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Full title: The population structure of *Pseudomonas aeruginosa* is characterized by genetic isolation of *exoU*+ and *exoS*+ lineages

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Abstract:

The diversification of microbial populations may be driven by many factors including adaptation to distinct ecological niches and barriers to recombination. We examined the population structure of the bacterial pathogen *Pseudomonas* aeruginosa by analyzing whole-genome sequences of 739 isolates from diverse sources. We confirmed that the population structure of *P. aeruginosa* consists of two major groups (referred to as Groups A and B) and at least two minor groups (Groups C1 and C2). Evidence for frequent intra-group but limited inter-group recombination in the core genome was observed, consistent with sexual isolation of the groups. Likewise, accessory genome analysis demonstrated more gene flow within Groups A and B than between these groups, and a few accessory genomic elements were nearly specific to one or the other group. In particular, the exoS gene was highly over-represented in Group A compared to Group B isolates (99.4% vs. 1.1%) and the exoU gene was highly over-represented in Group B compared to Group A isolates (95.2% vs. 1.8%). The exoS and exoU genes encode effector proteins secreted by the P. aeruginosa type III secretion system. Together these results suggest that the major *P. aeruginosa* groups defined in part by the exoS and exoU genes are divergent from each other, and that these groups are genetically isolated and may be ecologically distinct.

Although both groups were globally distributed and caused human infections, certain groups predominated in some clinical contexts.

Key words: population structure, recombination, whole-genome phylogenetics, microbial evolution, accessory genome, *exoU*, *exoS*

Introduction:

Pseudomonas aeruginosa is a gram-negative bacterium that is remarkable for its worldwide ubiquity and extensive environmental distribution in soil, water, and plant matter as well as its ability to cause a variety of opportunistic infections in humans. It is a major cause of morbidity and mortality in hospitalized patients and those with cystic fibrosis. In addition to the production of a formidable number of virulence factors, both intrinsic and acquired antibiotic resistance mechanisms contribute to the species' importance as a human pathogen.

Several previous investigations into the population structure of *P*.

aeruginosa have been undertaken. Earlier studies relied on a variety of typing methods, such as gel electrophoresis banding patterns, multi-locus sequence typing, or microarray analysis to characterize relationships between groups of isolates (Kiewitz and Tummler 2000; Pirnay, et al. 2009; Wiehlmann, et al. 2007). As next-generation sequencing has become more affordable and widely available, *P. aeruginosa* population studies have started using whole-genome comparisons between increasing numbers of isolates (Freschi, et al. 2015; Freschi, et al. 2019; Hilker, et al. 2015; Marvig, et al. 2015; Stewart, et al. 2011;

Williams, et al. 2015). In these phylogenetic analyses, isolates within the populations examined have generally clustered into two large clades and one small clade. The geographical sources of isolates do not appear to account for these phylogenetic clusters (England, et al. 2018; Kos, et al. 2015; Wiehlmann, et al. 2007). Recent studies showed certain genotypes were found more abundantly in environmental isolates than in human-derived isolates, and vice versa (Rutherford, et al. 2018; Wiehlmann, et al. 2015). However, the genetic differences underlying the observed population structure and possible mechanisms for these differences have not yet been defined.

Early studies classified *P. aeruginosa* isolates as either cytotoxic or invasive (Fleiszig, et al. 1996). It was later discovered that cytotoxic isolates usually secreted the effector protein ExoU by a type III secretion pathway (Finck-Barbançon, et al. 1997). ExoU is a patatin-like phospholipase A₂ (PLA₂) enzyme that cleaves lipids within eukaryotic host cell membranes (Phillips, et al. 2003; Sato and Frank 2004). In contrast, invasive isolates usually secreted ExoS, which is a bifunctional enzyme with Rho GTPase-activating protein and ADP-ribosyltransferase activities (Barbieri and Sun 2004) that causes multiple effects on eukaryotic cells, including cell rounding and apoptosis (Barbieri, et al. 2001; Kaufman, et al. 2000). For unclear reasons, the large majority of *P. aeruginosa* isolates contain either the *exoU* or the *exoS* gene, but isolates rarely carry both genes or neither gene (Bradbury, et al. 2010; Feltman, et al. 2001; Garey, et al. 2008; Lomholt, et al. 2001; Pirnay, et al. 2009). This distinction is of clinical importance, as *exoU*+ isolates are associated with more severe infections and

higher mortality in acutely infected patients (El-Solh, et al. 2012; Finck-Barbançon, et al. 1997; Hauser, et al. 1998; Pena, et al. 2015; Schulert, et al. 2003; Shaver and Hauser 2004).

We sought to examine the population structure of a collection of 739 geographically diverse clinical and environmental *P. aeruginosa* isolates using whole-genome phylogenetic analysis. We confirmed that most *P. aeruginosa* isolates fell into one of two large groups based upon the core genome, with rare isolates belonging to one of at least two smaller groups. We showed that core and accessory gene flow between isolates of the same group was much greater than between isolates of different groups, suggesting that the two groups are genetically isolated. We identified core and accessory sequences that were highly discriminatory between the two major groups. In particular, *exoS* was present in nearly all the isolates of one large group and *exoU* in nearly all the isolates of the other large group.

Materials and Methods:

Pseudomonas aeruginosa isolates

A total of 730 genomic sequences representing all complete *P. aeruginosa* genomic sequences as well as all draft genomic sequence contigs was downloaded from the NCBI FTP site (ftp.ncbi.nlm.nih.gov) on Feb 3, 2015. Isolate demographic information including continent and country of origin, clinical or environmental source, and cystic fibrosis (CF) status of the source patient for clinical isolates was determined, when available, from NCBI BioSample or

BioProject entries. In cases where the relevant information was not listed in these resources, associated publications, as listed in the NCBI BioProject entries for the isolates, were manually reviewed for the relevant metadata.

Previously unsequenced environmental isolates

Nine previously-described environmental isolates of *P. aeruginosa* (Feltman, et al. 2001) were selected for sequencing. These isolates were streaked from -80°C frozen stocks, inoculated in Luria-Bertani (LB) broth, and grown with shaking overnight at 37°C. Genomic DNA was extracted from the cultures using the Promega Maxwell 16 instrument (Madison, WI) according to the manufacturer's instructions. Genomic DNA was sequenced on the HiSeq 2000 platform yielding 101 bp paired-end reads. To maximize assembly quality (Wall, et al. 2014), each paired read set was randomly down-sampled to obtain estimated 80-fold genome coverage and de novo assembled using Ray v1.7.0 (Boisvert, et al. 2010). Assembled contigs smaller than 200 bp were removed from the analysis. Contig sequences were deposited in GenBank under assembly accession numbers GCA 002239415.1, GCA 002239425.1, GCA 002239445.1, GCA 002239465.1, GCA 002239485.1, GCA 002239505.1, GCA 002239535.1, GCA 002239545.1, and GCA 002239565.1

Type III effector, O-antigen biosynthesis locus, and genomic island typing

Reference nucleotide sequences of the type III effector genes *exoU* (locus ID PA14_51530 in strain UCBPP-PA14) and *exoS* (locus ID PA3841 in strain PAO1) were obtained from the Pseudomonas Genome Database (Winsor, et al. 2011). Presence or absence of the *exoU* and *exoS* genes was determined by blastn alignment of the *exoU* and *exoS* nucleotide sequences against the genomic sequences of each isolate using default parameters (Altschul, et al. 1990). The contents of *exoS* gene locus were identified using *in silico* PCR to extract sequences between conserved flanking genes PA3840 (ATGCCCGGCCGACCAGCCC) and *spcS* (TCAGCGTAGCTCTTCGGCGG).

O-antigen biosynthetic gene cluster typing was performed using *in silico* PCR. Given the variability in sizes and the heterogeneity of the contents of the O-antigen biosynthetic locus among strains, we chose the *in silico* PCR approach to identify and isolate the loci contents based on conserved flanking region sequences. Sequences of genes *rpsA* (locus ID PA3162 in strain PAO1) and *tyrB* (locus ID PA3139 in strain PAO1), which are conserved and flank the O-antigen region, were obtained from the Pseudomonas Genome Database (Winsor, et al. 2011). The reverse-complement of the first 20 nucleotides of the *rpsA* gene (AGATGGAGAATCAGGGCTAA) were used as the forward primer sequence and the first 20 bases of the *tyrB* gene (CCATCGTCCAGGTCCTGTAG) were used as the reverse primer. *In silico* PCR was performed on each of the genomic sequences using an in-house Perl script

(https://github.com/egonozer/in_silico_pcr) allowing for up to 1 base mismatch and 1 base insertion or deletion in each primer sequence. When primer

sequences were found on separate contigs, sequences from each primer to the respective contig ends were manually joined into a single sequence. The resulting "amplicon" nucleotide sequences were aligned using BLAST against the 21 O-antigen locus nucleotide sequences (Raymond, et al. 2002) to assign each locus to one of the eleven possible O-antigen biosynthetic locus groups. When the length of any reference O-antigen locus aligned to the "amplicon" sequence was less than 90%, BLAST was used to align the whole genome sequence assemblies against the representative O-antigen locus nucleotide sequences to identify the locus group type. This might occur, for example, in cases where the O-antigen locus spanned multiple contigs such that only the locus ends could be identified by *in silico* PCR.

Markers for specific genomic islands were identified by *in silico* PCR using primers described by Morales-Espinosa et al. (Morales-Espinosa, et al. 2012). Up to 1 base mismatch and 1 base insertion or deletion per primer was allowed. An *in silico* PCR result was considered positive if both primer sequences were found on opposite strands on the same contig or if both primer sequences were found on separate contigs, but the distance from the primer sequences to the ends of the contigs each did not exceed the expected amplicon size.

Variant detection and phylogenetic analyses

The kSNP v2.1.2 program (Gardner and Hall 2013) was used to identify single nucleotide polymorphisms (SNPs) in the core genome. Briefly, kSNP identifies variants among genomes by separating assemblies into k-mers, and identifying

k-mers sharing most sequence between isolates but differ by a single nucleotide. For the purposes of this study, the core genome variants were defined as loci found in at least 95% (i.e. ≥702) of the isolates with a variant in at least one of the isolates at that locus. This definition was chosen to minimize the impact on the core genome of a small number of isolates that might have undergone core gene deletion or for which sequencing or assembly errors may have resulted in omission of genetic sequence. All k-mers 21 bp in length were examined, as selected by the Kchooser script included with kSNP.

We chose kSNP for identifying core genome variants and performing phylogenetic analyses for several reasons. First, our data set consisted of assembled genome sequences deposited at NCBI, so we could not use methods to identify variants based on alignments of sequencing reads to a reference. Second, the number of genomes analyzed exceeds the computational limits of other software programs used to align and call variants in assembled genomes. Third, given the variability in assembly qualities and completeness of the genomes used, we thought it important for our analyses to allow some flexibility in the core genome definition to include variants in regions that were present in the large majority of the included isolate assemblies but not necessarily found in every genome. Most available core genome alignment programs will only generate alignments of regions present in 100% of the included isolates. As kSNP can identify single nucleotide variants in assembled genomes, is computationally scalable to analyze large datasets, and allows flexibility in core

genome definition, we chose to use this software for variant detection and phylogenetic analyses.

For secondary validation of the tree structures generated using kSNP, a whole-genome alignment method against a reference sequence was used. Each isolate's genome sequence was aligned to the sequence of *P. aeruginosa* PA14 (accession # CP000438.1) using nucmer, and SNPs were called from the alignment using show-snps. Both programs are part of the MUMmer software suite version 3.23 (Kurtz, et al. 2004). A custom Perl script, nucmer_snp_to_matrix.pl, was then used to filter and arrange SNP loci into a sequence matrix. Any variants against the reference sequence that were within 10 bases of each other or within 5 bases of a contig end were omitted.

FastTreeMP v2.1.7 (Price, et al. 2010) was used to generate a maximum likelihood phylogenetic tree. Phylogenetic trees in this study were visualized using either FigTree v1.4.3 (Rambaut) or Evolview (He, et al. 2016; Zhang, et al. 2012) for different representations and annotations.

Accessory genome characterization

The core genome of the 739 *P. aeruginosa* isolate collection was determined using Spine v0.1.2 (Ozer, et al. 2014). Sequence was considered part of the core genome if it was present in at least 703, or 95%, of the isolates with at least 85% sequence identity. The accessory genome of each input isolate was determined using AGEnt v0.1.3 (Ozer, et al. 2014). ClustAGE was used to align and group the accessory genomic sequences of all isolates and identify the

distribution of accessory genomic elements (AGEs) among the isolates (Ozer 2018). Briefly, AGEs were grouped together by combining accessory sequences from all genomes. Then, starting with the largest AGE, now identified as a representative "bin", AGE sequences from all other isolates were aligned to the bin using blastn (Altschul, et al. 1990). All AGEs aligning to the bin with at least 85% sequence identity and an E-value of at most 1x10-6 were considered "binned" with the representative AGE bin and removed from the pool of potential bins. If only a fraction of an AGE aligned to a particular bin sequence, the unaligned portion of the AGE was returned to the pool of potential bin sequences. The next longest remaining AGE or partial AGE sequence in the bin pool was then used as a blast query sequence against the database of all AGE sequences. This process was continued until all AGEs had either been binned with a representative AGE or served as a bin representative themselves or were less than 200 bp in length. As AGEs are often mosaic in composition between isolates, alignments against each bin representative were then parsed to further subdivide bins into "subelements" at positions along the bin sequence where either the number or identities of genomes from which aligning AGEs were found changed. In this way, a bin could be divided into subelements ranging in size from 1 bp up to the length of the representative bin AGE, with each subelement sequence identified as a continuous sequence element present in the accessory genome of at least one input isolate. We chose to use the Spine/AGEnt/ClustAGE approach to characterize the accessory genome of this population as it is well-suited for identifying commonalities and differences in

genomes from large populations in coding and non-coding sequences alike without *a priori* knowledge of accessory element sequences.

To assess relative amounts of shared accessory genome sequence between pairs of isolates, we adapted an approach described by Shapiro et al. (Shapiro, et al. 2012). Briefly, the Bray-Curtis distance (d) of the accessory genome of each pair of isolates was calculated using sizes of shared AGEs at least 100 bp in length. These distances were used as input to Phylip v3.695 (http://evolution.gs.washington.edu/phylip) to produce a neighbor-joining tree. The neighbor-joining tree was visualized with FigTree v1.4.2 (Rambaut), and the heatmap from the inverse of the Bray-Curtis distances (1-d) was visualized with R v3.4.1 (R Core Team 2016) using the ComplexHeatmap package v1.15.1 (Gu, et al. 2016). Multiple correspondence analysis of AGE distribution was performed using the MCA function of the R package FactoMineR v1.41 (Lê, et al. 2008) and visualized using the factoextra package v1.0.5. Pangenome sizes and new genome sizes for random permutations of genomes were calculated as previously described (Ozer, et al. 2014).

Recombination analysis

To examine patterns of core genome recombination within the population, a 95% core genome multiple sequence alignment was constructed based on the kSNP analysis results. Briefly, we sought to convert the kSNP program output, which is a matrix of variant positions and bases in each isolate, into a multiple sequence alignment representing the distribution of SNVs within a reference

genome. We selected PA14 to serve as the reference sequence representing each of the 739 isolates. Then, for each genome, we used information from the kSNP matrix to change bases at core genome positions in PA14 to match the base found at that position in the non-PA14 isolate sequence. The result was an alignment of 739 sequences, each sequence the length of the PA14 whole genome and each representing the sequence of one of the 739 studied genomes at core genome sites. ClonalFrameML v1.11 (Didelot and Wilson 2015) was used to reconstruct recombination events in the full core genome multiple sequence alignment of all 739 isolates, as well as separately among isolates in each of the major groups. The likely origin of each recombination event detected by ClonalFrameML was inferred using similar methods as previously described (Cao, et al. 2015; Didelot, et al. 2009; Didelot, et al. 2011; Sheppard, et al. 2013) and briefly summarized below. The sequence imported in each recombination event was compared to the imputed sequences of all nodes and leaves in phylogenetic trees of both the recipient group and other non-recipient groups to determine the minimum genetic distance. For recombination events on terminal branches, comparisons to the leaf under that branch were excluded, whereas for recombination events on non-terminal nodes, all comparisons to nodes and leaves below the recombination event were also excluded. If a recombination event was found to have a minimum genetic distance to sequences in the recipient group below the threshold value, but minimum distance to all nonrecipient groups' sequences above the threshold value, the importation event was inferred to have originated within the recipient group. Conversely, if the

minimum distance to the recipient group was above the threshold, but the minimum distance to one of the non-recipient groups was below the threshold, the recombination event was inferred to have originated from the non-recipient group. If no group's minimum distance was below the threshold, the recombination event's source was inferred to be external to the population, and if more than one group's minimum distance was below the threshold, the recombination event's origin was classified as ambiguous. Based on the estimated mean divergence of imported DNA sequences for the population, i.e. the parameter "nu" derived by ClonalFrameML, a threshold distance of 0.002 was chosen. Recombination flow diagrams were produced using GraphViz (http://www.graphviz.org).

To count polymorphic and fixed variants within and between groups of isolates and perform the McDonald-Kreitman test for each gene, a custom Perl script, MKT_per_gene.pl, was developed. Individual gene alignments were extracted from the whole-genome alignment described above. Polymorphisms found in less than 5% of all genomes were ignored. A variant was considered fixed if present in at least 98% of genomes in a group.

Admixture analysis

The core genome multiple alignment described above was also used for admixture analysis. Hierarchical clustering was performed using the hierBAPS module included with BAPS v6.0 (Cheng, et al. 2013) with a maximum cluster number (K) of 35. The results of the first level of clustering were then used as

input for admixture analysis in BAPS v6.0 using default parameters (Corander and Marttinen 2006; Corander, et al. 2008). A gene flow diagram was produced using GraphViz (http://www.graphviz.org).

Average nucleotide identity

Average pairwise nucleotide identity (ANI) was calculated for each pair of genome sequences as previously described (Goris, et al. 2007). For each combination of genome sequences, both reciprocal ANI values were determined.

Statistical analyses

Exact test of goodness-of-fit analyses with Holm corrections for multiple observations were performed in R v3.4.1 (R Core Team 2016).

Results:

Most *P. aeruginosa* isolates segregate into two large phylogenetic groups

Genomic sequences of 730 *P. aeruginosa* isolates representing all complete and draft genome sequences available as of February 3, 2015 were downloaded from the NCBI FTP server. When available, relevant metadata for each sequenced isolate was collected (Supplemental Table 1). The number of genomic sequences from isolates identified as clinical in origin (n=615) far exceeded the number identified as environmental in origin (n=57). To increase the representation of environmental isolates in the data set, we sequenced 9 additional isolates of *P. aeruginosa* previously collected from environmental

sources (Feltman, et al. 2001) (Supplemental Table 1). The total set of assemblies ranged in size from 5,502 kb to 7,586 kb (median 6,644 kb) and consisted of 1 to 2,797 contigs per assembly (median 98 contigs). GC content ranged from 65.19% to 66.87% (median 66.20%).

Next, core genome single nucleotide variants (SNVs) were identified. Core genome single nucleotide variants (SNVs), defined as loci with sequence found in at least 95% (≥ 703) of the 739 isolates and with a variable base in at least one genome, were identified using kSNP v2.1.2 (Gardner and Hall 2013). kSNP uses a reference-free alignment approach to identify SNV differences between genomic sequences by dividing the genomes into equal length k-mers (all possible stretches of k-consecutive nucleotides) and aligning k-mers from different genome sequences to identify inter-isolate base differences. This approach has the advantage of not requiring multiple sequence alignments to a single reference genome, which allows for rapid comparisons of large numbers of genomes. The core genome phylogenetic tree was based on 368,212 core SNV loci identified by kSNP (Figure 1). As has been observed by others (Freschi, et al. 2015; Freschi, et al. 2019; Kos, et al. 2015), the large majority of isolates (98%) fell into one of two major groups designated here as "Group A" (541 isolates) or "Group B" (186 isolates). Most of the remaining isolates cluster onto a third branch of the tree, "Group C" (11 isolates), with some of these isolates demonstrating considerable core genome phylogenetic distance from the Group A and Group B isolates. Isolates in Group C were further subdivided into two smaller subclades, Group C1 (5 isolates) and the more distant Group C2 (5

isolates), with one isolate, CF_PA39, falling between the two groups. The commonly used lab strains PAO1 and PA14 are found in Group A and Group B, respectively (Figure 1). PA7, which has previously been described as phylogenetically distinct from most other *P. aeruginosa* isolates (Roy, et al. 2010), is found in Group C2.

To further support the structure of the phylogenetic tree generated by the reference-free kSNP analysis, we used a secondary reference-alignment-based approach. Assemblies were individually aligned to the PA14 genomic sequence using nucmer (Kurtz, et al. 2004), and all loci with a variant against PA14 in which a nucleotide position was present in at least 95% of the isolates were combined in a sequence matrix containing 502,674 core genome variant loci. The clade structure of the tree produced from this core genome SNV alignment matrix was similar to the tree generated by kSNP (Supplemental Figure 1), supporting the accuracy of the kSNP tree.

Next, the impact of recombination on the core genome phylogenetic tree was examined using ClonalFrameML to identify potential recombination events and reconstruct the phylogeny with corrected branch lengths. The resulting corrected core genome phylogenetic tree showed decreased branch lengths, but the separation of the population into distinct groups remained unchanged (Supplemental Figure 2; note scale bar), indicating that the phylogenetic separation of isolates into Groups A and B was not an artifact of recombination.

Core genome recombination flow indicates a barrier to genetic exchange between Group A and Group B isolates

The differentiation of Group A isolates from Group B isolates could result from the two groups evolving in distinct ecological niches or because of physical and/or genetic barriers that limit recombination between these groups (Cadillo-Quiroz, et al. 2012; Cohan 2002a; Shapiro, et al. 2012). We therefore investigated patterns of core genome recombination among the 739 isolates. First, we used the results of the ClonalFrameML analysis to quantify rates of recombination. In the entire population, the relative rate of recombination was estimated to be about 4-fold less than the mutation rate (R/theta = 0.27). However, because each recombination event can convey multiple nucleotide changes, recombination was estimated to contribute more than 2.5-fold more diversity to the population than mutation (r/m = 2.53, which is the product of R/theta, the mean recombination length delta and the mean divergence of imports nu) (Table 1). Examination of recombination in Group A strains only showed a higher relative rate of recombination versus mutation than the population as a whole (R/theta = 0.55) with an overall greater effect of recombination on diversity (r/m =3.69). By contrast, the relative recombination rate was found to be lower within the Group B isolates (R/theta = 0.17), but due to a ten-fold higher average length of recombinant regions (delta), the relative contribution of recombination to isolate diversification was much higher in the Group B isolates (r/m = 8.43). Repeated analyses of random subsets of isolates from each group confirmed the differences in recombination parameters between the groups (Supplemental Figure 3). These findings indicate that core genome recombination events are quite common in *P. aeruginosa* but that the nature of these recombination events differ between Group A and Group B isolates.

To further examine whether bacteria in Group A and Group B were evolutionarily independent lineages (i.e. that inter-group recombination events are relatively rare compared to intra-group recombination events), we examined the estimated sources of recombinant sequence. To infer likely recombinant region origins, genetic distances were calculated between recombination event sequences and their corresponding pre-recombination sequences as reconstructed by ClonalFrameML in each group of isolates. In Group A isolates, 13,489 (75.0%) of 17,993 recombination events likely originated from within Group A but only 150 events (0.8%) originated from Group B (Figure 2A). Similarly, in Group B isolates, 1,219 (74.6%) of 1,635 recombination events likely originated from within Group B but only 20 events (1.2%) originated from Group A (Figure 2B). Fewer than 0.5% of recombination events in either Group A or Group B isolates were attributed to a source among Group C1 or Group C2. A total of 10.7% and 6.1% of recombination events in Group A and Group B isolates, respectively, were sequences that likely originated from Groups A, B, C1, or C2, but the source could not be unambiguously assigned to a single group. The remaining recombination events in each group were predicted to be from an "external" origin (i.e. from a source genome outside of Groups A, B, C1, or C2). A limitation of this analysis is that the relatively small number of isolates in Group C1 and Group C2 included in this population may have precluded an

accurate estimation of the true overall diversity of this group, potentially causing some recombinant sequences from these groups to be attributed to an external donor source. Recent reports have identified additional isolates that belong to the C subgroups (Freschi, et al. 2019), which should allow future studies to better analyze their genomic features. The overall finding of a strong bias towards intra-group recombination relative to inter-group recombination suggests a barrier to cross-group exchange of genetic material (Ansari and Didelot 2014; Didelot, et al. 2010), which is consistent with the notion that Groups A and B inhabit distinct ecological niches or that a genetic barrier to recombination exists between them.

To examine the relative distribution of recombinant sequence between major groups in the population, we used BAPS (Corander and Marttinen 2006; Corander, et al. 2008) to perform hierarchical clustering and admixture analysis based on core genome SNV loci. Admixture here refers to a measure of shared genetic ancestry between isolates. Hierarchical clustering separated the isolates into 4 clusters corresponding to Groups A, B, C1, and C2, with limited admixture and gene flow between clusters (Supplemental Figures 4A and 4B). An exception within Group B was a closely related set of four isolates (AZPAE15041, AZPAE14888, AZPAE14878, and BL03) that were estimated to be admixed with approximately 40% of their sequences attributable to Group A (Supplemental Figure 4A, Figure 1). Interestingly, these four isolates had no clear connections with each other by geographic or clinical isolation source (Supplemental Table 1). The only other isolate with a similar level of admixture was strain PS75, which in the core genome phylogenetic analysis branched midway between the two major

Groups A and B but was distinct from the Group C branch (Figure 1). The provenance of this isolate could not be derived from publicly available information. Although there are other predicted core genome admixture events between isolates within the major clades, admixed isolates represent a small minority of the population. The overall limited amounts of admixture between Group A and Group B isolates supports the possibility that these groups may be independent lineages and consistent with the evolutionary concept of distinct species.

Identification of candidate core genes that may be niche-adaptive

Fixed differences in core gene loci may point to positive selection in distinct ecological niches. These variations may arise sequentially and become fixed as strains adapt to a new niche or as the result of population-wide genespecific sweeps mediated by core genome recombination. We examined the core genomes of Group A and B isolates for evidence of group-specific fixed variants. From among 369,282 core genome SNV loci, we identified 240 dimorphic SNV loci with one allele present in at least 98% of Group A isolates and a different allele present in at least 98% of the Group B isolates (Supplemental Table 2). Interestingly, the group-defining dimorphic nucleotide positions are localized primarily to one half of the *P. aeruginosa* chromosome (Figure 3). Of these 240 dimorphic SNV loci, 213 are located within a total of 89 protein-coding genes; 48 SNVs in 34 genes are predicted to encode non-synonymous variations. To examine the likelihood that the dimorphic SNV loci may have been identified by

chance, each of the isolates in Groups A and B were randomly assigned to either Group A_N (541 isolates) or Group B_N (186 isolates). The number of SNV loci that were dimorphic in Groups A_N and B_N were then counted. This analysis was repeated for 1000 random permutations of isolates into the two groups and in each permutation, 0 dimorphic SNV loci were identified. This indicates that the fixed dimorphic SNVs are unlikely to have occurred by chance.

Assigning putative functional categories to each of the dimorphic-SNVcontaining genes using the Clusters of Orthologous Groups of proteins (COG) database (Tatusov, et al. 1997; Tatusov, et al. 2001) showed that many of the genes containing non-synonymous differentially fixed mutations were predicted to encode proteins involved in signal transduction (e.g. two-component systems and transcriptional regulators) or metabolic functions (Supplemental Figure 5B, Supplemental Table 2), perhaps indicating a fine-tuning of signaling and metabolic capacities to meet the requirements of different niches. Evaluation of fixed vs. polymorphic variants using the McDonald-Kreitman test (McDonald and Kreitman 1991) revealed that several of the 34 genes with dimorphic SNVs predicted to encode non-synonymous variants had neutrality index values below 1, suggesting positive selective pressure (Rand and Kann 1996). However none of the differences were statistically significant (Supplemental Table 3). The lack of significance is likely secondary to the low numbers of variants causing reduced statistical power, but we cannot exclude the possibility that substantial selective pressures may not differ within vs. between groups at the level of individual genes. Despite this, the presence and characteristics of genetic loci containing

dimorphic SNPs could suggest a trend towards fixation of particular variants within the groups, potentially reflecting adaptation of Group A and B isolates to their respective ecological niches.

Accessory genome differences support a barrier to genetic exchange between

Group A and Group B isolates

Similar to core genome recombination, horizontal transfer of accessory genomic elements may also be limited in strains inhabiting distinct ecological niches. For this reason, we next examined the distribution of accessory genomic elements in the two large groups of *P. aeruginosa*. Characteristics of the core-, accessory-, and pangenomes of the sequence collection are shown in Table 2. Analysis of the pangenome and novel sequences identified in each additional genome suggests that, similar to the population as a whole, the pangenome of P. aeruginosa Groups A and B are open (Supplemental Figure 6) (Tettelin, et al. 2008). A total of 7,239 unique contiguous AGE sequences at least 200 bp in length were identified; these were further subdivided into 68,830 discrete AGE subelements. Multiple correspondence analysis of the 21,453 AGE subelements at least 100 bp in length showed that the accessory genomes of Group A, B, C1, and C2 isolates are relatively distinct (Figure 4A). Bray-Curtis distances based on presence or absence in each isolate of discrete accessory sequences at least 100 bp in length were calculated, used to produce a neighbor-joining tree, and visualized as a heat map of isolate-isolate accessory genome content similarity (Figure 4B). This analysis showed that the accessory genomes of Group A

isolates were overall more similar to each other than to those of Group B isolates, and vice versa. Similarly, an analysis of the pangenome sizes of 1000 random subsets of genomes from each group showed that the average pangenome size of isolates from Groups A and B together was significantly larger than the average pangenome size of isolates within either Group A or Group B alone (Supplemental Figure 7). Together, these results suggest that Group A and Group B isolates have acquired a somewhat different albeit overlapping set of accessory genome sequences.

We next examined the distribution of previously characterized genomic islands (GIs) in the *P. aeruginosa* groups. As GI sequences can be highly mosaic and fragmentary between isolates, we focused on subsets of these Gls. We used validated PCR primer sequences and an in-silico "PCR amplification" approach to detect portions of the GIs PAGI-1, PAGI-2, PAGI-3, PAGI-4, PAPI-1, PAPI-2, and pKLC102 (Morales-Espinosa, et al. 2012). Consistent with the Bray-Curtis analysis, most GI sequences were identified in members of both Group A and Group B, although portions of PAGI-4, PAPI-1, PAPI-2, and pKLC102 were found to have a statistically significant overabundance in one group or the other (Supplemental Table 4). These results demonstrate that many of the characterized P. aeruginosa GIs are found in isolates from both Groups A and B but that some are not evenly distributed between the groups. This may indicate that some GIs are preferentially lost or gained in one ecological niche or the other and/or that genetic barriers exist such that some GIs are more easily transferred between isolates within a group than across groups.

O-antigen polysaccharides, which comprise the terminal portion of lipopolysaccharide (Rocchetta, et al. 1999), are common receptors for phages that infect *P. aeruginosa* and therefore are under strong selection (Temple, et al. 1986). Although nearly every isolate of *P. aeruginosa* has an O-antigen biosynthesis island at the same genomic locus, these islands vary significantly in the number and types of genes they carry (Kung, et al. 2010; Raymond, et al. 2002). We therefore examined the genes at the O-antigen biosynthetic locus in each isolate. Many of the O-antigen biosynthesis islands differed significantly in their incidence in one phylogenetic group relative to the other (Figure 5A, Supplemental Table 5). In particular, the predominant O-antigen biosynthetic island type, O6, was found exclusively in Group A isolates, whereas the O11 island predominated in Group B isolates. These findings suggest that different O-antigen types may provide differential selection in distinct niches inhabited by Group A and Group B isolates.

Identification of candidate accessory genes that may provide niche-adaptive characteristics

Bacteria can adapt to new niches following horizontal gene transfer of an adaptive gene or genes (Cohan and Koeppel 2008). However, genes adaptive for one niche may confer a cost when transferred into another niche and can thus be recognized by their nearly universal presence in isolates from one niche but not the other (Cohan 1994). Our examination of characterized GIs indicated that portions of some islands were over-represented in one group or the other

(Supplemental Table 4). To further investigate this in an unbiased manner, we applied filters to detect all AGEs found in at least 90% of isolates in Group A and no more than 10% of isolates in Group B, and vice versa. From a total of all 68,830 AGEs at least 1 bp in length, 11 contiguous groups of AGEs were identified as being predominantly found in Group A isolates. These 11 AGE groups contained portions of 8 different genes, including genes predicted to encode a pilus assembly chaperone and components of an ABC transporter (Supplemental Table 6). A total of 26 complete or partial genes in 16 AGE groups were found predominantly in Group B isolates. These included genes predicted to encode a protein disulfide isomerase, a potassium uptake protein, a nucleoside-binding outer membrane protein, and a zinc-binding oxioreductase (Supplemental Table 6). As mentioned, these genes could potentially play a role in allowing *P. aeruginosa* to better persist is specific environmental niches. In this regard, it is interesting that one of the AGEs predominant in Group B isolates, PAgrpB 7, consists of the GI RGP32, which had been previously described to contain stress-associated genes such as the flavodoxin-encoding gene fldP (Moyano, et al. 2014). The cyanobacterial flavodoxin in this island has been shown to promote P. aeruginosa survival in mammalian macrophages and increase virulence in *Drosophila* infections.

Analyses of 1000 random reshufflings of the isolates into two groups containing 541 and 186 isolates did not identify any AGEs that were similarly predominant in one or the other random group. Similarly, no group-predominant

AGEs were found following 1000 random reshufflings of isolates into two groups containing balanced numbers of 360 isolates each.

These results identify several group-associated accessory genes.

Although it is possible that one or more of these genes provides a niche-specific selective advantage to isolates in that Group, the non-random association of these genes with isolates in a particular Group could also be the result of early acquisition and subsequent propagation after niche specialization independent of any specific evolutionary advantage or barriers to gene flow between them.

The preceding analysis also identified the exoS and exoU genes as being highly segregated between Groups A and B. These genes encode effector proteins of the P. aeruginosa type III secretion system. It has been previously reported that nearly every isolate of P. aeruginosa has either the exoS gene or the exoU gene, with only rare isolates containing both genes or neither gene (Bradbury, et al. 2010; Feltman, et al. 2001; Garey, et al. 2008; Lomholt, et al. 2001; Pirnay, et al. 2009). Of note, 528 (98%) of the 541 Group A isolates contained exoS but not exoU, and 176 (95%) of 186 Group B isolates contained exoU but not exoS (Figure 5A, Supplemental Table 5). Performing in silico PCR using primer sequences against the middle portion of the exoU gene (bases 1098 – 1531) yielded identical findings as those shown for the full exoU gene in Supplemental Table 5. These results indicate exoS and exoU discriminate Group A and Group B isolates with a high degree of accuracy and suggests the genes could provide a fitness advantage in the respective ecological niches they inhabit.

We next examined the genetic context in which exoU and exoS occurred. As the exoU gene is present in the genomic island PAPI-2 (He, et al. 2004; Morales-Espinosa, et al. 2012), we examined the distribution of other portions of PAPI-2 in the isolates. Of the other two portions of PAPI-2 evaluated with primer sets, one (RS07-RS08) showed a statistically significant overabundance in Group B (86.0%) compared to Group A (46.6%) but this was not to the same degree as the exoU gene (95.2% vs. 1.8%) (Supplemental Table 4). The other portion of PAPI-2 screened (xerC) was equally distributed between isolates in the two groups. Thus, both Group A and Group B isolates contained portions of PAPI-2, but the *exoU* gene itself was largely restricted to Group B isolates. Of the 10 exoS+ Group A isolates that also contained exoU (Supplemental Table 1), 9 had exoU and its chaperone gene spcU located immediately upstream (2,064 and 414 bp, respectively) of conserved core gene PA0988, the same location in which they are found in the Group B strain PA14. In the 10th isolate (ATCC 25324), the exoU and spcU genes could not be definitively localized in the chromosome due to their presence on extremely short contigs in the assembly. We next examined the location of the exoS gene by performing in silico PCR using primers spanning the two genes immediately flanking the exoS gene (the exoS chaperone gene spcS and the hypothetical protein gene PA3840). In all Group A isolates and in the single Group B isolate that contained the exoS gene (AZPAE14404), it was found in this context. In all other Group B isolates, both flanking genes were present but the entire exoS gene was absent. The presence of the adjacent exoS chaperone gene in all P. aeruginosa strains of both groups

supports prior hypotheses that the *exoS* gene predated acquisition of *exoU* in *P. aeruginosa* and was lost due to a targeted deletion event (Kulasekara, et al. 2006).

Interestingly, several of the 10 *exoU+/exoS+* isolates in Group A were phylogenetically distinct from each other (Figure 5A). These findings are consistent with either the rare acquisition of *exoU* by a few Group A isolates or the general loss of *exoU* from nearly all Group A isolates. As mentioned above, a closely related set of four Group B isolates (AZPAE15041, AZPAE14888, AZPAE14878, and BL03) were admixed with approximately 40% of their sequences attributable to Group A. Interestingly, these four isolates lacked both the *exoS* and *exoU* genes (Figure 5A). These were also the only four isolates in the population that had O13 / O14-type O-antigen biosynthesis loci (Figure 5A). These isolates may represent a lineage evolving from an ancestor that either lost or failed to acquire the *exoU* gene, perhaps altering their niche specificity and again providing opportunities for recombination with *exoS+* isolates.

Intergroup nucleotide identity varies more than intragroup nucleotide identity

The preceding results suggest that Group A and Group B isolates represent two lineages but it is unclear how distinct these lineages are (Wiley and Wiley 1981). Although the criteria for defining bacterial species are evolving (Doolittle and Papke 2006; Krause and Whitaker 2015), one proposed metric is average nucleotide identity (ANI) of genome sequence pairs. A cutoff of 95 - 96% ANI was found to correspond to a 70% DNA-DNA hybridization threshold

traditionally used for species delineation (Goris, et al. 2007; Richter and Rossello-Mora 2009). To examine the nucleotide relatedness of Group A and Group B isolates, the ANI values of the 739 isolates were calculated for every combination of pairs of genome sequences and their reciprocals. This showed that the average ANI among all Group A and all Group B isolates was 99.3% and 99.2%, respectively, and that the ANI of isolates between Groups A and B was slightly lower at 98.76% (Table 3). Group C1 ANI values against Group A or Group B isolates were lower still at 98.2% and 98.0%, respectively. Group C2 isolates, representing the PA7-like outlier isolates, shared just 93.49% ANI with Group A isolates, 93.51% ANI with Group B isolates, and 93.38% ANI with Group C1 isolates. These results suggest that Groups A, B, and C1 would not be considered separate species by commonly-accepted ANI criteria, although the evolutionary species concept suggests they are independent lineages. The classification of PA7-like Group C2 isolates as belonging to the same species as the other groups in *P. aeruginosa* may warrant further discussion.

Group A and Group B isolates are associated with somewhat different demographic characteristics

As mentioned, the separation of most *P. aeruginosa* isolates into one of two large phylogenetic groups suggests the possibility that these two populations may inhabit two different niches (Cohan 2002b). To support this conjecture, we examined the sources of the isolates. Isolates did not group based on continental and hemispheric origin (Figure 5B, Supplemental Table 5). Although

isolates of clinical or environmental origin were found in both major branches of the tree, a significantly greater proportion of environmental isolates was observed in Group A than in Group B (p < 0.01; Figure 5C, Supplemental Table 5). Furthermore, differentiation of environmental isolates by specific source (e.g. equipment, vegetation, soil, water) showed no significant predominance of any sources in one group over the other (Figure 5C, Supplemental Table 5). For isolates identified as originating from clinical sources, we first separated isolates into cystic fibrosis ("CF") and other clinical sources ("non-CF"). We made this distinction because some reports have suggested that *P. aeruginosa* isolates from patients with CF are phenotypically and genotypically distinct from other P. aeruginosa isolates (Oliver, et al. 2000; Tummler, et al. 1997; van Mansfeld, et al. 2010). Although non-CF clinical isolates were found in both major branches of the phylogenetic tree, all but 3 of the 115 isolates cultured from CF patients were in Group A (Figure 5D, Supplemental Table 5). This statistically significant predominance (p < 1 x 10^{-10}) of CF isolates in Group A was maintained even when all 48 isolates belonging to the Liverpool Epidemic Strain (LES) clonal group, a CF epidemic strain (Scott and Pitt 2004), were removed (Supplemental Table 7). Among the non-CF clinical isolates, those cultured from eye, ear, or nose sources were predominantly Group B (Figure 5D, Supplemental Table 5). In this group of isolates, the majority (34 of 40) had been cultured from eye infections (Supplemental Table 1). Isolates from other clinical sources were more evenly distributed between Groups A and B. These findings suggest that CF patients may be more likely to acquire their P. aeruginosa isolates from

reservoirs of Group A isolates than Group B isolates. Alternatively, Group B isolates may be less fit to colonize and infect the airways of CF patients than Group A isolates. Eye infections represent an inverse situation in which isolates are more likely acquired from Group B reservoirs or in which Group B isolates are better able to cause these infections.

Discussion

We used the whole-genome sequences of 739 P. aeruginosa isolates to confirm previous reports that the population structure of P. aeruginosa consists of two large clades and one or more smaller clades (Freschi, et al. 2018; Freschi, et al. 2015; Freschi, et al. 2019; Hilker, et al. 2015; Marvig, et al. 2015; Stewart, et al. 2011; Williams, et al. 2015). Despite earlier observations of this population structure, the underlying reasons for this distinct segregation in P. aeruginosa have not previously been extensively explored. One explanation for the striking separation of the two large clades comprising Groups A and B is that the bacteria in these groups inhabit distinct ecological niches. Consistent with this notion is that several clusters of core genome SNPs are characteristic of Group A or Group B. Similar, although less marked, differences between the two major groups were also seen in the accessory genome. This analysis identified several genes that may be contributing to the ability of bacteria in each group to better persist in different ecological niches, the most noteworthy being exoS and exoU. As the two groups diverged through adaptation to different niches, barriers would have progressively limited inter-group but not intra-group genetic exchange.

Evidence of decreased intra-group recombination was indeed observed between Group A and Group B isolates indicating they are independent lineages that fit an evolutionary species concept. Although predominantly *exoS*+ Group A strains and predominantly *exoU*+ Group B strains are found to be phylogenetically divergent, the genetic differences between the two groups did not meet ANI criteria for distinct species. The same, however, cannot be said of the Group C2 clade; although ANI values are not sufficient on their own to delineate species, these isolates are quite distinct, and future studies should focus on whether they should remain within the *P. aeruginosa* species.

Genetic isolation is evidenced by relatively little gene flow between Group A and Group B in the core genome. We observed that just 14 – 19% of core genome recombination events could be attributed to sources outside of each major group (Figure 2). Previous studies have found that *P. aeruginosa* is characterized by a low overall recombination rate within the core genome--only one-fifth the rate of mutation (Dettman, et al. 2014)—but it has also been shown through the distribution of syntenic SNPs that free recombination occurs between the core genomes of major clones (Hilker, et al. 2015). Consistent with our findings, it has been reported that the characteristics of syntenic SNP haplotypes varied depending on whether interclonal or intraclonal isolate pairs were compared (Losada and Tummler 2016). Our results suggest that the groups have diverged to the extent that sequence differences hinder homologous recombination, that genetic barriers to recombination (such as restriction-

modification systems) exist between the two groups, or that distinct ecological niches provide a physical barrier to gene transfer.

Our finding that patterns of accessory genome content of isolates within groups are overall more similar than between groups is further evidence for differentiation between Groups A and B. A study of regions of genomic plasticity (RGPs) among 40 *P. aeruginosa* isolates also demonstrated distinct accessory genome compositions between the two major groups (Freschi, et al. 2018). Much of the accessory genome of *P. aeruginosa* is composed of horizontally transferred elements acquired from environmental reservoirs (Kung, et al. 2010), and differences in accessory genome content suggest exposure to distinct reservoirs. A second possible interpretation is that genetic barriers limit efficient horizontal transfer of specific accessory elements into one group but not the other or between groups.

Our analysis identified a number of core gene alleles and accessory genes that are discriminatory for Group A and B isolates. Since these genes and alleles are relatively exclusive to one group or the other, they are candidates for niche-adaptive genes, although McDonald-Kreitman testing did not show statistically significant evidence of positive selection. Arguably, the most interesting of the group discriminatory accessory genes are *exoS* and *exoU*. That these genes could be niche-adaptive has been suggested (Pirnay, et al. 2009; Wolfgang, et al. 2003). Previous studies have also suggested a phylogenetic separation between *P. aeruginosa* isolates containing these two different type III effector genes (Selezska, et al. 2012; Wiehlmann, et al. 2007), which is

confirmed by our study. Previous reports have shown that isolates with these type III effector genes are associated with infections of different character and severity (EI-Solh, et al. 2012; Finck-Barbançon, et al. 1997; Hauser, et al. 2002; Hauser, et al. 1998; Pena, et al. 2015; Schulert, et al. 2003; Shaver and Hauser 2004). The strong association of these genes with separate phylogenetic groups combined with our findings that very few other accessory genes are similarly group-exclusive raises suspicion that these genes may play an important role in niche adaptation and/or establishing a genetic barrier between the groups.

The genetic mechanisms that account for the separation of the exoS and exoU genes into Groups A and B are unknown. The exoU gene is thought to have been acquired by horizontal gene transfer into Group B isolates, as it is located within a highly variable genomic island inserted into a chromosomal tRNA^{Lys} gene (Kulasekara, et al. 2006). The provenance of exoS is less clear. This gene may have been present in an early ancestor of all P. aeruginosa strains and subsequently lost from Group B isolates, or Group A isolates may have acquired exoS by horizontal gene transfer early in this group's divergence from Group B. Some evidence supports the former hypothesis. The nucleotide sequence of exoS is 80.2% identical to the effector gene exoT, which is present in all Group A and Group B isolates, suggesting that exoS and exoT arose very early from a duplication event (Yahr, et al. 1996). The spcS chaperone gene, which is immediately adjacent to exoS in Group A isolates, is found in both Group A and Group B isolates, again consistent with deletion of exoS in Group B isolates. Likewise, sequencing studies suggested that exoS has been deleted

from Group C2 PA7-like strains (Huber, et al. 2016), so there is a precedent for loss of *exoS* from a group of isolates. Deletion of *exoS* is postulated to have occurred through a recombination event involving inverted repeats bordering the gene and that this targeted deletion was caused by an *exoU*-linked gene at the time of *exoU* acquisition (Kulasekara, et al. 2006).

In addition to exoS and exoU, several other genes were highly associated with Group A or Group B and are candidates for niche-adaptive genes. One prominent example is the genomic island RGP32 in Group B strains. The stress response genes in this island, including a flavodoxin gene with a demonstrated immunoprotective function (Moyano, et al. 2014), may contribute to survival of these strains in eukaryotic hosts. Other accessory genes that were highly associated with one group or the other tended to encode for hypothetical proteins or had undefined functions. Hence, it is not clear how they might contribute to niche adaptation. The prominence of fixed dimorphic variants within core genes with purported signal transduction mechanisms suggests they may play important roles in specialization to particular environments. Relative and absolute preponderances of certain O-antigen biosynthesis loci among isolates of one or the other groups suggest that these loci became fixed after differentiation and/or that the O-antigen biosynthesis locus may contribute to niche specialization. An important consequence of these findings is that phenotypic differences between isolates in Groups A and B that were previously attributed to a single gene (e.g. virulence caused by exoS or exoU) may have in fact been due to the cumulative effects of multiple group-discriminatory genes and core genome alleles (Pena, et

al. 2015; Schulert, et al. 2003). Additional studies may uncover interesting roles in pathogenesis for these group-discriminatory genes and alleles.

The observation that *P. aeruginosa* has a population structure consisting of distinct groups led us to ask whether these groups had diverged to the extent that they may represent distinct species. Although criteria for species designation are controversial, a number of groups have suggested that ANI is useful in this regard. Consistent with previous analyses of intraspecies sequence diversity in P. aeruginosa (Hilker, et al. 2015), we found that Group A, B, and C1 P. aeruginosa isolates had intergroup ANI values of >98%, which supports inclusion within a single species. The fact that these three lineages appear to be evolutionarily independent with low intergroup recombination suggests that current species definitions based on ANI may indeed be broader than those based on evolutionary species concepts (Wiley 1978). In contrast, Group C2 isolates had intergroup ANI values <94%, which falls outside the traditional species threshold by ANI. Whereas most Group A and Group C1 isolates contain exoS and most Group B isolates contain exoU, the Group C2 isolates, such as PA7, have neither gene. Furthermore, they lack the genes encoding the type III secretion apparatus (Roy, et al. 2010) and instead have acquired a type-V-secreted toxin, exolysin (Elsen, et al. 2014). Together, these results suggest that if the cause of genetic isolation in *P. aeruginosa* is ecological, isolate groups could potentially inhabit distinct ecological niches. Based on these findings, further studies should be considered to characterize the taxonomic classification PA7-like Group C2 bacteria.

Our findings suggest that Group A and Group B isolates may be associated with distinct ecological niches, so we sought to determine what these niches might be. We found that isolates in each major clade were distributed globally across both the Eastern and Western hemispheres as well as among continents, so geographic separation did not account for segregation into these groups. As was also noted by Wiehlmann and colleagues (Wiehlmann, et al. 2015), we found that major groups of *P. aeruginosa* were cultured from both environmental and clinical sources. However, relatively fewer Group B isolates were from the natural environment, suggesting that these isolates may be more adapted to healthcare settings, human hosts, or non-natural settings. This was particularly apparent in isolates from eyes, ears, and noses of patients and agrees with prior reports of exoU+ isolates being common in infections of these sites (Lomholt, et al. 2001; Rutherford, et al. 2018; Stewart, et al. 2011). Isolates from individuals with CF were an exception and were rarely members of Group B. The previously reported predominance of exoS+ isolates among P. aeruginosa-infected CF patients is consistent with this finding (Feltman, et al. 2001), although it is unlikely that the CF lung environment itself is driving adaptation of Group A isolates. With the exception of specific epidemic strains (e.g. LES), it is currently believed that most CF isolates are not transmitted back to the environment or to another individual with CF (Parkins, et al. 2018). One explanation for these findings is that *P. aeruginosa* inhabits geographically overlapping but distinct micro-environments, and that patients with different types of infections acquire their *P. aeruginosa* isolates from different environmental

reservoirs. In one scenario, the group discriminatory genes could provide defense against different predators found in the distinct environmental niches. Indeed, the *exoS* and *exoU* genes allow *P. aeruginosa* to kill amoebae (Abd, et al. 2008; Matz, et al. 2008). Likewise, in other bacterial species, amoebae recognize O-antigen types with differing efficiencies, which may drive selection of different O-antigen types in specific environments (Atzinger, et al. 2016; Wildschutte, et al. 2004). Thus, the *exoS/exoU* genotypes and O-antigen serotypes of Group A and B isolates may vary because these isolates inhabit different ecological niches, each with its own distinct set of amoebae or other predators. Another possibility is that most patients are exposed to both Group A and Group B *P. aeruginosa* isolates but that the genes specific to each group favor the establishments of different types of infections. These hypotheses need to be further explored with a larger number of isolates from diverse sources.

Our study has some important limitations. First, this study cannot definitively determine whether the genetic isolation between Group A and Group B resulted from ecological or biological factors. Further studies, perhaps with more detailed geographic and environmental metadata for isolates, will be required to address this question. Second, the *P. aeruginosa* genomes in NCBI are not a random collection, and some sets of isolates are over-represented as the result of sequencing of multiple very similar isolates, while isolates from other sources are underrepresented or absent. For example, relatively few isolates from non-clinical sources were available in the NCBI database when this study began. We were able to supplement these numbers somewhat by sequencing

nine more environmental isolates, but substantially more environmental isolates should be included in future studies. Another potential limitation is that the genomes in the database were provided by multiple contributors to a public database and varied in quality of both sequencing and assembly. Hence some genes and/or genomic regions may have been omitted from lower quality assemblies. Nevertheless, in only 11 of the 739 genome sequences (1.5%) could neither the exoU nor the exoS gene be identified, which is consistent with the prevalence of exoS- / exoU- isolates in other reports (Berthelot, et al. 2003; Pirnay, et al. 2009). Finally, we found few Group C1 and C2 isolates, which precluded a more thorough analysis of these groups. It is unclear whether isolates in these groups are truly rare relative to Group A and Group B isolates, or whether they were underrepresented due to sampling bias. As the number of P. aeruginosa isolates sequenced and deposited in public databases continues to grow, future studies may more fully define characteristics of isolates within these groups, their relationships to the species population structure, and the drivers of genetic isolation in *P. aeruginosa*.

Conclusions

We used a large collection of *P. aeruginosa* whole-genome sequences to confirm that the majority of isolates segregated into two distinct groups. In addition to the phylogenetic distance between the groups, infrequent intergroup recombination relative to intragroup recombination and greater intragroup accessory genome similarity suggests that they are genetically isolated. A small set of core genome

alleles and accessory genes discriminated between these two groups. This set included *exoS* and *exoU* (type III secretion effector genes) and RGP32, which encodes a flavodoxin gene implicated in virulence, among others. These genes and alleles are candidates for niche-adaptive factors. Although genetic differences between Groups A, B, and C1 did not meet standard ANI criteria for categorization as separate species, Group C2 isolates warrant further consideration for reclassification. Further studies are necessary to determine whether ecological and biological barriers separate these three groups, the specific ecological niches occupied by different *P. aeruginosa* groups, and how genetic differences contribute to the adaptation of each group.

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References

- Abd H, et al. 2008. *Pseudomonas aeruginosa* utilises its type III secretion system to kill the free-living amoeba *Acanthamoeba castellanii*. Journal of Eukaryotic Microbiology 55: 235-243.
- Altschul SF, Gish W, Miller W, Myers EW, Lipman DJ 1990. Basic local alignment search tool. Journal of Molecular Biology 215: 403-410.
- Ansari MA, Didelot X 2014. Inference of the properties of the recombination process from whole bacterial genomes. Genetics 196: 253-265. doi: 10.1534/genetics.113.157172
- Atzinger A, Butela K, Lawrence JG 2016. The O-antigen Mediates Differential Survival of *Salmonella* Against Communities of Natural Predators.

 Microbiology. doi: 10.1099/mic.0.000259
- Barbieri AM, Sha Q, Bette-Bobillo P, Stahl PD, Vidal M 2001. ADP-ribosylation of Rab5 by ExoS of *Pseudomonas aeruginosa* affects endocytosis. Infection and Immunity 69: 5329-5334.
- Barbieri JT, Sun J 2004. *Pseudomonas aeruginosa* ExoS and ExoT. Reviews of Physiology Biochemistry and Pharmacology 152: 79-92.
- Berthelot P, et al. 2003. Genotypic and Phenotypic Analysis of Type III Secretion

 System in a Cohort of *Pseudomonas aeruginosa* Bacteremia Isolates:

 Evidence for a Possible Association between O Serotypes and exo

 Genes. Journal of Infectious Diseases 188: 7p.

- Boisvert S, Laviolette F, Corbeil J 2010. Ray: simultaneous assembly of reads from a mix of high-throughput sequencing technologies. Journal of Computational Biology 17: 1519-1533. doi: 10.1089/cmb.2009.0238
- Bradbury RS, Roddam LF, Merritt A, Reid DW, Champion AC 2010. Virulence gene distribution in clinical, nosocomial and environmental isolates of *Pseudomonas aeruginosa*. Journal of Medical Microbiology 59: 881-890. doi: 10.1099/jmm.0.018283-0
- Cadillo-Quiroz H, et al. 2012. Patterns of gene flow define species of thermophilic Archaea. PLoS Biology 10: e1001265. doi: 10.1371/journal.pbio.1001265
- Cao Q, et al. 2015. Progressive genomic convergence of two *Helicobacter pylori* strains during mixed infection of a patient with chronic gastritis. Gut 64: 554-561. doi: 10.1136/gutjnl-2014-307345
- Cheng L, Connor TR, Siren J, Aanensen DM, Corander J 2013. Hierarchical and spatially explicit clustering of DNA sequences with BAPS software.

 Molecular Biology and Evolution 30: 1224-1228. doi:

 10.1093/molbev/mst028
- Cohan FM 1994. Genetic exchange and evolutionary divergence in prokaryotes.

 Trends Ecol Evol 9: 175-180. doi: 10.1016/0169-5347(94)90081-7
- Cohan FM 2002a. Sexual isolation and speciation in bacteria. Genetica 116: 359-370.
- Cohan FM 2002b. What are bacterial species? Annual Review of Microbiology 56: 457-487.

- Cohan FM, Koeppel AF 2008. The origins of ecological diversity in prokaryotes.

 Current Biology 18: R1024-1034. doi: 10.1016/j.cub.2008.09.014
- Corander J, Marttinen P 2006. Bayesian identification of admixture events using multilocus molecular markers. Molecular Ecology 15: 2833-2843. doi: 10.1111/j.1365-294X.2006.02994.x
- Corander J, Marttinen P, Siren J, Tang J 2008. Enhanced Bayesian modelling in BAPS software for learning genetic structures of populations. BMC Bioinformatics 9: 539. doi: 10.1186/1471-2105-9-539
- Dettman JR, Rodrigue N, Kassen R 2014. Genome-wide patterns of recombination in the opportunistic human pathogen *Pseudomonas aeruginosa*. Genome Biology and Evolution 7: 18-34. doi: 10.1093/gbe/evu260
- Didelot X, Barker M, Falush D, Priest FG 2009. Evolution of pathogenicity in the *Bacillus cereus* group. Systematic and Applied Microbiology 32: 81-90. doi: 10.1016/j.syapm.2009.01.001
- Didelot X, et al. 2011. Recombination and population structure in *Salmonella*enterica. PLoS Genet 7: e1002191. doi: 10.1371/journal.pgen.1002191
- Didelot X, Lawson D, Darling A, Falush D 2010. Inference of homologous recombination in bacteria using whole-genome sequences. Genetics 186: 1435-1449. doi: 10.1534/genetics.110.120121
- Didelot X, Wilson DJ 2015. ClonalFrameML: efficient inference of recombination in whole bacterial genomes. PLoS Computational Biology 11: e1004041. doi: 10.1371/journal.pcbi.1004041

- Doolittle WF, Papke RT 2006. Genomics and the bacterial species problem.

 Genome Biology 7: 116. doi: 10.1186/gb-2006-7-9-116
- El-Solh AA, Hattemer A, Hauser AR, Alhajhusain A, Vora H 2012. Clinical outcomes of type III *Pseudomonas aeruginosa* bacteremia. Critical Care Medicine 40: 1157-1163. doi: 10.1097/CCM.0b013e3182377906
- Elsen S, et al. 2014. A type III secretion negative clinical strain of *Pseudomonas* aeruginosa employs a two-partner secreted exolysin to induce hemorrhagic pneumonia. Cell Host Microbe 15: 164-176. doi: 10.1016/j.chom.2014.01.003
- England WE, Kim T, Whitaker RJ 2018. Metapopulation Structure of CRISPR-Cas Immunity in Pseudomonas aeruginosa and Its Viruses. mSystems 3. doi: 10.1128/mSystems.00075-18
- Feltman H, et al. 2001. Prevalence of type III secretion genes in clinical and environmental isolates of *Pseudomonas aeruginosa*. Microbiology 147: 2659-2669.
- Finck-Barbançon V, et al. 1997. ExoU expression by *Pseudomonas aeruginosa* correlates with acute cytotoxicity and epithelial injury. Molecular Microbiology 25: 547-557.
- Fleiszig SMJ, et al. 1996. Relationship between cytotoxicity and corneal epithelial cell invasion by clinical isolates of *Pseudomonas aeruginosa*. Infection and Immunity 64: 2288-2294.
- Freschi L, et al. 2018. Genomic characterisation of an international

 Pseudomonas aeruginosa reference panel indicates that the two major

- groups draw upon distinct mobile gene pools. FEMS Microbiology Letters 365. doi: 10.1093/femsle/fny120
- Freschi L, et al. 2015. Clinical utilization of genomics data produced by the international *Pseudomonas aeruginosa* consortium. Front Microbiol 6: 1036. doi: 10.3389/fmicb.2015.01036
- Freschi L, et al. 2019. The Pseudomonas aeruginosa Pan-Genome Provides

 New Insights on Its Population Structure, Horizontal Gene Transfer, and

 Pathogenicity. Genome Biology and Evolution 11: 109-120. doi:

 10.1093/gbe/evy259
- Gardner SN, Hall BG 2013. When whole-genome alignments just won't work:

 kSNP v2 software for alignment-free SNP discovery and phylogenetics of hundreds of microbial genomes. PLoS One 8: e81760. doi:

 10.1371/journal.pone.0081760
- Garey KW, Vo QP, Larocco MT, Gentry LO, Tam VH 2008. Prevalence of type III secretion protein exoenzymes and antimicrobial susceptibility patterns from bloodstream isolates of patients with *Pseudomonas aeruginosa* bacteremia. Journal of Chemotherapy 20: 714-720. doi: 10.1179/joc.2008.20.6.714
- Goris J, et al. 2007. DNA-DNA hybridization values and their relationship to whole-genome sequence similarities. Int J Syst Evol Microbiol 57: 81-91. doi: 10.1099/ijs.0.64483-0

- Gu Z, Eils R, Schlesner M 2016. Complex heatmaps reveal patterns and correlations in multidimensional genomic data. Bioinformatics 32: 2847-2849. doi: 10.1093/bioinformatics/btw313
- Hauser AR, Kang PJ, Engel J 1998. PepA, a novel secreted protein of *Pseudomonas aeruginosa*, is necessary for cytotoxicity and virulence. Molecular Microbiology 27: 807-818.
- He J, et al. 2004. The broad host range pathogen *Pseudomonas aeruginosa* strain PA14 carries two pathogenicity islands harboring plant and animal virulence genes. Proc Natl Acad Sci U S A 101: 2530-2535.
- He Z, et al. 2016. Evolview v2: an online visualization and management tool for customized and annotated phylogenetic trees. Nucleic Acids Res 44: W236-241. doi: 10.1093/nar/gkw370
- Hilker R, et al. 2015. Interclonal gradient of virulence in the *Pseudomonas*aeruginosa pangenome from disease and environment. Environ Microbiol

 17: 29-46. doi: 10.1111/1462-2920.12606
- Huber P, Basso P, Reboud E, Attree I 2016. Pseudomonas aeruginosa renews its virulence factors. Environ Microbiol Rep. doi: 10.1111/1758-2229.12443
- Kaufman MR, et al. 2000. *Pseudomonas aeruginosa* mediated apoptosis requires the ADP-ribosylating activity of ExoS. Microbiology 146: 2531-2541.

- Kiewitz C, Tummler B 2000. Sequence diversity of *Pseudomonas aeruginosa*: impact on population structure and genome evolution. Journal of Bacteriology 182: 3125-3135.
- Kos VN, et al. 2015. The resistome of *Pseudomonas aeruginosa* in relationship to phenotypic susceptibility. Antimicrobial Agents and Chemotherapy 59: 427-436. doi: 10.1128/AAC.03954-14
- Krause DJ, Whitaker RJ 2015. Inferring Speciation Processes from Patterns of Natural Variation in Microbial Genomes. Systematic Biology 64: 926-935. doi: 10.1093/sysbio/syv050
- Kulasekara BR, et al. 2006. Acquisition and evolution of the exoU locus in Pseudomonas aeruginosa. Journal of Bacteriology 188: 4037-4050.
- Kung VL, Ozer EA, Hauser AR 2010. The accessory genome of *Pseudomonas aeruginosa*. Microbiology and Molecular Biology Reviews 74: 621-641.
 doi: 74/4/621 [pii]
- 10.1128/MMBR.00027-10
- Kurtz S, et al. 2004. Versatile and open software for comparing large genomes.

 Genome Biology 5: R12. doi: 10.1186/gb-2004-5-2-r12
 gb-2004-5-2-r12 [pii]
- Lê S, Josse J, Husson F 2008. FactoMineR: An R Package for Multivariate

 Analysis. 2008 %9 %! FactoMineR: An R Package for Multivariate

 Analysis 25: 18. doi: 10.18637/jss.v025.i01 %& 1
- Lomholt JA, Poulsen K, Kilian M 2001. Epidemic population structure of Pseudomonas aeruginosa: evidence for a clone that is pathogenic to the

- eye and that has a distinct combination of virulence factors. Infection and Immunity 69: 6284-6295.
- Losada PM, Tummler B 2016. SNP synteny analysis of *Staphylococcus aureus* and *Pseudomonas aeruginosa* population genomics. FEMS Microbiology Letters. doi: 10.1093/femsle/fnw229
- Marvig RL, Sommer LM, Molin S, Johansen HK 2015. Convergent evolution and adaptation of *Pseudomonas aeruginosa* within patients with cystic fibrosis.

 Nature Genetics 47: 57-64. doi: 10.1038/ng.3148
- Matz C, et al. 2008. *Pseudomonas aeruginosa* uses type III secretion system to kill biofilm-associated amoebae. ISME J. 2: 843-852.
- McDonald JH, Kreitman M 1991. Adaptive protein evolution at the Adh locus in Drosophila. Nature 351: 652-654. doi: 10.1038/351652a0
- Morales-Espinosa R, et al. 2012. Genetic and phenotypic characterization of a Pseudomonas aeruginosa population with high frequency of genomic islands. PLoS One 7: e37459. doi: 10.1371/journal.pone.0037459
- Moyano AJ, et al. 2014. A long-chain flavodoxin protects Pseudomonas aeruginosa from oxidative stress and host bacterial clearance. PLoS Genet 10: e1004163. doi: 10.1371/journal.pgen.1004163

PONE-D-11-23791 [pii]

Oliver A, Canton R, Campo P, Baquero F, Blazquez J 2000. High frequency of hypermutable *Pseudomonas aeruginosa* in cystic fibrosis lung infection. Science 288: 1251-1254.

- Ozer EA 2018. ClustAGE: a tool for clustering and distribution analysis of bacterial accessory genomic elements. BMC Bioinformatics 19: 150. doi: 10.1186/s12859-018-2154-x
- Ozer EA, Allen JP, Hauser AR 2014. Characterization of the core and accessory genomes of *Pseudomonas aeruginosa* using bioinformatic tools Spine and AGEnt. BMC Genomics 15: 737. doi: 10.1186/1471-2164-15-737
- Parkins MD, Somayaji R, Waters VJ 2018. Epidemiology, Biology, and Impact of Clonal Pseudomonas aeruginosa Infections in Cystic Fibrosis. Clinical Microbiology Reviews 31. doi: 10.1128/CMR.00019-18
- Pena C, et al. 2015. Influence of virulence genotype and resistance profile in the mortality of *Pseudomonas aeruginosa* bloodstream infections. Clinical Infectious Diseases 60: 539-548. doi: 10.1093/cid/ciu866
- Phillips RM, Six DA, Dennis EA, Ghosh P 2003. In vivo phospholipase activity of the *Pseudomonas aeruginosa* cytotoxin ExoU and protection of mammalian cells with phospholipase A2 inhibitors. Journal of Biological Chemistry 278: 41326-41332.
- Pirnay JP, et al. 2009. *Pseudomonas aeruginosa* population structure revisited. PLoS One 4: e7740.
- Price MN, Dehal PS, Arkin AP 2010. FastTree 2--approximately maximum-likelihood trees for large alignments. PLoS One 5: e9490. doi: 10.1371/journal.pone.0009490
- R Core Team. 2016. R: A Language and Environment for Statistical Computing.

 In. Vienna, Austria: R Foundation for Statistical Computing.

- Rambaut A. FigTree. Version 1.4.3.
- Rand DM, Kann LM 1996. Excess amino acid polymorphism in mitochondrial DNA: contrasts among genes from Drosophila, mice, and humans.

 Molecular Biology and Evolution 13: 735-748. doi:

 10.1093/oxfordjournals.molbev.a025634
- Raymond CK, et al. 2002. Genetic variation at the O-antigen biosynthetic locus in Pseudomonas aeruginosa. Journal of Bacteriology 184: 3614-3622.
- Richter M, Rossello-Mora R 2009. Shifting the genomic gold standard for the prokaryotic species definition. Proc Natl Acad Sci U S A 106: 19126-19131. doi: 10.1073/pnas.0906412106
- Rocchetta HL, Burrows LL, Lam JS 1999. Genetics of O-antigen biosynthesis in Pseudomonas aeruginosa. Microbiology and Molecular Biology Reviews 63: 523-553.
- Roy PH, et al. 2010. Complete genome sequence of the multiresistant taxonomic outlier *Pseudomonas aeruginosa* PA7. PLoS One 5: e8842.
- Rutherford V, et al. 2018. Environmental reservoirs for exoS+ and exoU+ strains of Pseudomonas aeruginosa. Environ Microbiol Rep 10: 485-492. doi: 10.1111/1758-2229.12653
- Sato H, Frank DW 2004. ExoU is a potent intracellular phospholipase. Molecular Microbiology 53: 1279-1290.
- Schulert GS, et al. 2003. Secretion of the Toxin ExoU Is a Marker for Highly

 Virulent *Pseudomonas aeruginosa* Isolates Obtained from Patients with

 Hospital-Acquired Pneumonia. Journal of Infectious Diseases 188: 12p.

- Scott FW, Pitt TL 2004. Identification and characterization of transmissible

 *Pseudomonas aeruginosa strains in cystic fibrosis patients in England and Wales. Journal of Medical Microbiology 53: 609-615.
- Selezska K, et al. 2012. Pseudomonas aeruginosa population structure revisited under environmental focus: impact of water quality and phage pressure.

 Environ Microbiol 14: 1952-1967. doi: 10.1111/j.1462-2920.2012.02719.x
- Shapiro BJ, et al. 2012. Population genomics of early events in the ecological differentiation of bacteria. Science 336: 48-51. doi: 10.1126/science.1218198
- Shaver CM, Hauser AR 2004. Relative contributions of *Pseudomonas*aeruginosa ExoU, ExoS, and ExoT to virulence in the lung. Infection and Immunity 72: 6969-6977.
- Sheppard SK, et al. 2013. Progressive genome-wide introgression in agricultural Campylobacter coli. Molecular Ecology 22: 1051-1064. doi: 10.1111/mec.12162
- Stewart RM, et al. 2011. Genetic characterization indicates that a specific subpopulation of *Pseudomonas aeruginosa* is associated with keratitis infections. Journal of Clinical Microbiology 49: 993-1003. doi: 10.1128/JCM.02036-10
- Tatusov RL, Koonin EV, Lipman DJ 1997. A genomic perspective on protein families. Science 278: 631-637.

- Tatusov RL, et al. 2001. The COG database: new developments in phylogenetic classification of proteins from complete genomes. Nucleic Acids Res 29: 22-28.
- Temple GS, Ayling PD, Wilkinson SG 1986. The role of lipopolysaccharide as a receptor for some bacteriophages of Pseudomonas aeruginosa. Microbios 45: 93-104.
- Tettelin H, Riley D, Cattuto C, Medini D 2008. Comparative genomics: the bacterial pan-genome. Current Opinion in Microbiology 11: 472-477.
- Tummler B, et al. 1997. Infections with Pseudomonas aeruginosa in patients with cystic fibrosis. Behring Institute Mitteilungen: 249-255.
- van Mansfeld R, et al. 2010. The population genetics of Pseudomonas aeruginosa isolates from different patient populations exhibits high-level host specificity. PLoS One 5: e13482. doi: 10.1371/journal.pone.0013482
- Wall JD, et al. 2014. Estimating genotype error rates from high-coverage next-generation sequence data. Genome Research 24: 1734-1739. doi: 10.1101/gr.168393.113
- Wiehlmann L, Cramer N, Tummler B 2015. Habitat-associated skew of clone abundance in the *Pseudomonas aeruginosa* population. Environ Microbiol Rep 7: 955-960. doi: 10.1111/1758-2229.12340
- Wiehlmann L, et al. 2007. Population structure of *Pseudomonas aeruginosa*.

 Proc Natl Acad Sci U S A 104: 8101-8106. doi: 10.1073/pnas.0609213104
- Wildschutte H, Wolfe DM, Tamewitz A, Lawrence JG 2004. Protozoan predation, diversifying selection, and the evolution of antigenic diversity in

- Salmonella. Proc Natl Acad Sci U S A 101: 10644-10649. doi: 10.1073/pnas.0404028101
- Wiley EO 1978. The Evolutionary Species Concept Reconsidered. Systematic Biology 27: 17-26. doi: 10.2307/2412809
- Wiley EO, Wiley RE. 1981. Phylogenetics: The Theory and Practice of Phylogenetic Systematics: Wiley.
- Williams D, et al. 2015. Divergent, coexisting *Pseudomonas aeruginosa* lineages in chronic cystic fibrosis lung infections. American Journal of Respiratory and Critical Care Medicine 191: 775-785. doi: 10.1164/rccm.201409-1646OC
- Winsor GL, et al. 2011. *Pseudomonas* Genome Database: improved comparative analysis and population genomics capability for *Pseudomonas* genomes.

 Nucleic Acids Res 39: D596-600. doi: gkq869 [pii]
- 10.1093/nar/gkq869
- Wolfgang MC, et al. 2003. Conservation of genome content and virulence determinants among clinical and environmental isolates of *Pseudomonas aeruginosa*. Proc. Natl. Acad. Sci. U S A 100: 8484-8489.
- Yahr TL, Barbieri JT, Frank DW 1996. Genetic relationship between the 53- and 49-kilodalton forms of exoenzyme S from *Pseudomonas aeruginosa*.

 Journal of Bacteriology 178: 1412-1419.
- Zhang H, Gao S, Lercher MJ, Hu S, Chen WH 2012. EvolView, an online tool for visualizing, annotating and managing phylogenetic trees. Nucleic Acids Res 40: W569-572. doi: 10.1093/nar/gks576

Figure Legends:

Figure 1. Population structure of *P. aeruginosa* isolates. The upper panel shows a maximum likelihood phylogenetic tree generated from core genome SNP loci in 739 *P. aeruginosa* isolates. The lower panel shows an expanded version of the same phylogenetic tree with a truncated outlier branch. Major branches are indicated by labels and highlighting: Group A (red), Group B (blue), and Group C (purple). Group C isolates are further subdivided into Group C1 (light purple) and Group C2 (dark purple). Several isolates mentioned in the text are indicated. The scale bars represent genetic distances.

Figure 2. Core genome recombination between the major groups of *P*.

aeruginosa. The inferred sources of recombinant regions identified within isolates in Group A (panel A) and Group B (panel B) are shown. The vectors indicate the direction of recombinant region flow. "Internal (ambiguous)" represents a source of recombinant sequence within Groups A, B, C1 or C2 but for which the source could not be attributed to any one of the groups. "External" represents a source of recombination from outside of Groups A, B, C1 or C2. Vectors are labeled with the number of recombination events originating from each source, and the numbers in parentheses are the percentages of the total recombination events in the destination group represented by each vector.

Figure 3. <u>Dimorphic SNV loci in *P. aeruginosa.*</u> Dimorphic SNV loci are defined as core genome positions with one variant in at least 98% of the Group A isolates

and a different variant present in at least 98% of the Group B isolates. Each bar represents the total number of dimorphic SNV loci within a 100 kb window relative to the PA14 genome. Numbers of SNVs within coding regions predicted to encode a different amino acid (non-synonymous mutations) are shown in red, whereas those SNVs not predicted to result in an amino acid change (synonymous mutations) are shown in blue. Numbers of SNVs found within intergenic regions are shown in green.

Figure 4. Accessory genome content of Group A and Group B isolates. (A) Multiple correspondence analysis of AGEs at least 100 bp in length. Orange = Group A, blue = Group B, pink = Group C1, purple = Group C2. (B) A neighborjoining tree was generated from the Bray-Curtis distances calculated from AGEs at least 100 bp in length and midpoint rooted. The major group memberships of isolates are indicated in the columns along the left and upper axes of the heatmap (red = Group A, blue = Group B, purple = Group C). The heatmap shows pairwise accessory genome content similarities based on inverse Bray-Curtis distances (1 - d) according to the scale bar.

Figure 5. <u>Isolate demographic and accessory genome characteristics.</u> Each panel shows 95% core genome maximum likelihood trees with isolate information highlighted. Trees are displayed as phylograms with branch lengths that do not correspond to genetic distances. Major clonal groups are highlighted in red (Group A), blue (Group B), and purple (Group C). (A) Accessory genome

characteristics. Inner ring: Presence of type III effector genes *exoS* and *exoU*.

Outer ring: O-antigen biosynthesis locus type. (B) Geographic source of isolates.

Inner ring: isolates sequenced as part of this study. Middle ring: Global hemisphere of isolation. Outer ring: Continent of isolation. (C) Source of environmental isolates. Inner ring: Environmental vs. clinical isolates. Outer ring: Specific sources of environmental isolates. (D) Source of clinical isolates. Inner ring: CF vs. non-CF clinical isolates. Outer ring: Body site of isolation for the non-CF isolates.

Figure 1

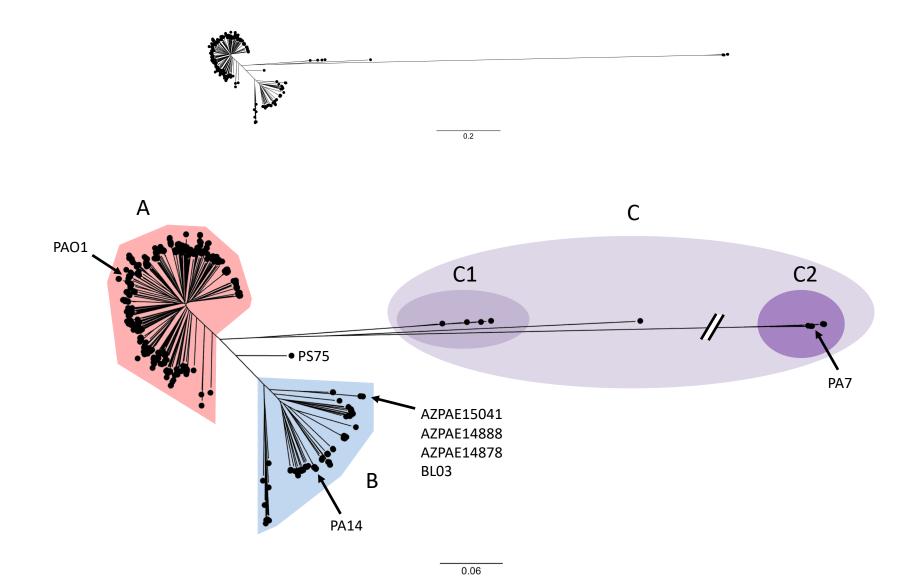
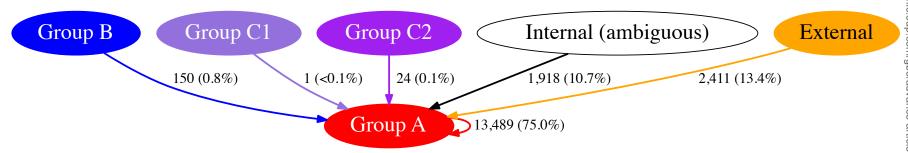


Figure 2







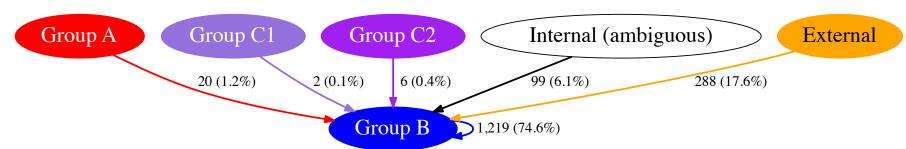


Figure 3

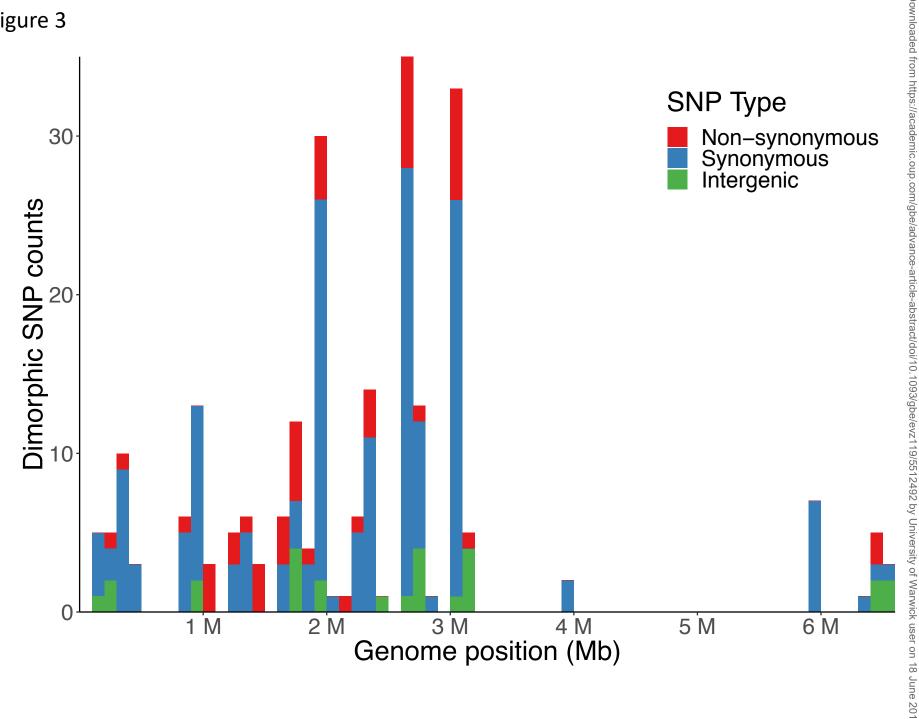
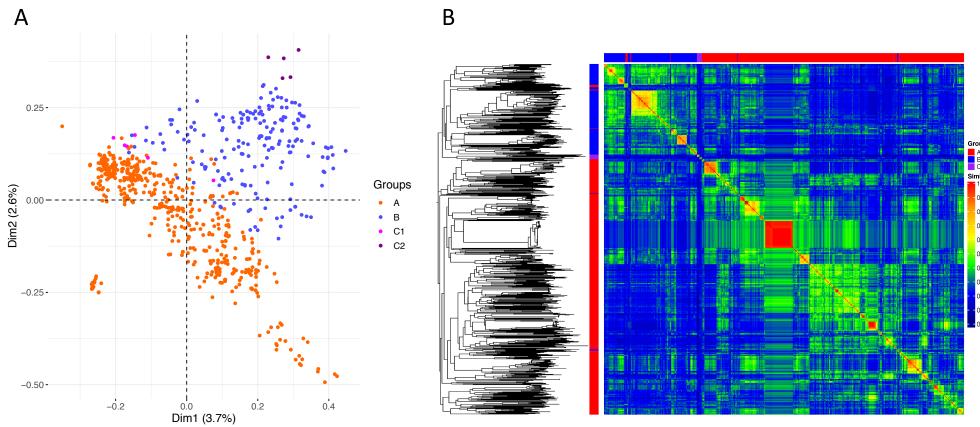


Figure 4



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Figure 5

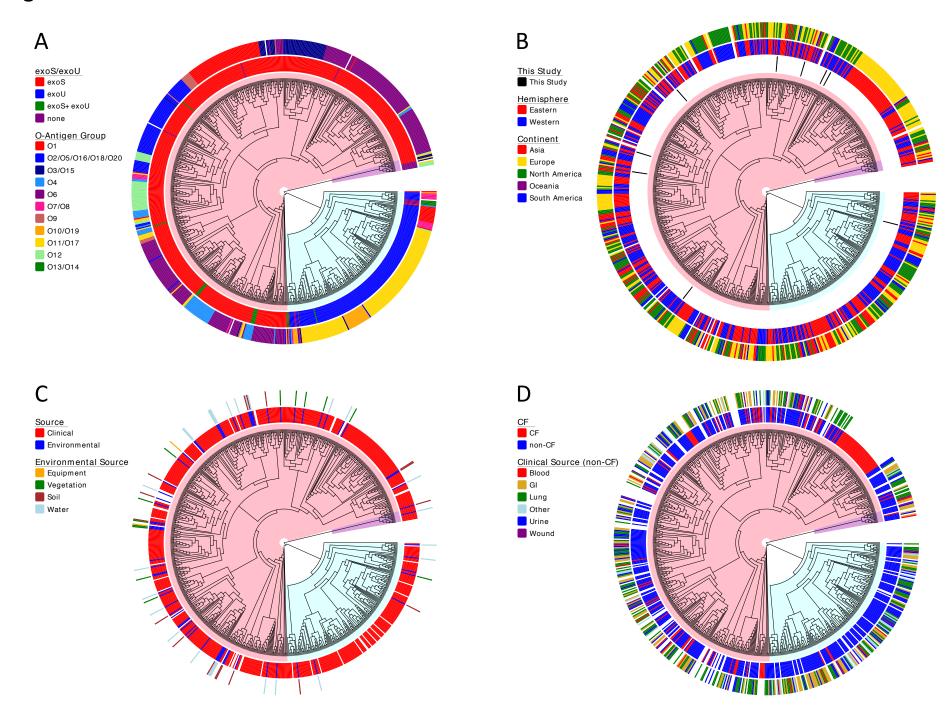


Table 1: Recombination parameters

Group	# Strains	# events	R/theta	delta	nu	r/m
All	739	19965	0.2720	4209.9	0.002206	2.5261
Group A	541	17993	0.5491	3193.8	0.002103	3.6885
Group B	186	1635	0.1686	31277.3	0.001598	8.4280
Group C1	5	124	0.1349	1738.3	0.004562	1.0694
Group C2	5	185	0.6390	1480.0	0.001988	1.8800

R/theta: relative rate of recombination to mutation

delta: mean DNA import length

nu: mean divergence of imported DNA

r/m: relative contribution of recombination vs. mutation to diversity

Table 2. Core, Accessory, and Pangenome Characteristics

	Size (bp)	% GC	
Core Genome ¹	5,784,306	66.94%	
Accessory Genome ²	911,794 (276,874 - 2,193,688)	61.58% (59.1% - 65.48%)	
Unique Accessory Genome	26,280,940	57.19%	
Pangenome	32,065,171	58.98%	

- 1. 95% core genome, i.e. sequence present in \geq 702 of 739 isolates
- 2. Values are medians. Values in parentheses are minimum and maximum values

Table 3: Average nucleotide identities (ANI)

Average (standard deviation)

	Group A	Group B	Group C1	Group C2	CF-PA39 JDVE	PS75 JIEP
Group A	99.31 (0.1484)					
Group B	98.76 (0.1206)	99.15 (0.2707)				
Gropu C1	98.20 (0.0648)	98.03 (0.0598)	99.42 (0.2248)			
Group C2	93.49 (0.1081)	93.51 (0.1009)	93.38 (0.1075)	99.03 (0.2409)		
CF-PA39 JDVE	97.54 (0.0480)	97.46 (0.0510)	97.18 (0.0318)	93.40 (0.0774)	NA (NA)	
PS75 JIEP	99.08 (0.0485)	99.03 (0.0620)	98.14 (0.0330)	93.49 (0.0849)	97.47 (0.0063)	NA (NA)