	NA	13	z	l,w	

NOTE.-GSI, genealogical sorting index. NA, not applicable.

be assigned), our results provide additional support for Clades A and B; but we also found that there is a degree of admixture or similarity in SNP profiles among some samples that break out into a third relatively distinct cluster at k = 3. At k = 5, there is another cluster composed only of S. Paratyphi A isolates (fig. 3).

### **SNP** Annotation

Table 1 Continued

Each of the 119,750 SNPs derived by a reference-free method was mapped to the reference genome, S. Typhimurium LT2 (GenBank: AE006468), for annotation and deposited in NCBI's dbSNP database accessible with the following Submitter SNP (ss) accession numbers: 749616252-749736198. Detailed annotation was extracted for Clades A and B SNPs, which were the major clades of interest (table 2). There are 24 SNPs unique to the Clade B lineage. Four of these fell within intergenic regions, two are nonsynonymous and 18 are synonymous substitutions within protein coding regions. Both of the nonsynonymous substitutions are in transcriptional activators or genes that activate transcription. The Clade A lineage, although large, showed only six unique SNPs. One occurred



Fig. 3.—Bayesian clustering results for values of k = 2-5 based on the matrix containing SNPs present in at least 95% of the samples (outgroups were excluded). Different colors represent different clusters and the bars represent different individuals. The extent to which different colors comprise a bar is indicative of the degree of admixture. Samples are in the same order as they are in the ML phylogeny (fig. 1), which is shown for comparison.

within an unannotated region, one was nonsynonymous and the remaining four were synonymous substitutions.

Detailed annotation was also summarized for the well-supported "sections" highlighted in figure 1. "Section Typhi" had 51 unique SNPs, "section Enteritidis" had 34 SNPs, "section Typhimurium" had nine SNPs, and "section Newport II" had six SNPs (supplementary data S3, Supplementary Material online). In summary, 11 SNPs occurred in intergenic regions, twenty-one are nonsynonymous and the rest are synonymous substitutions within protein coding regions.

## Clustered Regularly Interspaced Short Palindromic Repeats

CRISPR loci 1 and 2 were determined and aligned for 126 *Salmonella* strains. The alignment revealed mixed homology across serovars (supplementary data S4, Supplementary Material online) with an increase of shared spacers toward the ancestral end of the CRISPR array, nearest to the trailer. For example, spacer 1 in CRISPR 2 is shared across 41 genomes representing multiple serovars. Spacers are only added to the leader (5') end of the CRISPR array, which allows us to assume unidirectional deletion determinations.

Both spacer alignments are hypotheses, and each revealed the degradation of many internal spacers. This is more obvious when multiple strains are sampled within a single serovar, as is the case within *S*. Typhimurium for both CRISPR 1 and 2. Each CRISPR sequence was mapped onto the SNP phylogeny and pruned for missing taxa (fig. 4). The first four spacers are shown along with the total spacer number in each array, with their length represented as a bar chart. Spacer numbers vary within and between serovars and across the CRISPR loci. The median number of spacers in CRISPR 1 and 2 are 13 and 14, respectively, which also accounts for *S*. Mbandaka in CRISPR 2, which is an outlier with an unusually large array (113 spacers).

### Phylogenetic Signal

Antigen character states for each of the 78 serovars were derived from Kaufman and White's antigenic formulas (Grimont and Weill 2007) and mapped onto the ML phylogeny (fig. 1). We considered O group factors and two flagellar (H) antigens: H Phase 1 and H Phase 2. As shown in figure 1, the selected antigen character states appear in clusters on the phylogeny, but most are not monophyletic (i.e., O group 4 appears to have arisen at least four separate times). Their GSI scores only reveal a subset of character states that show significant genealogical exclusivity (or monophyly) (table 3). Despite these patterns, all three characters showed significant (P = 4.9E - 09)phylogenetic signals 2.51E-09, and 1.39E-15, respectively) when compared with a star phylogeny (table 4).

Table 2 SNP Annotations	s for Clade A	and Clade I	B as Determined by	y ksnp					
kSNP Locus ID	Annot.	aa	Codon	Pos. in	AE006468	Gene	Locus	Strand	Product Name
		Change	Change	CDS	Location		Tag		
Clade B SNPs									
115230	Coding	A_A	פככ־פכפ	345	2417643		STM2310	I	lsochorismate synthase
139194	Coding	۹ ۲	כככ_ככפ	06	729566	gltl, menF	STM0665	Ι	Glutamate/aspartate transporter
198788	Coding	S_S	AGC_AGT	126	2402046	yfaZ	STM2294	Ι	Putative inner membrane protein
22659	Coding	<u>&gt;_</u> >	GTC_GTT	125	1784052	sapA	STM1692	+	ABC superfamily peptide transport protein
245765	Coding	<u>۷</u> _۷	GTC_GTT	206	1276770	plsX	STM1192	+	Putative fatty acid/phospholipid synthesis protein
2656	Coding	ŢŢ	ACC_ACT	57	17316		STM0017	I	Putative protein
266398	Coding	A_A	GCC_GCT	30	1518497		STM1441	Ι	Putative inner membrane protein
267325	Coding	Ľ	CTG_TTG	370	552354	fsr	STM0493	I	Putative MFS family of transport protein
34745	Intergenic				80406			+	Upstream of STM0068, transcriptional regulator
365928	Intergenic				1332201			+	Upstream of STM1246, reduced macrophage survival protein
370045	Coding	S_S	TCA_TCG	460	2727192	lepA	STM2583	Ι	GTP-binding elongation factor
389879	Coding	⊐ı	ATC_ATT	97	729545	gltl	STM0665	Ι	Glutamate/aspartate transporter
407961	Coding	A_T	ACG_GCG	26	2929670	mig-14	STM2782	+	Putative transcription activator
421386	Coding	۹ ۲	CCC_CCT	43	2022982	yecG	STM1927	+	Putative universal stress protein
44415	Coding	>_>	GTA_GTT	109	4820845	yhhl	STM4566	I	Putative cytoplasmic protein
457785	Intergenic				3515395			+	Upstream of STM3348, serine endoprotease
461849	Coding	T_T	ACC_ACT	26	2438962	nuoB	STM2327	I	NADH dehydrogenase I chain B
559334	Coding	פֿט	GGG_GGT	294	1524368	tyrS	STM1449	+	Tyrosine tRNA synthetase
572551	Coding		ACA_ACC_ACT	650	2618849	rihC	STM2503	I	Putative diguanylate cyclase
609237	Coding	۹ ۲	CCA_CCG	13	60202	mig-14	STM0051	+	Putative purine nucleoside hydrolase
631239	Coding	E_K	AAA_GAA	56	2929760		STM2782	+	Putative transcription activator
632030	Coding	A_A_A	GCA_GCC_GCT	502	132233	leuA	STM0113	Ι	2-isopropylmalate synthase
647650	Intergenic				1528293			Ι	Upstream of STM1542, putative POT family peptide transport protein
78823	Coding	L_L	TTA_TTG	41	1832990	cls	STM1739	+	Cardiolipin synthase
Clade A SNPs									
135358	Intergenic				2449145			+	Upsteam of STM2338, phosphotransacetylase
267325	Coding	Ļ	CTG_TTG	370	552354	fsr	STM0493	Ι	Putative MFS family of transport protein
271444	Coding	$\lambda_{-}$	TAC_TAT	279	59782		STM0050	+	Putative nitrite reductase
370045	Coding	S_S	TCA_TCG	460	2727192	lepA	STM2583	Ι	GTP-binding elongation factor
510549	Coding	D	AAC_GAC	144	2401994	yfaZ	STM2294	Ι	Putative inner membrane protein
572551	Coding	ד_ד_ד	ACA_ACC_ACT	650	2618849		STM2503	I	Putative diguanylate cyclase
NOTESNPs th	hat produce no	nsynonymous	amino acid substitutic	ons are highl	ighted in Bold.				

# GBE



Fig. 4.—ML phylogeny from figure 1, pruned for strains for which we have CRISPR data (126 in-house collected draft genomes plus published complete genomes). The four most ancestral spacers were extracted from the CRISPR alignment in supplementary data S4, Supplementary Material online and mapped onto the tree. Spacers with the same coloring represent the exact same underlying sequence. Different coloring represents different underlying sequence. Blue bars represent CRISPR length, which was determined from the number of unaligned spacers for each CRISPR locus. Spacer deletions are represented by a black square with an x.

Tab	le 3					
GSI	Values	for	the	Antigen	Character	States

Antigens	Num Taxa	GSI	P-value
O group			
8	11	0.27	0.001
3,10	9	0.14	0.490
16	2	0.05	0.893
7	13	0.26	0.003
4	20	0.16	0.461
9	9	0.24	0.010
35	2	0.13	0.165
13	4	0.15	0.158
1,3,19	2	0.11	0.226
30	2	0.06	0.774
28	2	0.24	0.050
11	2	1.00	0.008
Flagellar anti	igen (H) Phase 1		
D	7	0.17	0.130
e,h	11	0.14	0.544
l,v	7	0.16	0.168
b	10	0.15	0.361
У	4	0.10	0.546
z10	2	0.10	0.284
а	3	0.10	0.395
i	5	0.15	0.173
r	5	0.17	0.078
-	2	0.49	0.017
z4,z23	3	0.10	0.474
k	2	0.07	0.607
с	2	1.00	0.007
f,g	3	0.13	0.169
z	3	0.11	0.297
z29	2	0.24	0.052
g,s,t	2	0.11	0.226
f,g,s	3	0.20	0.038
Flagellar anti	igen (H) Phase 2		
1,2	20	0.24	0.011
1,5	15	0.27	0.002
1,6	5	0.16	0.122
e,n,x	10	0.21	0.043
e,n,z15	2	0.10	0.288
-	16	0.28	0.001
l,w	4	0.16	0.106
1,7	7	0.26	0.003
1,2,7	2	0.06	0.766
z6	4	0.25	0.010

P<0.05 are in bold.

#### Table 4

MultiState Lambda Test for Phylogenetic Signal

### Discussion

Using these 156 draft and complete *Salmonella* genomes enabled us to present the most highly resolved phylogeny for *S. enterica* subsp. *enterica* to date. This will be a valuable tool for understanding the phylogenetic and population genetic diversity among *Salmonella* food pathogens and will promote quicker and more accurate tracebacks when future foodborne illness outbreaks occur.

Despite the limitations stated previously of inferring phylogeny from an SNP matrix, this approach has yielded far more variable characters for inferring evolutionary history than any previous study. Although many of the relationships reconstructed in this study are consistent with previous reports, our increased data collection and taxon sampling provide a better context for interpreting the evolutionary history in this group. For example, previous studies showed the S. Typhi group as sister to the remaining Clade A (den Bakker, Switt, Govoni, et al. 2011; Fricke et al. 2011; Leekitcharoenphon et al. 2012; Desai et al. 2013). By contrast, our study clearly places the Typhi group as a derived lineage nested within Clade A. The four named lineages in this study (fig. 1) all showed previous phylogenetic support or had additional antigen characters that supported the relationship. "Section Typhi's" antigen characters were variable, but these relationships were previously seen by eight studies (McClelland et al. 2004; Vernikos et al. 2007; den Bakker, Switt, Govoni, et al. 2011; Fricke et al. 2011; Jacobsen et al. 2011; Brankatschk et al. 2012; Yue et al. 2012). "Section Typhimurium" serovars are characterized by an O:4 group, and most have H: 1,2 Phase 2 flagellar antigens as well as previous phylogenetic support (den Bakker, Switt, Govoni, et al. 2011; Fey et al. 2012; Leekitcharoenphon et al. 2012). Along with previous molecular support (Vernikos et al. 2007; Didelot et al. 2011; Brankatschk et al. 2012; Leekitcharoenphon et al. 2012), "Section Enteritidis" serovars are characterized by having mostly O:9 groups and no Phase 2 flagellar antigens. Although no previous study uncovered the "Section Newport II" relationships (Newport + Muenchen + Litchfield), the lineage is very strongly supported in our ML tree and is also congruent with antigen characters: all have O:8 groups and 1,2 phase-2 flagellar antigens.

There has also been strong support coalescing around the sister relationship between *S*. Paratyphi C and *S*. Choleraesuis

Character		Ultrametri	c Tree	Star Phylog	geny (Null)	Lambda Test	
	Trait1.Inl	Trait1.q	Trait1.treeParam	Trait1.Inl.1	Trait1.q.1	Likelihood Ratio	P from Chi-Squared Test
O antigens	-226.91	-1.74	0.90	-244.18	11.34	34.53	4.19E-09
H antigen, phase 1	-269.36	-3.41	0.98	-287.13	-16.63	35.53	2.51E-09
H antigen, phase 2	-185.02	-1.44	0.90	-216.91	-14.40	63.78	1.39E-15

(Kingsley and Bäumler 2000; Liu et al. 2009; Soyer et al. 2009; Didelot et al. 2011; Fricke et al. 2011; Jacobsen et al. 2011; Trujillo et al. 2011; Achtman et al. 2012; Brankatschk et al. 2012). Because this is such a long, strongly supported branch (455 unique SNPs on our ML tree), it will be interesting to watch as our taxon sampling grows to include all ~1,500 *S. enterica* subsp. *enterica* serovars. Taxon sampling, nucleotide character type, and phylogenic methods all influence inferred phylogeny, as shown by several earlier studies that reveal different relationships within our named sections (Bäumler et al. 1998; Kingsley and Bäumler 2000; Zou et al. 2013). Multilocus sequencing typing methods (Achtman et al. 2012) are mostly consistent with our results but suffer from zero resolution at the deeper nodes.

Our GSI analyses generally support the current taxonomic alignments; however, future research should investigate the nonmonophyletic serovars to explain the incongruity between experimentally based taxonomic alignments and what has been predicted by the genealogical species concept (Baum and Shaw 1995). Early molecular literature showed evidence of multiple independent origins for *S*. Paratyphi B (Barker et al. 1988), which we also recover (fig. 1 shows four independent *S*. Paratyphi B lineages). As mentioned in the Introduction, we also recovered a polyphyletic *S*. Newport II and *S*. Newport III, which was expected based on earlier investigations (Sangal et al. 2010; Achtman et al. 2012; Cao et al. 2013) (fig. 1). Little is known regarding multiple origins for the other serovars we found to be polyphyletic.

Overall, the three antigen characters (O group and two flagellar [H] antigens) revealed significant phylogenetic signals (table 4), but only a few antigen states had a significant GSI value, indicating that the character distribution for most of the antigens cannot be distinguished from random. Despite this, several characters did reveal a significant GSI (table 3), suggesting some degree of shared ancestry with other antigen characters. A few of the most common O groups are highlighted on the ML tree (fig. 1). Although it is possible that the deeper branching is incorrect, it is highly improbable that all of the O:4 strains shared the same most recent common ancestor, and, in fact, this is reflected in its GSI value (P= 0.46).

Without approaching a more complete taxon sampling for all ~1,500 serovars within *S. enterica* subsp. *enterica*, any hypotheses regarding patterns of antigen evolution will be difficult to fully test. However, our study does suggest that the genes responsible for the O groups and phase 1 flagellar antigen traits are not evolving in a linear fashion, which, in turn, suggests that HGT, convergent evolution, or another mechanism may play an important role in these evolutionary patterns. Phase 2 antigens appear to have more shared ancestry, and this is reflected by the higher proportion of significant GSI values (table 3).

Analyzing character states for the CRISPR regions is much more complex than analyzing for discrete antigen characters. Between any given pair of Salmonella serovars, the CRISPR locus can be entirely replaced, leaving no homologous spacers to compare. Fabre et al. (2012) analyzed the utility of the CRISPR locus to "type" Salmonella strains or to determine serovar-level taxonomy. Our analysis provides an evolutionary framework to view the phylogenetic patterns of CRISPR diversity (fig. 4). Spacers can be deleted anywhere in the locus (spacer decay noted with "x" boxes), but they are only added to the 5' end, leaving the 3'-most spacer as the most ancestral. When we look at all the CRISPR locus alignments (supplementary data S4, Supplementary Material online), we find evidence of decay scattered through each CRISPR locus. For example, S. Stanleyville, S. Gallinarum, and S. Pullorum appear to have lost the first four spacers in CRISPR2. If there is no evidence of homology, the 3' spacer assumes position number 1.

Visualizing the first four spacers highlights the most informative ancestral pattern, whereas the length bar alludes to diversity even within serovars (e.g., length variation with S. Montevideo strains). There is also a striking reduction of CRISPR length in both locus 1 and locus 2 across several Clade A2 lineages. Overall, the diversity revealed by the uniqueness of the first four spacers closely resembles taxonomic diversity: There are 77 unique CRISPR 1 categories and 80 CRISPR 2 categories. If the CRISPR region is evolving in a linear fashion, we should expect closely related serovars to share more of the ancestral spacers. Although this pattern emerges in some parts of the tree (e.g., "Section Enteritidis"), it is more common to see shared ancestral spacers spanning the ML tree. For example, the same four ancestral CRISPR1 spacers are shared across three unrelated lineages: Three strains of S. Seftenberg (str. 604314, 316235162, and 423984-2), two S. Anatums, and one S. Virchow. So, although the CRISPR 1 and 2 loci might contain the appropriate level of variation for typing, and perhaps subtyping, within diverse serovars, the stability of the loci within and between serovars needs further investigation before its utility as an identification tool can be established.

### Conclusions

We present the largest, most-resolved phylogeny of *S. enterica* subsp. *enterica* to date. Past typing methods gave us a very coarse view of strain diversity. Antigen screening, PFGE, multilocus sequence typing (MLST), and a newly proposed CRISPR typing will all produce some level of ID; however, these methods are not currently able to place a new unknown strain into an evolutionary context, and that lack of context prevents more robust track-and-trace of contamination sources. Our research contributes the largest genome-scale phylogenetic

framework to date toward a fine-scale reference phylogeny for all 1,500 *S. enterica* subsp. *enterica* serovars.

Based on our analysis, antigen characters and CRISPR loci reveal nonphylogenetic patterns. Although these patterns raise interesting evolutionary questions, they call into question the utility of relying on these characters for identification. For this reason, whole genome sequencing, SNP discovery, and phylogenetic analysis are quickly emerging as the standard for disease tracking.

### **Supplementary Material**

Supplementary data S1–S4 and supplementary table S1 are available at *Genome Biology and Evolution* online (http://www.gbe.oxfordjournals.org/).

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