



# Proposal of a Taxonomic Nomenclature for the *Bacillus cereus* Group Which Reconciles Genomic Definitions of Bacterial Species with Clinical and Industrial Phenotypes

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ABSTRACT The Bacillus cereus group comprises numerous closely related species, including bioterrorism agent B. anthracis, foodborne pathogen B. cereus, and biopesticide B. thuringiensis. Differentiating organisms capable of causing illness or death from those used in industry is essential for risk assessment and outbreak preparedness. However, current species definitions facilitate species-phenotype incongruences, particularly when horizontally acquired genes are responsible for a phenotype. Using all publicly available *B. cereus* group genomes (n = 2,231), we show that current species definitions lead to overlapping genomospecies clusters, in which 66.2% of genomes belong to multiple genomospecies at a conventional 95 average nucleotide identity (ANI) genomospecies threshold. A genomospecies threshold of  $\approx$ 92.5 ANI is shown to reflect a natural gap in genome similarity for the B. cereus group, and medoid genomes identified at this threshold are shown to yield resolvable genomospecies clusters with minimal overlap (six of 2,231 genomes assigned to multiple genomospecies; 0.269%). We thus propose a nomenclatural framework for the B. cereus group which accounts for (i) genomospecies using resolvable genomospecies clusters obtained at  $\approx$ 92.5 ANI, (ii) established lineages of medical importance using a formal collection of subspecies names, and (iii) heterogeneity of clinically and industrially important phenotypes using a formalized and extended collection of biovar terms. We anticipate that the proposed nomenclature will remain interpretable to clinicians, without sacrificing genomic species definitions, which can in turn aid in pathogen surveillance; early detection of emerging, high-risk genotypes; and outbreak preparedness.

**IMPORTANCE** Historical species definitions for many prokaryotes, including pathogens, have relied on phenotypic characteristics that are inconsistent with genome evolution. This scenario forces microbiologists and clinicians to face a tradeoff between taxonomic rigor and clinical interpretability. Using the *Bacillus cereus* group as a model, a conceptual framework for the taxonomic delineation of prokaryotes which reconciles genomic definitions of species with clinically and industrially relevant phenotypes is presented. The nomenclatural framework outlined here serves as a model for genomics-based bacterial taxonomy that moves beyond arbitrarily set genomospecies thresholds while maintaining congruence with phenotypes and historically important species names.

**KEYWORDS** Bacillus anthracis, Bacillus cereus, Bacillus cereus group, Bacillus thuringiensis, bioterrorism, foodborne pathogens, phylogenetic analysis, taxonomy

istorically, prokaryotic species have been defined using various methods (e.g., phenotypic characterization, 16S rRNA gene sequencing, and DNA-DNA hybridization) (1–3). However, contemporary species delineation practices have migrated to high-throughput, *in silico* average nucleotide identity (ANI)-based methods (4), for

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Received 8 January 2020 Accepted 15 January 2020 Published 25 February 2020 which two genomes belong to the same genomospecies if they share an ANI value above a set threshold (usually 95 ANI) (5). Paradoxically, evolutionary insights provided by ANI-based species delineation can lead to greater taxonomic ambiguity, as species names deeply ingrained in medicine and industry may be inconsistent with genome evolution (6–8). In these cases, microbiologists face a tradeoff: revise the taxonomy to reflect genomic differences, potentially sacrificing clinical interpretability, or continue to use established species names and ignore underlying genomic diversity.

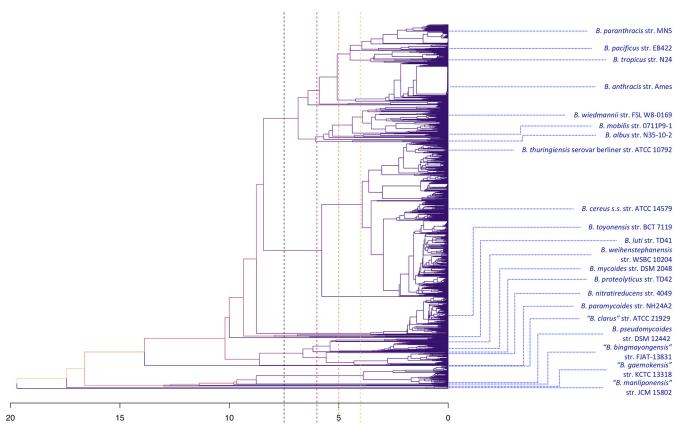
The *Bacillus cereus* group, also known as *B. cereus sensu lato*, is one such species complex plagued by taxonomic inconsistencies. Notable members include *B. anthracis*, the etiological agent of anthrax and renowned bioterrorism agent (9–12); *B. cereus sensu stricto*, which is commonly regarded as a foodborne pathogen but has been associated with anthrax-like symptoms and other severe infections (13, 14); and *B. thuringiensis*, a popular industrial biopesticide control agent (15, 16). Phenotypic characteristics used for taxonomic assignment of *B. cereus* group species (e.g., motility and hemolysis) vary within and among species (1, 2, 17, 18). Furthermore, genomic determinants responsible for some phenotypes are plasmid mediated, such as synthesis of anthrax toxin/capsular proteins (19–22), bioinsecticidal crystal proteins (23–25), and emetic toxin (cereulide) synthetase proteins (26, 27). These traits can be lost, gained, heterogeneous in their presence within a species, or present across multiple species (28–31).

ANI-based genomospecies assignment, however, has done little to alleviate taxonomic ambiguity. An influx of novel *B. cereus sensu lato* species (three published between 2013 and 2016 [32–34] and nine in 2017 [35]) has relied on variable genomospecies thresholds ranging from 92 to 96 ANI (33–35). This can lead to overlapping genomospecies clusters where some genomes may belong to more than one genomospecies, depending on the threshold used. Further confusion arises when "novel" species encompass established lineages within their genomospecies thresholds. For example, *B. paranthracis*, a species published in 2017 (35), encompasses the established foodborne pathogen known as emetic "*B. cereus*" (13, 36–38) within its genomospecies boundaries at a conventional 95 ANI threshold (39).

Current species definitions do not account for species-phenotype incongruences, which can potentially lead to high-consequence misclassifications of an isolate's virulence potential. For example, clinical diagnostics used to rule out the presence of *B. anthracis* (1, 2) may incorrectly exclude an anthrax-causing strain exhibiting phenotypic characteristics associated with "*B. cereus*" as the cause of illness (30, 40–42). Additionally, the ability to cause anthrax is attenuated in *B. anthracis* strains which lack genes required for anthrax toxin and capsule formation (43). The problem at hand requires the construction of an ontological framework which is accurate in terms of its adherence to widely accepted genomic and taxonomic definitions of bacterial genomospecies while still being informative, intuitive, and actionable to those in public health and industry. Here, we leverage all publicly available assembled *B. cereus* group genomes (n = 2,231) to construct a phylogenomically informed taxonomic framework with the flexibility to account for phenotypes of interest to those in public health and industry.

## RESULTS

Current species definitions cannot reliably differentiate *B. anthracis* from neighboring lineages. The practice of calculating ANI values between a genome of interest and the genomes of known *B. cereus* group species type strains (see Table S1 in the supplemental material) (33–35, 39) and using the widely accepted threshold of 95 ANI (5) as a hard genomospecies cutoff produced nonoverlapping genomospecies clusters for *Bacillus albus*, "*B. bingmayongensis*," *B. cytotoxicus*, "*B. gaemokensis*," *B. luti*, "*B. manliponensis*," *B. nitratireducens*, *B. paramycoides*, *B. proteolyticus*, *B. pseudomycoides*, and *B. toyonensis* (Table S2). No genomes assigned to these genomospecies shared  $\geq$ 95 ANI with any genomes assigned to a different genomospecies (Fig. 1 and 2A1). However, several type strain-centric genomospecies overlapped, including clusters formed by the type strains of (i) *B. cereus sensu stricto* and *B. thuringiensis* and (ii)



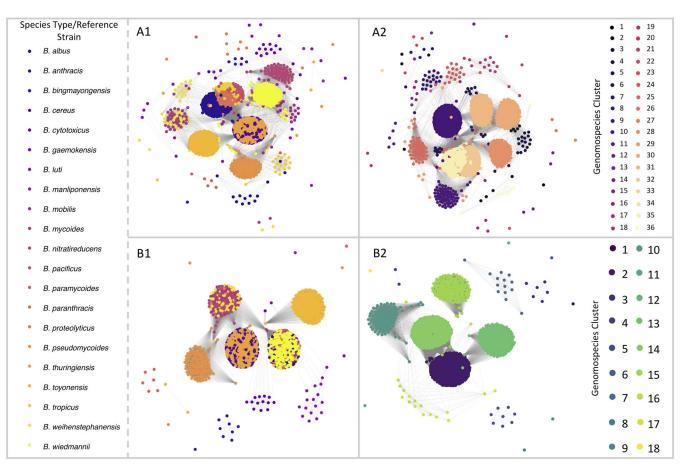
Dissimilarity (100 – ANI)

**FIG 1** Dendrogram constructed using symmetric pairwise average nucleotide identity (ANI) dissimilarities calculated between 2,218 *B. cereus* group genomes from NCBI's RefSeq database with  $N_{50}$  of >20 kbp (i.e.,  $D_{\Delta NI}^{sym}$  in Materials and Methods) and the average linkage hierarchical clustering method implemented in the hclust function in R. Blue tip labels denote the location of species type strain/reference genomes in the dendrogram, while tree height corresponds to ANI dissimilarity. Branch colors correspond to branch height within the tree. Dashed vertical lines appear at dissimilarities of 7.5, 6, 5, and 4, which correspond to ANI thresholds of 92.5, 94, 95, and 96, respectively (from left to right in order of appearance along the *x* axis).

*B. mycoides* and *B. weihenstephanensis*, as has been documented previously (Fig. 1 and 2A1; Table S2) (29, 34, 44). The type strains of *B. mobilis* and *B. wiedmannii* also produced overlapping genomospecies in which a genome could share  $\geq$ 95 ANI with both species type strains (Fig. 1 and 2A1; Table S2). The largest source of ambiguity, however, stemmed from *B. anthracis* and neighboring lineages, as the genomospecies cluster formed by the *B. anthracis* reference genome overlapped with those of *B. pacificus*, *B. paranthracis*, and *B. tropicus* (Fig. 1 and 2A1; Table S2).

The species overlap problem persisted at 95 ANI when medoid genomes were used to construct genomospecies clusters (Fig. 2A2; Table S3). All genomospecies which were nonoverlapping when type strains were used (e.g., *B. pseudomycoides* and *B. toyonensis*) remained nonoverlapping, except for *B. proteolyticus* (Fig. 2A2; Table S3). All overlapping genomospecies continued to produce multispecies classifications at 95 ANI, albeit at a lower rate than type strain-centric clusters: 405 (18.2%) and 1,478 (66.2%) genomes were assigned to 2 or more medoid- or type strain-centric genomospecies, respectively (Fig. 2A).

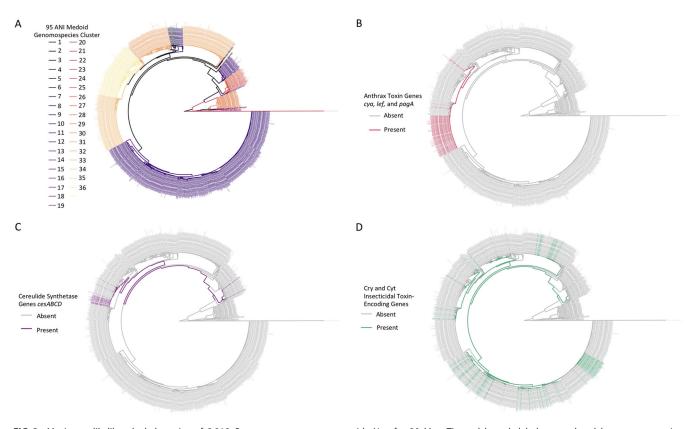
Genomic elements responsible for anthrax, emetic, and insecticidal toxin production exhibit heterogeneous presence in multiple species using current genomospecies definitions. Additional nomenclatural discrepancies arise when a trait of interest is plasmid encoded, such as anthrax toxin genes *cya* (edema factor encoding), *lef* (lethal factor encoding), and *pagA* (protective antigen encoding) (45): 93 of 241 (38.6%) genomes most closely resembling the *B. anthracis* reference genome at  $\geq$ 95 ANI did not possess anthrax toxin genes (Fig. 3A and B; Table S4). Notably, isolates



**FIG 2** Weighted undirected graphs constructed using symmetric pairwise average nucleotide identity (ANI) values calculated between 2,218 *B. cereus* group genomes from NCBI's RefSeq database with  $N_{50}$  of >20 kbp (i.e.,  $S_{ANI}^{sym}$  in Materials and Methods). Nodes represent individual genomes, while weighted edges connect each pair of genomes with a mean ANI value of  $\geq$ 95 (A) and  $\geq$ 92.5 (B), where edge weight corresponds to the mean ANI value of the pair. Nodes (i.e., genomes) are colored by (i) closest matching type strain genome or (ii) closest matching medoid genome of clusters formed at the respective ANI value. Graphs were constructed using the graphout layout algorithm implemented in R's igraph package, using 1 million iterations and a charge of 0.02.

which most closely resemble *B. anthracis* by current species definitions (i.e.,  $\geq$ 95 ANI), despite lacking anthrax toxin-encoding genes, do not appear to be uncommon. Such strains have been isolated from diverse environments (e.g., soil, animal feed, milk, spices, egg whites, and baby wipes) and from six continents, plus the International Space Station (Table S4). The classification of these isolates as *B. anthracis* could lead to incorrect assumptions of their anthrax-causing capabilities.

Importantly, isolates which display phenotypic characteristics associated with "B. cereus" (e.g., motility and gamma bacteriophage resistance) can cause anthrax (2, 30, 31, 40–42). Despite the assertion that it is a clonal species with low diversity (46–48), the B. anthracis genomospecies cluster formed at 95 ANI encompasses lineages which fall outside the one most commonly associated with anthrax illness (Fig. 3A and B). At a 95 ANI genomospecies threshold, three of seven genomes deposited in RefSeq as anthraxcausing "B. cereus" most closely resembled the B. anthracis reference genome (Fig. 3A and B; Table S5), while also sharing  $\geq$ 95 ANI with the *B. paranthracis* type strain genome (Table S5). The remaining four anthrax-causing "B. cereus" genomes most closely resembled the *B. tropicus* type strain, shared  $\geq$ 95 ANI with the *B. paranthracis* type strain, and shared between 94 and 95 ANI with the B. anthracis species reference genome (Table S5). The separation of anthrax-causing "B. cereus" genomes into two genomospecies at 95 ANI was maintained when medoid genomes were used (Fig. 2A2; Table S5). As such, several anthrax-causing "B. cereus" strains are technically still B. anthracis at 95 ANI (Fig. 3A and B) and despite having a mosaic of phenotypic characteristics attributed to "B. cereus" and B. anthracis.

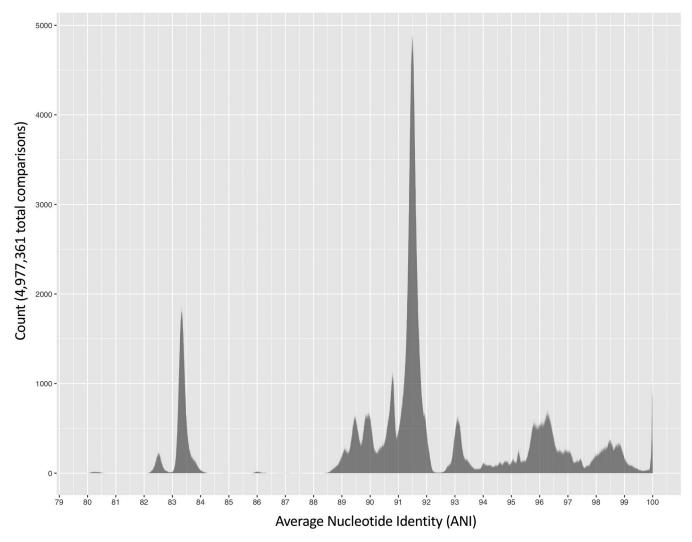


**FIG 3** Maximum likelihood phylogenies of 2,218 *B. cereus* group genomes with  $N_{so}$  of >20 kbp. Tip and branch labels are colored by genomospecies assignment using medoid genomes of genomospecies clusters formed at the widely used genomospecies threshold of 95 ANI (clusters are arbitrarily numbered) (A) and presence (colored) and absence (gray) of anthrax toxin genes *cya*, *lef*, and *pagA* (B); cereulide synthetase-encoding *cesABCD* (C); and one or more previously described Cry or Cyt insecticidal toxin-encoding genes (D). Phylogenies were constructed using core SNPs identified in 79 single-copy orthologous gene clusters present in 2,231 *B. cereus* group genomes. The type strain of "*B. manliponensis*" (i.e., the most distantly related member of the group) was treated as an outgroup on which each phylogeny was rooted. Virulence genes (*cya*, *lef*, and *pagA* and *cesABCD*) were detected using BTyper version 2.3.2 (default thresholds), while insecticidal toxin-encoding genes are shown, with predicted putative novel insecticidal toxin-encoding genes as excluded).

Similar issues plague emetic "B. cereus," designated as such by its ability to produce cereulide, a toxin responsible for foodborne illness characterized by vomiting symptoms (13, 38, 49). At 95 ANI, all 30 emetic "B. cereus" genomes most closely resembled the B. paranthracis type strain, were confined to a single medoid-centric genomospecies, and were interspersed among genomes which lacked cereulide synthetase-encoding genes cesABCD (Fig. 3A and C; Table S6). cesABCD were detected in five genomes representing two additional medoid-based genomospecies at 95 ANI (Fig. 3A and C; Table S6). One contained the type strains of B. weihenstephanensis and B. mycoides, which is unsurprising considering that cereulide-producing B. weihenstephanensis has been isolated in rare cases (28, 50). However, two genomes categorized previously as emetic "B. weihenstephanensis" belonged to a completely separate genomospecies at 95 ANI (Fig. 3A and C; Table S6).

The Cry and Cyt insecticidal proteins associated with *B. thuringiensis* (i.e., Bt toxins), which can be plasmid mediated, face similar issues, as *B. thuringiensis* has historically been defined by its ability to produce insecticidal toxins (e.g., Cry and Cyt toxins) (51). However, genes encoding known insecticidal toxins were detected in nine of 21 *B. cereus* group type strain-centric genomospecies at 95 ANI (Fig. 3A and D). These results are consistent with previous findings, as Bt toxin production has been attributed to numerous lineages (29, 51, 52).

ANI-based comparisons to medoid genomes using a lowered genomospecies threshold of  $\approx$ 92.5 eliminate the species overlap problem. Numerous bacterial genomospecies have showcased a breakpoint in genome similarity which is close to

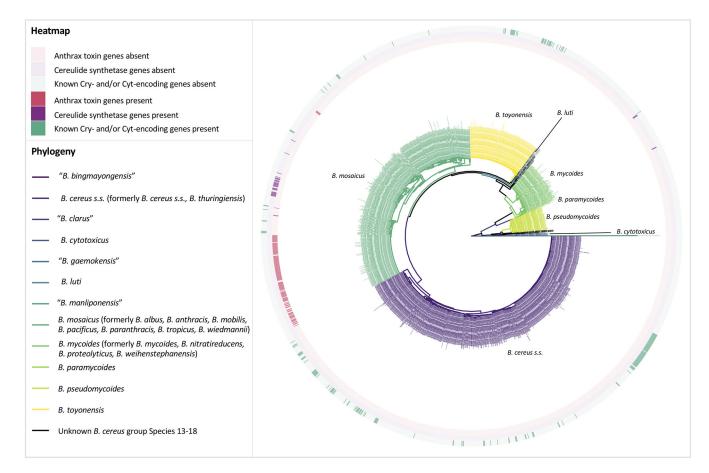


**FIG 4** Histogram of pairwise average nucleotide identity (ANI) values calculated between 2,231 *B. cereus* group genomes downloaded from NCBI's RefSeq database. FastANI version 1.0 was used to calculate all pairwise ANI values. For histograms colored according to closest species type strain/reference genome at a conventional  $\geq$ 95 ANI threshold, or histograms showing pairwise ANI values calculated between genomes meeting additional quality thresholds, see Fig. S1 and S2, respectively.

95 ANI (5); however, ANI values among a significant proportion of *B. cereus* group genomes, particularly *B. anthracis* and neighboring lineages, fall within the 93 to 95 ANI range, with a breakpoint occurring at  $\approx$ 92.5 ANI (Fig. 4; Fig. S1). Using a hard 92.5 ANI threshold for *B. cereus* group genomospecies assignment, rather than 95, nearly eliminates the species overlap problem: only six of 2,231 genomes (0.269%) were assigned to 2 or more medoid-based genomospecies (Fig. 2B2; Table S7), compared to 18.2% and 66.2% of genomes assigned to multiple genomospecies at 95 ANI when medoid genomes and species type strain/reference genomes were used, respectively (Fig. 2; Tables S2 and S3). Eighteen genomospecies at 95 ANI (Fig. 3A and Fig. 5; Tables S3 and S7). Notably, at 92.5 ANI, seven genomospecies did not possess type strains of any published species (Table S7), indicating that putative novel genomospecies may be present. While one of these genomospecies has recently been proposed as novel species "*B. clarus*" (53), the remaining six are uncharacterized (Table S8).

# DISCUSSION

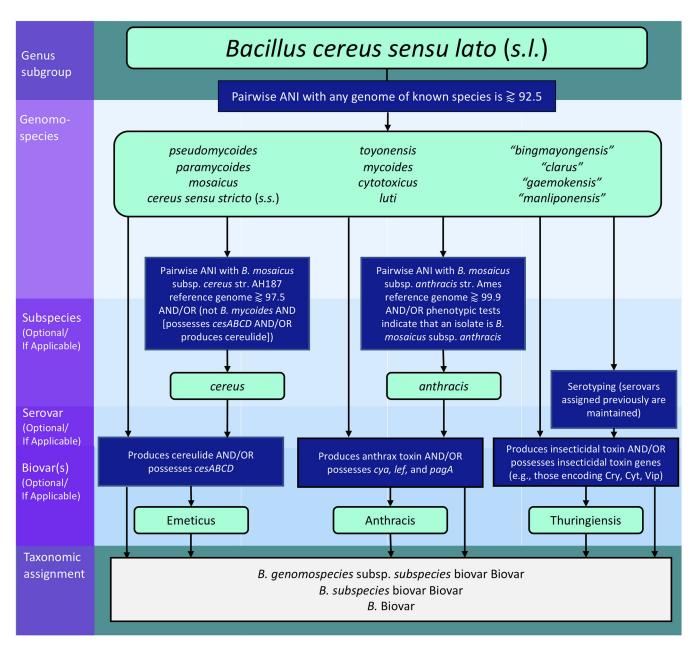
When applied to bacteria, the concept of "species" is notoriously ambiguous, particularly in cases where it is intertwined with a phenotype, and even more so when



**FIG 5** Maximum likelihood phylogeny of 2,218 *B. cereus* group genomes with  $N_{so}$  of >20 kb. Tip and branch labels are colored by genomospecies assignment using medoid genomes of genomospecies clusters formed at the proposed genomospecies threshold of 92.5 ANI. Phylogeny was constructed using core SNPs identified in 79 single-copy orthologous gene clusters present in 2,231 *B. cereus* group genomes. The type strain of "*B. manliponensis*" (i.e., the most distantly related member of the group) was treated as an outgroup on which the phylogeny was rooted.

that phenotype is an established component of the medical or industrial lexicon. Taxonomic definitions based on phenotype lack nuance in the omics era, as they ignore underpinning genomic diversity which can be leveraged to improve assessment of an isolate's pathogenic potential or industrial utility. Furthermore, taxonomy based on phenotype can be ambiguous—and even misleading—when a trait is lost, gained, or not widespread throughout a lineage. A notable example is provided by botulinum neurotoxin (BoNT)-producing species, to which the *Clostridium botulinum* label has historically been applied, despite multiple genomospecies exhibiting BoNT production capabilities (6). Adherence to a nomenclature just for the sake of taxonomic rigor, however, can be equally problematic when a lineage has deep roots in medicine or industry. *Shigella* spp. and *Escherichia coli*, for example, constitute a single genomospecies ut are considered to be distinct entities, despite genomic inconsistencies reflected in their nomenclature (7, 54, 55).

An ideal taxonomy should be interpretable, without sacrificing the resolution provided by contemporary technologies. Several publications have appended the term "biovar" to species names to denote isolates which exhibit interesting phenotypes (e.g., anthrax-causing "B. cereus" as B. cereus biovar anthracis and Cry-producing B. wiedmannii as B. wiedmannii biovar thuringiensis) (41, 52). We therefore propose a taxonomic framework consisting of (i) an amended collection of genomospecies, corresponding to resolvable genomospecies obtained at  $\approx$ 92.5 ANI; (ii) a formal collection of subspecies, which account for established lineages of medical importance; and (iii) a formalized and extended collection of biovars, which account for phenotypic heterogeneity (Fig. 6).



**FIG 6** Taxonomic hierarchy for the proposed *B. cereus* group nomenclature. Taxonomic levels are listed in the left margin, with levels which are optional/not applicable to all organisms denoted as such. Rounded boxes shaded in light green correspond to possible taxonomic designations at their respective level, while blue boxes correspond to requirements that an isolate and/or its genome must meet to be assigned that designation. Possible forms which the final taxonomic assignment can take can be found in the gray box at the bottom of the chart.

Note that a recently proposed "genomovar" framework for *B. cereus sensu stricto/B. thuringiensis* (56) is not adopted here, due to the lack of genomospecies boundaries between their type strains (shown here and elsewhere [33–35], including the paper proposing the framework [56]), as well as the lack of a standardized species definition for *B. thuringiensis* (*B. thuringiensis* has been used to refer to any *B. cereus* group species capable of producing Bt toxins [29] or to the genomospecies formed by the *B. thuringiensis* type strain genome [56]).

**Proposed taxonomic nomenclature.** (A) Genomospecies. The *B. cereus* group currently consists of eight published genomospecies (designated I to VIII), four previously proposed genomospecies (designated ix to xii), and six putative novel genomospecies (designated xiii to xviii) (Fig. 5). A genome belongs to a genomospecies if it

shares  $\geq$  92.5 ANI with the genomospecies medoid genome (see Table S7 in the supplemental material). Due to the resolvability of genomospecies at this threshold, it follows that (i) a genome does not belong to a genomospecies if it shares  $\leq$  92.5 ANI with the genomospecies medoid genome, (ii) two genomes belong to the same genomospecies if they share  $\geq$  92.5 ANI with each other, and (iii) two genomes belong to different genomospecies if they share  $\leq$  92.5 ANI with each other (i.e., in practice, a genomospecies medoid genome does not need to be used for genomospecies assignment, but rather any genome of known genomospecies; see Tables S6 and S7 for a comprehensive list of genomospecies assignments). When written, genomospecies names immediately follow the genus name (*Bacillus* or *B*.) and are italicized and lowercase.

**Published genomospecies. (I)** *Bacillus pseudomycoides.* The *B. pseudomycoides* genomospecies contained 111 genomes, including the genome of species type strain *B. pseudomycoides* strain DSM 12442. All genomes previously classified as *B. pseudomycoides* relative to the type strain at a 95 ANI threshold remain in this genomospecies, and no additional genomes belong to the genomospecies. As such, this genomospecies remains consistent with its previous classification, and its name remains unchanged.

(II) *Bacillus paramycoides.* The *B. paramycoides* genomospecies contained six genomes, including the genome of species type strain *B. paramycoides* strain NH24A2. All genomes previously classified as *B. paramycoides* relative to the type strain at a 95 ANI threshold remain in this genomospecies, and no additional genomes belong to the genomospecies. As such, this genomospecies remains consistent with its previous classification, and its name remains unchanged.

(III) **Bacillus mosaicus.** The *B. mosaicus* genomospecies contained 722 genomes, including type strains and reference genomes of species formerly known as *B. albus* (now *B. mosaicus* strain N35-10-2), *B. anthracis* (now *B. mosaicus* subsp. *anthracis* strain Ames; see "Subspecies" and "Biovars" below), *B. mobilis* (now *B. mosaicus* strain 0711P9-1), *B. pacificus* (now *B. mosaicus* strain EB422), *B. paranthracis* (now *B. mosaicus* strain MN5), *B. tropicus* (now *B. mosaicus* strain N24), and *B. wiedmannii* (now *B. mosaicus* strain FSL W8-0169). Additionally, all members of the lineage formerly known as emetic "*B. cereus*" belong to *B. mosaicus* (see "Subspecies" and "Biovars" below). While the species formerly known as *B. anthracis* is the oldest described former species in this group, it is not proposed as the genomospecies name, as doing so could lead to incorrect assumptions of an isolate's anthrax-causing potential. As such, the proposed genomospecies name (*mosaicus*) is chosen to reflect the diversity of lineages and phenotypes present among members of this genomospecies. All genomes previously assigned to the abovementioned former species using their respective type strain or reference genomes at a 95 ANI threshold belong to *B. mosaicus*.

(IV) Bacillus cereus sensu stricto. The *B. cereus sensu stricto* genomospecies contained 949 genomes, including those of type strains *B. cereus sensu stricto* (*B. cereus sensu stricto* strain ATCC 14579) and former species *B. thuringiensis* (now *B. cereus sensu stricto* serovar Berliner biovar Thuringiensis strain ATCC 10792; see "Biovars" below). *B. cereus sensu stricto* was chosen as the genomospecies name, with Thuringiensis proposed as a biovar to account for phenotypic heterogeneity within *B. cereus sensu stricto*, as well as the presence of insecticidal toxins in other genomospecies (see "Biovars" below). All genomes previously assigned to the species *B. cereus sensu stricto* and former species *B. thuringiensis* at a 95 ANI threshold using these type strains belong to *B. cereus sensu stricto*.

(V) Bacillus toyonensis. The *B. toyonensis* genomospecies contained 230 genomes, including the type strain of *B. toyonensis* (*B. toyonensis* strain BCT-7112). All genomes previously classified as *B. toyonensis* relative to the type strain at a 95 ANI threshold remain in this genomospecies, and no additional genomes belong to the genomospecies. As such, this genomospecies remains consistent with its previous classification, and its name remains unchanged.

(VI) Bacillus mycoides. The B. mycoides genomospecies contained 164 genomes, including the type strain of B. mycoides (B. mycoides strain DSM 2048), and former species B. nitratireducens (now B. mycoides strain 4049), B. proteolyticus (now B. mycoides strain TD42), and B. weihenstephanensis (now B. mycoides strain WSBC 10204). Additionally, all members of the lineages formerly known as emetic B. weihenstephanensis belong to B. mycoides (see "Biovars" below). B. mycoides was selected as the genomospecies name, as it is the oldest of the published former species described in this cluster (and remains consistent with taxonomic changes recently proposed by others [44]). All genomes previously assigned to the abovementioned species using their respective type strain or reference genomes and a 95 ANI threshold belong to B. mycoides.

**(VII)** *Bacillus cytotoxicus.* The *B. cytotoxicus* genomospecies contained 14 genomes, including the type strain of *B. cytotoxicus* (*B. cytotoxicus* strain NVH 391-98). All genomes previously classified as *B. cytotoxicus* relative to the type strain at a 95 ANI threshold remain in this genomospecies, and no additional genomes belong to the genomospecies. As such, this genomospecies remains consistent with its previous classification, and its name remains unchanged.

(VIII) *Bacillus luti*. The *B. luti* genomospecies contained nine genomes, including the type strain of *B. luti* (*B. luti* strain TD41). All genomes previously classified as *B. luti* relative to the type strain at a 95 ANI threshold remain in this genomospecies, and no additional genomes belong to the genomospecies. As such, this genomospecies remains consistent with its previous classification, and its name remains unchanged.

**Previously proposed putative genomospecies.** The following putative *B. cereus* group genomospecies which have been proposed previously remain unchanged: (IX) *"B. bingmayongensis"* (including type strain *"B. bingmayongensis"* strain FJAT-13831), (X) *"B. gaemokensis"* (including type strain *"B. gaemokensis"* strain KCTC 13318), (XI) *"B. manliponensis"* (including type strain *"B. manliponensis"* strain JCM 15802), and (XII) *"B. clarus"* (including type strain *"B. clarus"* strain ATCC 21929).

**Putative novel genomospecies.** Six putative genomospecies (xiii to xviii [Table S8]) have not been proposed as novel genomospecies. Future novel *B. cereus* group genomospecies should (i) share <92.5 ANI with all *B. cereus* group genomes and (ii) share  $\geq$ 97% 16S rRNA gene similarity with known *B. cereus* group species (a definition used in previous studies [35]).

**(B)** Subspecies. The following subspecies are proposed to ensure that the medically important lineages formerly known as *B. anthracis* and emetic "*B. cereus*" remain interpretable. When written, subspecies names are italicized and lowercase and can optionally (i) be appended to the species name, after the nonitalicized delimiter "subspecies" or "subsp.," prior to a serotype designation (if applicable); or (ii) follow the genus name (*Bacillus* or *B.*) directly, with the species name omitted, prior to a serotype designation (if applicable).

- a. *Bacillus mosaicus* subsp. *anthracis* (can be written as *B. mosaicus* subsp. *anthracis*; *B. anthracis*) refers to the comparatively clonal lineage of former species *B. anthracis* commonly associated with anthrax illness. Isolates which are assigned to this subspecies (i) exhibit distinguishing phenotypic characteristics (e.g., lack of motility and lack of hemolysis on sheep red blood cell [RBC] agar) associated with the classical definition of *B. anthracis* as outlined in the *Bacteriological Analytical Manual* (BAM) chapter on *B. cereus* (2) and/or (ii) share ≥99.9 ANI with former species reference genome *B. anthracis* strain Ames (now *B. mosaicus* subsp. *anthracis*; RefSeq accession no. GCF\_000007845.1), a threshold previously identified for this lineage (5) which was replicated here. The use of the term "subspecies *anthracis*" does not indicate whether an isolate produces anthrax toxin or possesses the machinery required for anthrax toxin synthesis (see "biovar Anthracis" below).
- b. *Bacillus mosaicus* subsp. *cereus* (can be written as *B. mosaicus* subsp. *cereus*; *B. cereus*) refers to the lineage formerly known as emetic "*B. cereus*." All genomes

possessing cereulide synthetase genes (*cesABCD*) which did not belong to the *B. mycoides* species cluster (see "Genomospecies" above) shared  $\geq$ 97.5 ANI with the emetic reference strain formerly known as *B. cereus* strain AH187 (now *B. mosaicus* subsp. *cereus* biovar Emeticus; RefSeq accession no. GCF\_000021225.1). As such, isolates assigned to this subspecies (i) produce cereulide and belong to the species *B. mosaicus*, (ii) possess *cesABCD* and belong to the species *B. mosaicus*, and/or (iii) share  $\geq$ 97.5 ANI with emetic reference genome *B. cereus* strain AH187 (now *B. mosaicus* subsp. *cereus* biovar Emeticus; RefSeq accession no. GCF\_000021225.1). The use of the term "subspecies *cereus*" does not indicate whether an isolate produces cereulide or possesses the machinery required for cereulide synthesis (see "Biovar Emeticus" below).

**(C) Biovars.** The following biovars are proposed to account for phenotypes of clinical and industrial importance which can be distributed across species and heterogeneous in their appearance in individual lineages. While phenotypic evidence of a trait is ideal, biovars can be predicted at the genomic level. When written, (i) the first letter of the biovar is capitalized; (ii) the biovar name is not italicized; (iii) the biovar is appended to the end of a species, subspecies (if applicable), or serotype name (if applicable), following the nonitalicized delimiter "biovar"; (iv) if applicable, multiple biovars follow the nonitalicized, plural delimiter "biovars," are listed in alphabetical order, and are each separated by a comma and a single space; (v) biovar(s) may follow the genus name (*Bacillus* or *B*.) directly, with the species, subspecies (if applicable), and serotype (if applicable) names omitted

- a. Biovar Anthracis is applied to an isolate (i) known to produce anthrax toxin (preferred) and/or (ii) known to possess anthrax toxin-encoding genes *cya, lef,* and *pagA*. Capsular genes (e.g., *cap, has,* and *bps*) (21, 22, 57) are deliberately excluded from this definition as a conservative measure (i.e., to avoid cases in which an isolate might cause anthrax via a previously unknown capsule). Examples include *B. mosaicus* subsp. *anthracis* biovar Anthracis (i.e., anthrax-causing members of the "clonal" lineage often associated with anthrax disease; can be written as *B. anthracis* biovar Anthracis or *B.* Anthracis); *B. mosaicus* biovar Anthracis (i.e., anthrax-causing lineages formerly known as "anthrax-causing *B. cereus*"; can be written as *B.* Anthracis).
- b. Biovar Emeticus is applied to an isolate known to produce cereulide (preferred) and/or to possess cereulide synthetase-encoding genes (*cesABCD*). Examples include *B. mosaicus* subsp. *cereus* biovar Emeticus (i.e., cereulide-producing lineages formerly known as emetic "*B. cereus*"; can be written as *B. cereus* biovar Emeticus or *B.* Emeticus) and *B. mycoides* biovar Emeticus (i.e., cereulide-producing lineages formerly known as "emetic *B. weihenstephanensis*"; can also be written as *B.* Emeticus).
- c. Biovar Thuringiensis can be applied to an isolate known to produce one or more Bt toxins (e.g., Cry, Cyt, or Vip toxins; preferred) and/or to possess Bt toxinencoding genes. Examples include *B. mosaicus* biovar Thuringiensis and *B. cereus sensu stricto* biovar Thuringiensis (both of which can be written as *B.* Thuringiensis).

The proposed taxonomy offers numerous advantages. Most importantly, it is consistent; it provides an explicit, standardized framework for taxonomic classification using genomic and/or phenotypic methods, and it resolves previous nomenclatural ambiguities. Second, the proposed taxonomy is backwards compatible with important medical and industrial taxonomic definitions. For example, any *B. cereus* group isolate capable of producing Bt toxins can be referred to as *B.* Thuringiensis, which is equivalent to the traditional species definition (29). All isolates capable of producing anthrax toxin can be referred to as *B.* Anthracis, while members of the "clonal" anthrax lineage remain *B. anthracis* (using subspecies notation). Finally, the proposed taxonomy is flexible and can be extended to account for additional lineages or phenotypes through the adoption of novel subspecies or biovars, respectively. For example, biovars can be proposed to describe *B. cereus* group members capable of causing diarrheal foodborne disease (i.e., biovar Cereus), as this disease involves multiple toxins and is not fully understood (58). The nomenclature proposed here not only provides a standardized framework for taxonomic classification which accounts for both phylogenomic diversity and phenotypic heterogeneity, but also serves as a model taxonomic framework which moves beyond arbitrary genomospecies thresholds while maintaining historical congruence.

#### **MATERIALS AND METHODS**

Acquisition and initial characterization of *Bacillus cereus* group genomes. All genomes in the NCBI RefSeq Assembly database (59) which were submitted as one of 18 published *B. cereus* group species (35) were downloaded, along with the type strain genomes of three proposed effective *B. cereus* group species (60–62) (n = 2,231, accessed 19 November 2018) (see Tables S1 and S6 in the supplemental material). QUAST version 4.0 (63) was used to assess the quality of each genome, and BTyper version 2.3.2 (31) was used to detect *B. cereus* group virulence genes in each genome, using default minimum amino acid sequence identity and coverage thresholds (50% and 70%, respectively) (Table S6) (31, 64). Prokka version 1.12 (65) was used to annotate each genome, and the resulting coding sequences were used as input for the command-line implementation of BtToxin\_scanner version 1.0 (BtToxin\_scanner2.pl), which was used to identify Bt toxin genes in each genome using default settings (66).

**Calculation of pairwise ANI values, hierarchical clustering, and medoid genome identification.** FastANI version 1.0 (5) was used to calculate ANI values between each of 2,231 genomes (4,977,361 comparisons). To ensure that the breakpoints and shape of the distribution of pairwise ANI calculations were robust, genomes which (i) fell below various  $N_{so}$  thresholds (i.e.,  $\leq 10$  kbp, 20 kbp, 50 kbp, and 100 kbp) and/or (ii) contained any contigs classified in domains other than *Bacteria*, phyla other than *Firmicutes*, and/or genera other than *Bacillus* using Kraken version 2.0.8-beta (67, 68) and the complete standard Kraken database (accessed 6 August 2019) were removed (Fig. S2). For medoid genome identification (described below), all genomes with  $N_{so}$  of >20 kbp in the original set of 2,231 RefSeq genomes were used in subsequent steps (n = 2,218) (Table S6 and Fig. S2).

The resulting pairwise ANI values were used to construct a similarity matrix,  $S_{ANI'}$  using R version 3.6.0 (69) and the reshape2 package (70) as follows, where n = 2,218:

Let  $g_1, g_2, \ldots, g_n$  be a set of n genomes, denoted by G ( $G = \{g_1, g_2, \ldots, g_n\}$ ). Similarity function  $ANI(g_i, g_j)$  denotes the ANI value shared by query and reference genomes  $g_i$  and  $g_j$ , respectively, where  $ANI: G \times G \rightarrow [0, 100]$ .

Similarity matrix  $S_{ANI}$  can be defined as  $S_{ANI} = (s_{ij})$ ;  $s_{ij} = ANI_{ij} = ANI(g_{ij}, g_{j})$ .

Similarity matrix  $S_{ANI}$  was converted to a dissimilarity matrix,  $D_{ANI'}$  as follows, where J denotes an  $n \times n$  matrix where each element is equal to 1:  $D_{ANI} = 100J - S_{ANI'}$ 

ANI as a similarity function is not symmetric [i.e., for all  $g_{\mu} g_{j\nu} ANI(g_{\mu} g_{j}) \neq ANI(g_{\mu} g_{j})$ ], as minor differences between corresponding values in the upper and lower triangles of  $D_{ANI}$  existed: max $[d(g_{\mu} g_{j}), d(g_{\mu} g_{j})] = 0.504$ ; min $[d(g_{\mu} g_{j}), d(g_{\mu} g_{j})] = 0$ ; mean $[d(g_{\mu} g_{j}), d(g_{\mu} g_{j})] = 0.056$ ; median $[d(g_{\mu} g_{j}), d(g_{\mu} g_{j})] = 0.046$ .

As such,  $D_{ANI}$  is not a symmetric matrix (i.e.,  $D_{ANI} \neq D_{ANI}^{T}$ ). To coerce  $D_{ANI}$  to a symmetric matrix,  $D_{ANI}^{sym}$  the following transformation was applied:  $D_{ANI}^{sym} = 0.5(D_{ANI} + D_{ANI}^{T})$ .

The hclust function in R's stats package was used to perform average linkage hierarchical clustering, using  $D_{ANI}^{sym}$  as the dissimilarity structure, and the resulting dendrogram was annotated using the ggplot2 (71), dendextend (72), and viridis (73) packages. Dendrogram clusters formed at various species thresholds (denoted here by  $T_{d'}$  where  $T_d = [5, 7.5]$ , corresponding to ANI values of 95 and 92.5, respectively) were obtained by treating lineages which coalesced prior to  $T_d$  as members of the same cluster (i.e., genomospecies) and those which did not as members of different clusters. Medoid genomes were identified within each cluster at each threshold, using the pam function in R's cluster package (74) and  $D_{ANI}^{sym}$  as a dissimilarity structure, where medoid genome is defined as

$$g_{\text{medoid}} = \arg\min_{y \in \{g_1, g_2, \dots, g_n\}} \sum_{i=1}^n d(y, g_i)$$

where  $d(g_i, g_i) = 100 - ANI(g_i, g_i)$ .

To construct a graph with each of 2,218 genomes represented as nodes and ANI values represented as weighted edges,  $D_{\text{ANI}}^{\text{sym}}$  was converted to a symmetric similarity matrix,  $S_{\text{ANI}}^{\text{sym}}$  as follows:

$$S_{\rm ANI}^{\rm sym} = -1 (D_{\rm ANI}^{\rm sym} - 100J)$$

The igraph (75) package in R was used to construct each graph, with  $S_{\text{ANI}}^{\text{sym}}$  treated as an adjacency matrix, and edges with weights (i.e., ANI values) less than a similarity threshold  $T_s$  (i.e.,  $T_s = [92.5, 95]$ ) removed.

**Genomospecies assignment.** FastANI version 1.0 was used to assign each of 2,231 *B. cereus* group genomes to a genomospecies, using (i) species reference/type strain genomes (n = 21) (Table S1) and medoid genomes identified at (ii) 95 ANI (n = 36) (Table S3) and (iii) 92.5 ANI (n = 18) (Table S7) as reference genomes for each of three separate runs.

Phylogeny construction. Amino acid sequences of protein-encoding features produced by Prokka were used as input for OrthoFinder version 2.3.3 (76). Single-copy orthologous clusters (i.e., genes) present in all 2,231 genomes were identified using an iterative approach, in which OrthoFinder was used to identify single-copy genes core to n of the 2,231 genomes, sampled randomly without replacement, where n = 30 or n = 11 for 74 and 1 (the remainder) iteration(s), respectively. The union of single-copy genes present in all n genomes in each random sample of genomes was then queried again using OrthoFinder, which identified a total of 79 single-copy genes core to all 2,231 genomes. Nucleotide sequences of each of the 79 single-copy core genes were aligned using PRANK v.170427 (77). The resulting alignments were concatenated, and SNP-sites version 2.4.0 (78) was used to produce an alignment of variant sites, excluding gaps and ambiguous characters. IQ-TREE version 1.6.10 (79) was used to construct a maximum likelihood phylogeny, using the alignment of core single nucleotide polymorphisms (SNPs) detected in all 2,231 genomes. The GTR+G+ASC nucleotide substitution model (i.e., general time reversible model [80] with a gamma parameter [81] to allow rate heterogeneity among sites and an ascertainment bias correction [82] to account for the use of solely variant sites) was used, along with 1,000 replicates of the ultrafast bootstrap approximation (83). The resulting phylogeny was annotated in R using the ggplot2 (71), ape (84), phytools (85), phylobase (86), ggtree (87), and phangorn (88) packages.

**Data availability.** Accession numbers for all genomes queried in this study are available in Table S6. BTyper3, a command-line tool for characterizing *B. cereus* group genomes using the framework outlined here, is available at https://github.com/lmc297/BTyper3. An R package, bactaxR, is available for identifying medoid genomes and constructing plots using the methods described here at https://github.com/lmc297/bactaxR.

## SUPPLEMENTAL MATERIAL

Supplemental material is available online only. FIG S1, PDF file, 0.5 MB. FIG S2, PDF file, 0.1 MB. TABLE S1, XLSX file, 0.01 MB. TABLE S2, XLSX file, 0.02 MB. TABLE S4, XLSX file, 0.02 MB. TABLE S5, XLSX file, 0.01 MB. TABLE S6, XLSX file, 0.5 MB. TABLE S7, XLSX file, 0.01 MB. TABLE S8, XLSX file, 0.01 MB.

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#### REFERENCES

- Tallent SM, Kotewicz KM, Strain EA, Bennett RW. 2012. Efficient isolation and identification of *Bacillus cereus* group. J AOAC Int 95:446–451. https://doi.org/10.5740/jaoacint.11-251.
- Tallent SM, Rhodehamel EJ, Harmon SM, Bennett RW. 2012. Bacillus cereus. Bacteriological analytical manual. US Food and Drug Administration, Washington, DC.
- Skerman VBD, McGowan V, Sneath PHA, Moore W. 1989. Approved lists of bacterial names (amended). American Society for Microbiology, Washington, DC.
- Richter M, Rosselló-Móra R. 2009. Shifting the genomic gold standard for the prokaryotic species definition. Proc Natl Acad Sci U S A 106: 19126–19131. https://doi.org/10.1073/pnas.0906412106.
- Jain C, Rodriguez RL, Phillippy AM, Konstantinidis KT, Aluru S. 2018. High throughput ANI analysis of 90K prokaryotic genomes reveals clear species boundaries. Nat Commun 9:5114. https://doi.org/10.1038/s41467 -018-07641-9.
- Smith T, Williamson CHD, Hill K, Sahl J, Keim P. 2018. Botulinum neurotoxin-producing bacteria. Isn't it time that we called a species a species? mBio 9:e01469-18. https://doi.org/10.1128/mBio.01469-18.
- Pettengill EA, Pettengill JB, Binet R. 2015. Phylogenetic analyses of Shigella and enteroinvasive Escherichia coli for the identification of molecular epidemiological markers: whole-genome comparative analysis

does not support distinct genera designation. Front Microbiol 6:1573. https://doi.org/10.3389/fmicb.2015.01573.

- Forbes BA. 2017. Mycobacterial taxonomy. J Clin Microbiol 55:380–383. https://doi.org/10.1128/JCM.01287-16.
- Hoffmaster AR, Fitzgerald CC, Ribot E, Mayer LW, Popovic T. 2002. Molecular subtyping of *Bacillus anthracis* and the 2001 bioterrorism-associated anthrax outbreak, United States. Emerg Infect Dis 8:1111–1116. https://doi .org/10.3201/eid0810.020394.
- Takahashi H, Keim P, Kaufmann AF, Keys C, Smith KL, Taniguchi K, Inouye S, Kurata T. 2004. *Bacillus anthracis* incident, Kameido, Tokyo, 1993. Emerg Infect Dis 10:117–120. https://doi.org/10.3201/eid1001.030238.
- Abbara A, Brooks T, Taylor GP, Nolan M, Donaldson H, Manikon M, Holmes A. 2014. Lessons for control of heroin-associated anthrax in Europe from 2009–2010 outbreak case studies, London, UK. Emerg Infect Dis 20:1115–1122. https://doi.org/10.3201/eid2007.131764.
- Hanczaruk M, Reischl U, Holzmann T, Frangoulidis D, Wagner DM, Keim PS, Antwerpen MH, Meyer H, Grass G. 2014. Injectional anthrax in heroin users, Europe, 2000–2012. Emerg Infect Dis 20:322–323. https://doi.org/ 10.3201/eid2002.120921.
- Stenfors Arnesen LP, Fagerlund A, Granum PE. 2008. From soil to gut: Bacillus cereus and its food poisoning toxins. FEMS Microbiol Rev 32: 579–606. https://doi.org/10.1111/j.1574-6976.2008.00112.x.

- Bottone EJ. 2010. Bacillus cereus, a volatile human pathogen. Clin Microbiol Rev 23:382–398. https://doi.org/10.1128/CMR.00073-09.
- Jouzani GS, Valijanian E, Sharafi R. 2017. *Bacillus thuringiensis*: a successful insecticide with new environmental features and tidings. Appl Microbiol Biotechnol 101:2691–2711. https://doi.org/10.1007/s00253-017 -8175-y.
- Chattopadhyay P, Banerjee G, Mukherjee S. 2017. Recent trends of modern bacterial insecticides for pest control practice in integrated crop management system. 3 Biotech 7:60. https://doi.org/10.1007/s13205 -017-0717-6.
- Kamar R, Gohar M, Jehanno I, Rejasse A, Kallassy M, Lereclus D, Sanchis V, Ramarao N. 2013. Pathogenic potential of *Bacillus cereus* strains as revealed by phenotypic analysis. J Clin Microbiol 51:320–323. https://doi.org/10.1128/JCM.02848-12.
- Miller RA, Jian J, Beno SM, Wiedmann M, Kovac J. 2018. Intraclade variability in toxin production and cytotoxicity of *Bacillus cereus* group type strains and dairy-associated isolates. Appl Environ Microbiol 84: e02479-17. https://doi.org/10.1128/AEM.02479-17.
- Okinaka RT, Cloud K, Hampton O, Hoffmaster AR, Hill KK, Keim P, Koehler TM, Lamke G, Kumano S, Mahillon J, Manter D, Martinez Y, Ricke D, Svensson R, Jackson PJ. 1999. Sequence and organization of pXO1, the large *Bacillus anthracis* plasmid harboring the anthrax toxin genes. J Bacteriol 181:6509–6515. https://doi.org/10.1128/JB.181.20.6509-6515 .1999.
- 20. Ezzell JW, Welkos SL. 1999. The capsule of *Bacillus anthracis*, a review. J Appl Microbiol 87:250. https://doi.org/10.1046/j.1365-2672.1999.00881.x.
- Oh SY, Budzik JM, Garufi G, Schneewind O. 2011. Two capsular polysaccharides enable *Bacillus cereus* G9241 to cause anthrax-like disease. Mol Microbiol 80:455–470. https://doi.org/10.1111/j.1365-2958.2011.07582.x.
- Scarff JM, Seldina YI, Vergis JM, Ventura CL, O'Brien AD. 2018. Expression and contribution to virulence of each polysaccharide capsule of *Bacillus cereus* strain G9241. PLoS One 13:e0202701. https://doi.org/10.1371/ journal.pone.0202701.
- 23. Reyes-Ramírez A, Ibarra JE. 2008. Plasmid patterns of *Bacillus thuringiensis* type strains. Appl Environ Microbiol 74:125–129. https://doi.org/10.1128/AEM.02133-07.
- Meric G, Mageiros L, Pascoe B, Woodcock DJ, Mourkas E, Lamble S, Bowden R, Jolley KA, Raymond B, Sheppard SK. 2018. Lineage-specific plasmid acquisition and the evolution of specialized pathogens in *Bacillus thuringiensis* and the *Bacillus cereus* group. Mol Ecol 27:1524–1540. https://doi.org/10.1111/mec.14546.
- Gonzalez JM, Jr, Brown BJ, Carlton BC. 1982. Transfer of *Bacillus thuringiensis* plasmids coding for delta-endotoxin among strains of *B. thuringiensis* and *B. cereus*. Proc Natl Acad Sci U S A 79:6951–6955. https:// doi.org/10.1073/pnas.79.22.6951.
- Ehling-Schulz M, Fricker M, Grallert H, Rieck P, Wagner M, Scherer S. 2006. Cereulide synthetase gene cluster from emetic *Bacillus cereus*: structure and location on a mega virulence plasmid related to *Bacillus anthracis* toxin plasmid pXO1. BMC Microbiol 6:20. https://doi.org/10 .1186/1471-2180-6-20.
- Rasko DA, Rosovitz MJ, Okstad OA, Fouts DE, Jiang L, Cer RZ, Kolsto AB, Gill SR, Ravel J. 2007. Complete sequence analysis of novel plasmids from emetic and periodontal *Bacillus cereus* isolates reveals a common evolutionary history among the *B. cereus*-group plasmids, including *Bacillus anthracis* pXO1. J Bacteriol 189:52–64. https://doi.org/10.1128/ JB.01313-06.
- Thorsen L, Hansen BM, Nielsen KF, Hendriksen NB, Phipps RK, Budde BB. 2006. Characterization of emetic *Bacillus weihenstephanensis*, a new cereulide-producing bacterium. Appl Environ Microbiol 72:5118–5121. https://doi.org/10.1128/AEM.00170-06.
- Zheng J, Gao Q, Liu L, Liu H, Wang Y, Peng D, Ruan L, Raymond B, Sun M. 2017. Comparative genomics of *Bacillus thuringiensis* reveals a path to specialized exploitation of multiple invertebrate hosts. mBio 8:e00822 -17. https://doi.org/10.1128/mBio.00822-17.
- Klee SR, Brzuszkiewicz EB, Nattermann H, Bruggemann H, Dupke S, Wollherr A, Franz T, Pauli G, Appel B, Liebl W, Couacy-Hymann E, Boesch C, Meyer FD, Leendertz FH, Ellerbrok H, Gottschalk G, Grunow R, Liesegang H. 2010. The genome of a *Bacillus* isolate causing anthrax in chimpanzees combines chromosomal properties of *B. cereus* with *B. anthracis* virulence plasmids. PLoS One 5:e10986. https://doi.org/10 .1371/journal.pone.0010986.
- Carroll LM, Kovac J, Miller RA, Wiedmann M. 2017. Rapid, highthroughput identification of anthrax-causing and emetic *Bacillus cereus* group genome assemblies using BTyper, a computational tool for

virulence-based classification of *Bacillus cereus* group isolates using nucleotide sequencing data. Appl Environ Microbiol 83:e01096-17. https://doi.org/10.1128/AEM.01096-17.

- 32. Guinebretiere MH, Auger S, Galleron N, Contzen M, De Sarrau B, De Buyser ML, Lamberet G, Fagerlund A, Granum PE, Lereclus D, De Vos P, Nguyen-The C, Sorokin A. 2013. *Bacillus cytotoxicus* sp. nov. is a novel thermotolerant species of the *Bacillus cereus* group occasionally associated with food poisoning. Int J Syst Evol Microbiol 63:31–40. https://doi.org/10.1099/ijs.0.030627-0.
- 33. Jiménez G, Urdiain M, Cifuentes A, López-López A, Blanch AR, Tamames J, Kämpfer P, Kolstø A-B, Ramón D, Martínez JF, Codoñer FM, Rosselló-Móra R. 2013. Description of *Bacillus toyonensis* sp. nov., a novel species of the *Bacillus cereus* group, and pairwise genome comparisons of the species of the group by means of ANI calculations. Syst Appl Microbiol 36:383–391. https://doi.org/10.1016/j.syapm.2013.04.008.
- Miller RA, Beno SM, Kent DJ, Carroll LM, Martin NH, Boor KJ, Kovac J. 2016. Bacillus wiedmannii sp. nov., a psychrotolerant and cytotoxic Bacillus cereus group species isolated from dairy foods and dairy environments. Int J Syst Evol Microbiol 66:4744–4753. https://doi.org/10 .1099/ijsem.0.001421.
- Liu Y, Du J, Lai Q, Zeng R, Ye D, Xu J, Shao Z. 2017. Proposal of nine novel species of the *Bacillus cereus* group. Int J Syst Evol Microbiol 67: 2499–2508. https://doi.org/10.1099/ijsem.0.001821.
- Ehling-Schulz M, Frenzel E, Gohar M. 2015. Food-bacteria interplay: pathometabolism of emetic *Bacillus cereus*. Front Microbiol 6:704. https://doi.org/ 10.3389/fmicb.2015.00704.
- Ehling-Schulz M, Svensson B, Guinebretiere MH, Lindback T, Andersson M, Schulz A, Fricker M, Christiansson A, Granum PE, Martlbauer E, Nguyen-The C, Salkinoja-Salonen M, Scherer S. 2005. Emetic toxin formation of *Bacillus cereus* is restricted to a single evolutionary lineage of closely related strains. Microbiology 151:183–197. https://doi.org/10 .1099/mic.0.27607-0.
- Ehling-Schulz M, Fricker M, Scherer S. 2004. Bacillus cereus, the causative agent of an emetic type of food-borne illness. Mol Nutr Food Res 48:479–487. https://doi.org/10.1002/mnfr.200400055.
- Carroll LM, Wiedmann M, Mukherjee M, Nicholas DC, Mingle LA, Dumas NB, Cole JA, Kovac J. 2019. Characterization of emetic and diarrheal *Bacillus cereus* strains from a 2016 foodborne outbreak using wholegenome sequencing: addressing the microbiological, epidemiological, and bioinformatic challenges. Front Microbiol 10:144. https://doi.org/10 .3389/fmicb.2019.00144.
- Marston CK, Ibrahim H, Lee P, Churchwell G, Gumke M, Stanek D, Gee JE, Boyer AE, Gallegos-Candela M, Barr JR, Li H, Boulay D, Cronin L, Quinn CP, Hoffmaster AR. 2016. Anthrax toxin-expressing *Bacillus cereus* isolated from an anthrax-like eschar. PLoS One 11:e0156987. https://doi .org/10.1371/journal.pone.0156987.
- 41. Antonation KS, Grutzmacher K, Dupke S, Mabon P, Zimmermann F, Lankester F, Peller T, Feistner A, Todd A, Herbinger I, de Nys HM, Muyembe-Tamfun JJ, Karhemere S, Wittig RM, Couacy-Hymann E, Grunow R, Calvignac-Spencer S, Corbett CR, Klee SR, Leendertz FH. 2016. *Bacillus cereus* biovar anthracis causing anthrax in sub-Saharan Africa chromosomal monophyly and broad geographic distribution. PLoS Negl Trop Dis 10:e0004923. https://doi.org/10.1371/journal.pntd.0004923.
- 42. Wilson MK, Vergis JM, Alem F, Palmer JR, Keane-Myers AM, Brahmbhatt TN, Ventura CL, O'Brien AD. 2011. *Bacillus cereus* G9241 makes anthrax toxin and capsule like highly virulent *B. anthracis* Ames but behaves like attenuated toxigenic nonencapsulated *B. anthracis* Sterne in rabbits and mice. Infect Immun 79:3012–3019. https://doi.org/10.1128/IAI.00205-11.
- Mikesell P, Ivins BE, Ristroph JD, Dreier TM. 1983. Evidence for plasmidmediated toxin production in *Bacillus anthracis*. Infect Immun 39: 371–376. https://doi.org/10.1128/IAI.39.1.371-376.1983.
- Liu Y, Lai Q, Shao Z. 2018. Genome analysis-based reclassification of Bacillus weihenstephanensis as a later heterotypic synonym of Bacillus mycoides. Int J Syst Evol Microbiol 68:106–112. https://doi.org/10.1099/ ijsem.0.002466.
- 45. Dai Z, Sirard JC, Mock M, Koehler TM. 1995. The *atxA* gene product activates transcription of the anthrax toxin genes and is essential for virulence. Mol Microbiol 16:1171–1181. https://doi.org/10.1111/j.1365 -2958.1995.tb02340.x.
- Rodriguez RL, Gunturu S, Harvey WT, Rossello-Mora R, Tiedje JM, Cole JR, Konstantinidis KT. 2018. The Microbial Genomes Atlas (MiGA) webserver: taxonomic and gene diversity analysis of Archaea and Bacteria at the whole genome level. Nucleic Acids Res 46:W282–W288. https://doi.org/ 10.1093/nar/gky467.

- 47. Vergnaud G, Girault G, Thierry S, Pourcel C, Madani N, Blouin Y. 2016. Comparison of French and worldwide *Bacillus anthracis* strains favors a recent, post-Columbian origin of the predominant North-American clade. PLoS One 11:e0146216. https://doi.org/10.1371/journal.pone .0146216.
- Sahl JW, Pearson T, Okinaka R, Schupp JM, Gillece JD, Heaton H, Birdsell D, Hepp C, Fofanov V, Noseda R, Fasanella A, Hoffmaster A, Wagner DM, Keim P. 2016. A *Bacillus anthracis* genome sequence from the Sverdlovsk 1979 autopsy specimens. mBio 7:e01501-16. https://doi.org/10.1128/ mBio.01501-16.
- Agata N, Mori M, Ohta M, Suwan S, Ohtani I, Isobe M. 1994. A novel dodecadepsipeptide, cereulide, isolated from *Bacillus cereus* causes vacuole formation in HEp-2 cells. FEMS Microbiol Lett 121:31–34. https:// doi.org/10.1111/j.1574-6968.1994.tb07071.x.
- Hoton FM, Fornelos N, N'guessan E, Hu X, Swiecicka I, Dierick K, Jääskeläinen E, Salkinoja-Salonen M, Mahillon J. 2009. Family portrait of *Bacillus cereus* and *Bacillus weihenstephanensis* cereulide-producing strains. Environ Microbiol Rep 1:177–183. https://doi.org/10.1111/j.1758-2229.2009 .00028.x.
- Johler S, Kalbhenn EM, Heini N, Brodmann P, Gautsch S, Bağcioğlu M, Contzen M, Stephan R, Ehling-Schulz M. 2018. Enterotoxin production of *Bacillus thuringiensis* isolates from biopesticides, foods, and outbreaks. Front Microbiol 9:1915. https://doi.org/10.3389/fmicb.2018.01915.
- Lazarte JN, Lopez RP, Ghiringhelli PD, Beron CM. 2018. Bacillus wiedmannii biovar thuringiensis: a specialized mosquitocidal pathogen with plasmids from diverse origins. Genome Biol Evol 10:2823–2833. https:// doi.org/10.1093/gbe/evy211.
- Acevedo MM, Carroll LM, Mukherjee M, Mills E, Xiaoli L, Dudley EG, Kovac J. 2019. *Bacillus clarus* sp. nov. is a new *Bacillus cereus* group species isolated from soil bioRxiv 508077. https://doi.org/10.1101/508077.
- Chattaway MA, Schaefer U, Tewolde R, Dallman TJ, Jenkins C. 2017. Identification of *Escherichia coli* and *Shigella* species from whole-genome sequences. J Clin Microbiol 55:616–623. https://doi.org/10.1128/JCM .01790-16.
- Sahl JW, Morris CR, Emberger J, Fraser CM, Ochieng JB, Juma J, Fields B, Breiman RF, Gilmour M, Nataro JP, Rasko DA. 2015. Defining the phylogenomics of *Shigella* species: a pathway to diagnostics. J Clin Microbiol 53:951–960. https://doi.org/10.1128/JCM.03527-14.
- Baek I, Lee K, Goodfellow M, Chun J. 2019. Comparative genomic and phylogenomic analyses clarify relationships within and between *Bacillus cereus* and *Bacillus thuringiensis*: Proposal for the recognition of two *Bacillus thuringiensis* genomovars. Front Microbiol 10:1978. https://doi .org/10.3389/fmicb.2019.01978.
- 57. Uchida I, Makino S, Sekizaki T, Terakado N. 1997. Cross-talk to the genes for *Bacillus anthracis* capsule synthesis by *atxA*, the gene encoding the trans-activator of anthrax toxin synthesis. Mol Microbiol 23:1229–1240. https://doi.org/10.1046/j.1365-2958.1997.3041667.x.
- Doll VM, Ehling-Schulz M, Vogelmann R. 2013. Concerted action of sphingomyelinase and non-hemolytic enterotoxin in pathogenic *Bacillus cereus*. PLoS One 8:e61404. https://doi.org/10.1371/journal.pone.0061404.
- Pruitt KD, Tatusova T, Maglott DR. 2007. NCBI reference sequences (RefSeq): a curated non-redundant sequence database of genomes, transcripts and proteins. Nucleic Acids Res 35:D61–D65. https://doi.org/ 10.1093/nar/gkl842.
- Liu B, Liu G-H, Hu G-P, Sengonca C, Cetin S, Lin N-Q, Tang J-Y, Tang W-Q, Lin Y-Z. 2014. *Bacillus bingmayongensis* sp. nov., isolated from the pit soil of Emperor Qin's terra-cotta warriors in China. Antonie Van Leeuwenhoek 105:501–510. https://doi.org/10.1007/s10482-014-0150-3.
- Jung MY, Paek WK, Park I-S, Han J-R, Sin Y, Paek J, Rhee M-S, Kim H, Song HS, Chang Y-H. 2010. *Bacillus gaemokensis* sp. nov., isolated from foreshore tidal flat sediment from the Yellow Sea. J Microbiol 48:867–871. https://doi.org/10.1007/s12275-010-0148-0.
- Jung MY, Kim JS, Paek WK, Lim J, Lee H, Kim PI, Ma JY, Kim W, Chang YH. 2011. *Bacillus manliponensis* sp. nov., a new member of the *Bacillus cereus* group isolated from foreshore tidal flat sediment. J Microbiol 49:1027–1032. https://doi.org/10.1007/s12275-011-1049-6.
- Gurevich A, Saveliev V, Vyahhi N, Tesler G. 2013. QUAST: quality assessment tool for genome assemblies. Bioinformatics 29:1072–1075. https://doi.org/10.1093/bioinformatics/btt086.
- Kovac J, Miller RA, Carroll LM, Kent DJ, Jian J, Beno SM, Wiedmann M. 2016. Production of hemolysin BL by *Bacillus cereus* group isolates of

dairy origin is associated with whole-genome phylogenetic clade. BMC Genomics 17:581. https://doi.org/10.1186/s12864-016-2883-z.

- Seemann T. 2014. Prokka: rapid prokaryotic genome annotation. Bioinformatics 30:2068–2069. https://doi.org/10.1093/bioinformatics/btu153.
- 66. Ye W, Zhu L, Liu Y, Crickmore N, Peng D, Ruan L, Sun M. 2012. Mining new crystal protein genes from *Bacillus thuringiensis* on the basis of mixed plasmid-enriched genome sequencing and a computational pipeline. Appl Environ Microbiol 78:4795–4801. https://doi.org/10.1128/AEM .00340-12.
- Wood DE, Salzberg SL. 2014. Kraken: ultrafast metagenomic sequence classification using exact alignments. Genome Biol 15:R46. https://doi .org/10.1186/gb-2014-15-3-r46.
- Wood DE, Lu J, Langmead B. 2019. Improved metagenomic analysis with Kraken 2. bioRxiv 762302. https://doi.org/10.1101/762302.
- R Core Team. 2018. R: a language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, Austria. https:// www.R-project.org/.
- 70. Wickham H. 2007. Reshaping data with the reshape package. J Stat Softw 21:1–20.
- Wickham H. 2009. Ggplot2: elegant graphics for data analysis. Springer, New York, NY.
- 72. Galili T. 2015. dendextend: an R package for visualizing, adjusting and comparing trees of hierarchical clustering. Bioinformatics 31:3718–3720. https://doi.org/10.1093/bioinformatics/btv428.
- Garnier S. 2018. viridis: default color maps from 'matplotlib', vR package version 0.5.1. https://CRAN.R-project.org/package=viridis.
- Maechler M, Rousseeuw P, Struyf A, Hubert M, Hornik K. 2017. cluster: cluster analysis basics and extensions, v2.0.6.
- 75. Csardi G, Nepusz T. 2006. The igraph software package for complex network research. InterJournal Complex Systems:1695.
- Emms DM, Kelly S. 2015. OrthoFinder: solving fundamental biases in whole genome comparisons dramatically improves orthogroup inference accuracy. Genome Biol 16:157. https://doi.org/10.1186/s13059-015 -0721-2.
- Loytynoja A. 2014. Phylogeny-aware alignment with PRANK. Methods Mol Biol 1079:155–170. https://doi.org/10.1007/978-1-62703-646-7\_10.
- Page AJ, Taylor B, Delaney AJ, Soares J, Seemann T, Keane JA, Harris SR. 2016. SNP-sites: rapid efficient extraction of SNPs from multi-FASTA alignments. Microb Genom 2:e000056. https://doi.org/10.1099/mgen.0 .000056.
- Nguyen LT, Schmidt HA, von Haeseler A, Minh BQ. 2015. IQ-TREE: a fast and effective stochastic algorithm for estimating maximum-likelihood phylogenies. Mol Biol Evol 32:268–274. https://doi.org/10.1093/molbev/ msu300.
- Tavare S. 1986. Some probabilistic and statistical problems in the analysis of DNA sequences. Lect Math Life Sci 17:57–86.
- Yang Z. 1994. Maximum likelihood phylogenetic estimation from DNA sequences with variable rates over sites: approximate methods. J Mol Evol 39:306–314. https://doi.org/10.1007/bf00160154.
- Lewis PO. 2001. A likelihood approach to estimating phylogeny from discrete morphological character data. Syst Biol 50:913–925. https://doi .org/10.1080/106351501753462876.
- Hoang DT, Chernomor O, von Haeseler A, Minh BQ, Vinh LS. 2018. UFBoot2: improving the ultrafast bootstrap approximation. Mol Biol Evol 35:518–522. https://doi.org/10.1093/molbev/msx281.
- Paradis E, Schliep K. 2019. ape 5.0: an environment for modern phylogenetics and evolutionary analyses in R. Bioinformatics 35:526–528. https://doi.org/10.1093/bioinformatics/bty633.
- Revell LJ. 2012. phytools: an R package for phylogenetic comparative biology (and other things). Methods Ecol Evol 3:217–223. https://doi .org/10.1111/j.2041-210X.2011.00169.x.
- R Hackathon. 2017. phylobase: base package for phylogenetic structures and comparative data, v0.8.4. https://CRAN.R-project.org/package= phylobase.
- Yu G, Smith DK, Zhu H, Guan Y, Lam T. 2017. ggtree: an R package for visualization and annotation of phylogenetic trees with their covariates and other associated data. Methods Ecol Evol 8:28–36. https://doi.org/ 10.1111/2041-210X.12628.
- Schliep KP. 2011. phangorn: phylogenetic analysis in R. Bioinformatics 27:592–593. https://doi.org/10.1093/bioinformatics/btq706.