# 1 The *Clostridioides difficile* species problem: global phylogenomic 2 analysis uncovers three ancient, toxigenic, genomospecies

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#### 26 Abstract

27 *Clostridioides difficile* infection (CDI) remains an urgent global One Health threat. The genetic 28 heterogeneity seen across C. difficile underscores its wide ecological versatility and has driven the 29 significant changes in CDI epidemiology seen in the last 20 years. We analysed an international 30 collection of over 12,000 C. difficile genomes spanning the eight currently defined phylogenetic 31 clades. Through whole-genome average nucleotide identity, pangenomic and Bayesian analyses, we 32 identified major taxonomic incoherence with clear species boundaries for each of the recently 33 described cryptic clades CI-III. The emergence of these three novel genomospecies predates clades 34 C1-5 by millions of years, rewriting the global population structure of C. difficile specifically and taxonomy of the *Peptostreptococcaceae* in general. These genomospecies all show unique and highly 35 36 divergent toxin gene architecture, advancing our understanding of the evolution of C. difficile and 37 close relatives. Beyond the taxonomic ramifications, this work impacts the diagnosis of CDI 38 worldwide.

39

#### 40 Introduction

41 The bacterial species concept remains controversial, yet it serves as a critical framework for all

- 42 aspects of modern microbiology<sup>1</sup>. The prevailing species definition describes a genomically coherent
- 43 group of strains sharing high similarity in many independent phenotypic and ecological properties<sup>2</sup>.
- 44 The era of whole-genome sequencing (WGS) has seen average nucleotide identity (ANI) replace
- 45 DNA-DNA hybridization as the 'next-generation' standard for microbial taxonomy<sup>3, 4</sup>. Endorsed by
- 46 the National Center for Biotechnology Information (NCBI)<sup>4</sup>, ANI provides a precise, objective and
- 47 scalable method for delineation of species, defined as monophyletic groups of strains with genomes
- 48 that exhibit at least 96%  $ANI^{5, 6}$ .

49 *Clostridioides (Clostridium) difficile* is an important gastrointestinal pathogen that places a 50 significant growing burden on health care systems in many regions of the world<sup>7</sup>. In both its 2013<sup>8</sup> 51 and 2019<sup>9</sup> reports on antimicrobial resistance (AMR), the US Centers for Disease Control and 52 Prevention rated *C. difficile* infection (CDI) as an urgent health threat, the highest level. Community-53 associated CDI has become more frequent<sup>7</sup>, likely because *C. difficile* has become established in 54 livestock worldwide, resulting in significant environmental contamination<sup>10</sup>. Thus, over the last two 55 decades, CDI has emerged as an important One Health issue<sup>10</sup>.

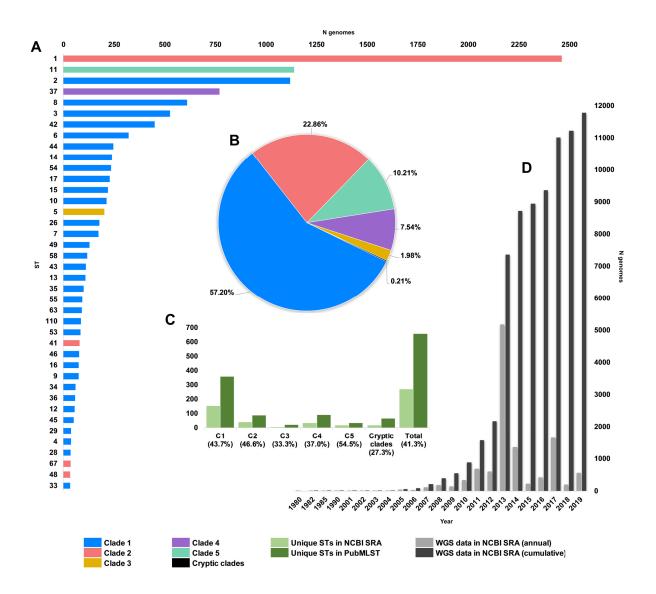
Based on multi-locus sequence type (MLST), there are eight recognised monophyletic groups 56 or 'clades' of C. difficile<sup>11</sup>. Strains within these clades show many unique clinical, microbiological 57 58 and ecological features<sup>11</sup>. Critical to the pathogenesis of CDI is the expression of the large clostridial 59 toxins, TcdA and TcdB and, in some strains, binary toxin (CDT), encoded by two separate chromosomal loci, the PaLoc and CdtLoc, respectively<sup>12</sup>. Clade 1 (C1) contains over 200 toxigenic 60 and non-toxigenic sequence types (STs) including many of the most prevalent strains causing CDI 61 62 worldwide e.g. ST2, ST8, and ST17<sup>11</sup>. Several highly virulent CDT-producing strains, including ST1 63 (PCR ribotype (RT) 027), a lineage associated with major hospital outbreaks in North America, Europe and Latin America<sup>13</sup>, are found in clade 2 (C2). Comparatively little is known about clade 3 64 65 (C3) although it contains ST5 (RT 023), a toxigenic CDT-producing strain with characteristics that may make laboratory detection difficult<sup>14</sup>. C. difficile ST37 (RT 017) is found in clade 4 (C4) and, 66 67 despite the absence of a toxin A gene, is responsible for much of the endemic CDI burden in Asia<sup>15</sup>. Clade 5 (C5) contains several CDT-producing strains including ST11 (RTs 078, 126 and others), 68 which are highly prevalent in production animals worldwide<sup>16</sup>. The remaining so-called 'cryptic' 69 clades (C-I, C-II and C-III), first described in 2012<sup>17, 18</sup>, contain over 50 STs from clinical and 70 environmental sources<sup>17, 18, 19, 20, 21</sup>. Evolution of the cryptic clades is poorly understood. Clade C-I 71 72 strains can cause CDI, however, due to atypical toxin gene architecture, they may not be detected, 73 thus their prevalence may have been underestimated<sup>21</sup>.

There are over 600 STs currently described and some STs may have access to a gene pool in excess of 10,000 genes<sup>11, 16, 22</sup>. Considering such enormous diversity, and recent contentious taxonomic revisions<sup>23, 24</sup>, we hypothesise that *C. difficile* comprises a complex of distinct species divided along the major evolutionary clades. In this study, whole-genome ANI, and pangenomic and Bayesian analyses are used to explore an international collection of over 12,000 *C. difficile* genomes, to provide new insights into ancestry, genetic diversity and evolution of pathogenicity in this enigmatic pathogen.

#### 81 **Results**

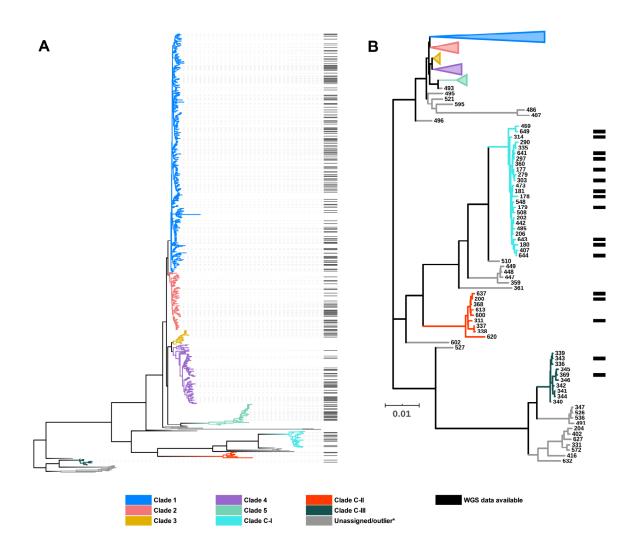
82 An updated global population structure based on sequence typing of 12,000 genomes. We 83 obtained and determined the ST and clade for a collection of 12,621 C. difficile genomes (taxid ID 84 1496, Illumina data) existing in the NCBI Sequence Read Archive (SRA) as of 1<sup>st</sup> January 2020. A 85 total of 272 STs were identified spanning the eight currently described clades, indicating that the SRA 86 contains genomes for almost 40% of known C. difficile STs worldwide (n=659, PubMLST, January 87 2020). C1 STs dominated the database in both prevalence and diversity (Fig. 1) with 149 C1 STs 88 comprising 57.2% of genomes, followed by C2 (35 STs, 22.9%), C5 (18 STs, 10.2%), C4 (34 STs, 7.5%), C3 (7 STs, 2.0%) and the cryptic clades C-I, C-II and C-III (collectively 17 STs, 0.2%). The 89 90 five most prevalent STs represented were ST1 (20.9% of genomes), ST11 (9.8%), ST2 (9.5%), ST37 91 (6.5%) and ST8 (5.2%), all prominent lineages associated with CDI worldwide<sup>11</sup>. 92 Fig. 2 shows an updated global C. difficile population structure based on the 659 STs; 27 93 novel STs were found (an increase of 4%) and some corrections to assignments within C1 and C2 were made, including assigning ST122<sup>25</sup> to C1. Based on PubMLST data and bootstraps values of 94 95 1.0 in all monophyletic nodes of the cryptic clades (Fig. 2), we could confidently assign 25, 9 and 10 96 STs to cryptic clades I, II and III, respectively. There remained 26 STs spread across the phylogeny 97 that did not fit within a specific clade (defined as outliers). The tree file for Fig. 2 and full MLST data

98 is available as **Supplementary Data** at <u>http://doi.org/10.6084/m9.figshare.12471461</u>.



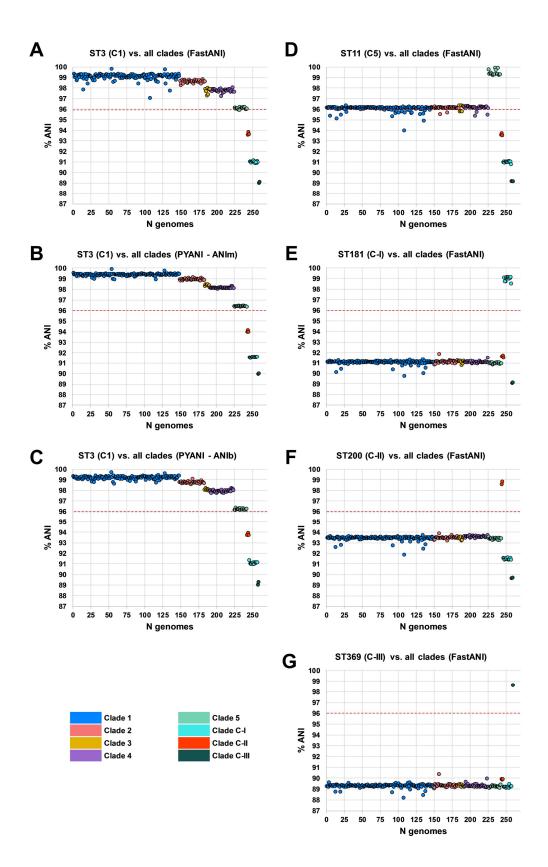
**Figure 1. Composition of** *C. difficile* **genomes in the NCBI SRA.** Snapshot obtained 1<sup>st</sup> January 2020; 12,304 strains, [taxid ID 1496]. (A) Top 40 most prevalent STs in the NCBI SRA coloured by clade. (B) The proportion of genomes in ENA by clade. (C) Number/ proportion of STs per clade found in the SRA/present in the PubMLST database. (D) Annual and cumulative deposition of *C. difficile* genome data in ENA.

Whole-genome ANI analysis reveals clear species boundaries. Whole-genome ANI analyses were used to investigate genetic discontinuity across the *C. difficile* species (Fig. 3 and Supplementary Data). Representative genomes of each ST, chosen based on metadata, read depth and quality, were assembled and annotated. Whole-genome ANI values were determined for a final set of 260 STs using three independent ANI algorithms (FastANI, ANIm and ANIb, see *Methods*). All 225 genomes belonging to clades C1-4 clustered within an ANI range of 97.1-99.8% (median FastANI values of 99.2, 98.7, 97.9 and 97.8%, respectively, Fig. 3A-C).



**Figure 2.** *C. difficile* **population structure.** (A) NJ phylogeny of 659 aligned, concatenated, multilocus sequence type allele combinations coloured by current PubMLST clade assignment. Black bars indicate WGS available for ANI analysis (n=260). (B) A subset of the NJ tree showing cryptic clades C-I, C-II and C-III. Again, black bars indicate WGS available for ANI analysis (n=17).

106 These ANI values are above the 96% species demarcation threshold used by the NCBI<sup>4</sup> and indicate that strains from these clades belong to the same species. ANI values for all 18 genomes belonging 107 108 to C5 clustered on the borderline of the species demarcation threshold (FastANI range 95.9-96.2%, 109 median 96.1%). ANI values for all three cryptic clades fell well below the species threshold; C-I 110 (FastANI range 90.9-91.1%, median 91.0%), C-II (FastANI range 93.6-93.9%, median 93.7%) and 111 C-III (FastANI range 89.1-89.1%, median 89.1%). All results were corroborated across the three 112 independent ANI algorithms (Fig. 3A-C). C. difficile strain ATCC 9689 (ST3, C1) was defined by Lawson *et al.* as the type strain for the species<sup>23</sup>, and used as a reference in all the above analyses. To 113 better understand the diversity among the divergent clades themselves, FastANI analyses were 114 115 repeated using STs 11, 181, 200 and 369 as reference archetypes of clades C5, C-I, C-II and C-III, 116 respectively. This approach confirmed that C5 and the three cryptic clades were as distinct from each 117 other as they were collectively from C1-4 (Fig. 3D-G).



**Figure 3. Species-wide ANI analysis.** Panels **A-C** show ANI plots for ST3 (C1) vs. all clades (260 STs) using FastANI, ANIm and ANIb algorithms, respectively. Panels **D-G** show ANI plots for ST11 (C5), ST181 (C-I), ST200 (C-II) and ST369 (C-III) vs all clades (260 STs), respectively. NCBI species demarcation of 96% indicated by red dashed line<sup>4</sup>.

#### 118 Taxonomic placement of cryptic clades predates C. difficile emergence by millions of years.

119 Previous studies using BEAST have estimated the common ancestor of C1-5 existed between 1 to 85

or 12 to 14 million years ago (mya)<sup>26, 27</sup>. Here, we used an alternative Bayesian approach, BactDating, 120

to estimate the age of all eight C. difficile clades currently described. The last common ancestor for 121

122 C. difficile clades C1-5 was estimated to have existed ~3.89 mya with a 95% credible interval (CI) of

- 123 1.11 to 6.71 mya (Fig. 4). In contrast, C-II, C-I and C-III emerged 13.05 mya (95% CI 3.72-22.44),
- 124 22.02 (95% CI 6.28-37.83) and 47.61 mya (95% CI 13.58-81.73), respectively, at least 9 million years
- 125 (Megaannum, Ma) before the common ancestor of C1-5. Independent analysis with BEAST, using a smaller core gene dataset (see *Methods*), provided broader estimates of clade emergence, though the
- 126 127
- emergence order was maintained; C1-5 12.01 mya (95% CI 6.80-33.47), C-II 37.12 mya (95% CI
- 128 20.95-103.48), C-I 65.93 mya (95% CI 37.32-183.84) and C-III 142.13 mya (95% CI 79.77-397.18)
- 129 (Fig. 4).

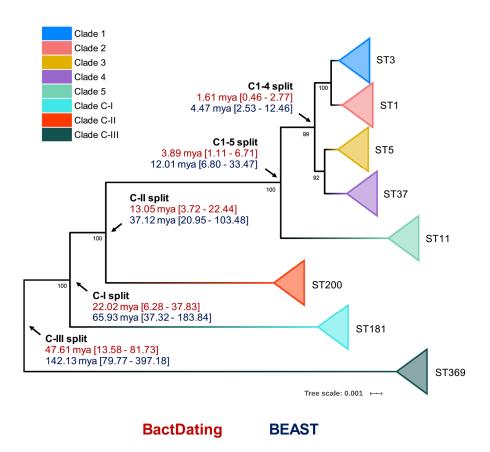


Figure 4. Bayesian analysis of species and clade divergence. BactDating and BEAST estimates of the age of major C. difficile clades. Node dating ranges for both Bayesian approaches are transposed onto an ML phylogeny built from concatenated MLST alleles of a dozen STs from each clade. Archetypal STs in each evolutionary clade are indicated. The tree is midpoint rooted and bootstrap values are shown. Scale bar indicates the number of substitutions per site. BactDating places the time of most recent common ancestor of C1-5 at 3.89 million years ago (mya) [95% credible interval (CI), 1.11-6.71 mya]. Of the cryptic clades, C-II shared the most recent common ancestor with C1-5 13.05 mya [95% CI 3.72-22.44 mya], followed by C-I (22.02 mya [95% CI 6.28-37.83 mya]), and C-III (47.61 mya [95% CI 13.58-81.73 mya]). Comparative estimates from BEAST are clades C1-5 (12.01 mya [95% CI 6.80-33.47 mya]), C-II (37.12 mya [95% CI 20.95-103.48 mya]), C-I (65.93 mya [95% CI 37.32-183.84 mya]), and C-III (142.13 [95% CI 79.77-397.18 mya]).

Next, to identify their true taxonomic placement, ANI was determined for ST181 (C-I), ST200 (C-II)
 and ST369 (C-III) against two reference datasets. The first dataset comprised 25 species belonging to

132 the *Peptostreptococcaceae* as defined by Lawson *et al.*<sup>23</sup> in their 2016 reclassification of *Clostridium* 

133 *difficile* to *Clostridioides difficile*. The second dataset comprised 5.895 complete genomes across 21

phyla from the NCBI RefSeq database (accessed 14<sup>th</sup> January 2020), including 1,366 genomes

belonging to *Firmicutes*, 92 genomes belonging to 15 genera within the *Clostridiales* and 20

136 Clostridium and Clostridioides species. The nearest ANI matches to species within the

- 137 *Peptostreptococcaceae* dataset were *C. difficile* (range 89.3-93.5% ANI), *Asaccharospora irregularis*
- 138 (78.9-79.0% ANI) and *Romboutsia lituseburensis* (78.4-78.7% ANI). Notably, *Clostridioides*
- 139 *mangenotii*, the only other known member of *Clostridioides*, shared only 77.2-77.8% ANI with the
- 140 cryptic clade genomes (**Table 1**).

141 Similarly, the nearest ANI matches to species within the RefSeq dataset were several 142 C. difficile strains (range C-I: 90.9-91.1%; C-II: 93.4-93.6%; and C-III: 89.2-89.4%) and 143 Paeniclostridium sordellii (77.7-77.9%). A low ANI (range  $\leq$ 70-75%) was observed between the 144 cryptic clade genomes and 20 members of the Clostridium including C. tetani, C. botulinum, 145 C. perfringens and C. butyricum, the type strain of the Clostridium genus senso stricto. An updated 146 ANI-based taxonomy for the *Peptostreptococcaceae* is shown in **Fig. 5A**. The phylogeny places C-I, 147 C-II and C-III between C. mangenotii and C. difficile C1-5, suggesting that they should be assigned 148 to the *Clostridioides* genus, distinct from both *C. mangenotii* and *C. difficile*. Comparative analysis 149 of ANI and 16S rRNA values for the eight C. difficile clades and C. mangenotii shows significant 150 incongruence between the data generated by the two approaches (Fig. 5B). The range of 16S rRNA % similarity between C. difficile C1-4, cryptic clades I-III and C. mangenotii was narrower (range 151

152 94.5-100) compared to the range of ANI values (range 77.8-98.7).

153	Table 1 Whole-genome ANI analysis of cryptic clades vs. 25 Peptostreptococcaceae species
154	from Lawson <i>et al</i> <sup>23</sup> .

Species	NCRI accession		ANI %		
Species	NCBI accession	ST181 (C-I)	ST200 (C-II)	ST369 (C-III)	
Clostridioides difficile (ST3)	AQWV0000000.1	91.11	93.54	89.30	
Asaccharospora irregularis	NZ_FQWX0000000	78.94	78.87	78.91	
Romboutsia lituseburensis	NZ_FNGW0000000.1	78.51	78.36	78.66	
Romboutsia ilealis	LN555523.1	78.45	78.54	78.44	
Paraclostridium benzoelyticum	NZ_LBBT0000000.1	77.92	77.71	78.14	
Paraclostridium bifermentans	NZ_AVNC0000000.1	77.89	77.89	78.06	
Clostridium mangenotii	GCA_000687955.1	77.82	77.84	78.15	
Paeniclostridium sordellii	NZ_APWR0000000.1	77.73	77.59	77.86	
Clostridium hiranonis	NZ_ABWP01000000	77.52	77.42	77.59	
Terrisporobacter glycolicus	NZ_AUUB0000000.1	77.47	77.53	77.53	
Intestinibacter bartlettii	NZ_ABEZ0000000.2	77.29	77.52	77.48	
Clostridium paradoxum	NZ_LSFY0000000.1	76.60	76.65	76.93	
Clostridium thermoalcaliphilum	NZ_MZGW0000000.1	76.49	76.61	76.85	
Tepidibacter formicigenes	NZ_FRAE0000000.1	76.41	76.47	76.38	
Tepidibacter mesophilus	NZ_BDQY0000000.1	76.38	76.44	76.22	
Tepidibacter thalassicus	NZ_FQXH0000000.1	76.34	76.31	76.46	
Peptostreptococcus russellii	NZ_JYGE0000000.1	76.30	76.08	76.38	
Clostridium formicaceticum	NZ_CP020559.1	75.18	75.26	75.62	
Clostridium caminithermale	FRAG0000000	74.97	75.07	75.03	
Clostridium aceticum	NZ_JYHU0000000.1	≤70.00	≤70.00	≤70.00	
Clostridium litorale	FSRH0100000	≤70.00	≤70.00	≤70.00	
Eubacterium acidaminophilum	NZ_CP007452.1	≤70.00	≤70.00	≤70.00	
Filifactor alocis	NC_016630.1	≤70.00	≤70.00	≤70.00	
Peptostreptococcus anaerobius	ARMA01000000	≤70.00	≤70.00	≤70.00	
Peptostreptococcus stomatis	NZ_ADGQ0000000.1	≤70.00	≤70.00	≤70.00	

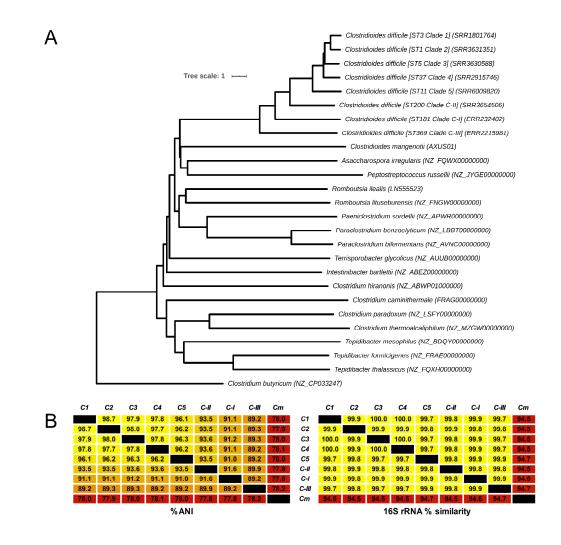
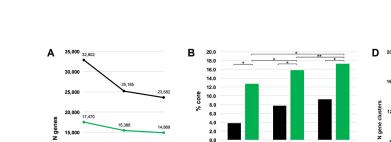


Figure 5. Revised taxonomy for the *Peptostreptococcaceae*. (A) ANI-based minimum evolution tree showing evolutionary relationship between eight *C. difficile* 'clades' along with 17 members of the *Peptostreptococcaceae* (from Lawson *et al*<sup>23</sup>) as well as *Clostridium butyricum* as the outgroup and type strain of the *Clostridium* genus *senso stricto*. To convert the ANI into a distance, its complement to 1 was taken. (B) Matrices showing pairwise ANI and 16S rRNA values for the eight *C. difficile* clades and *C. mangenotii*, the only other known member of *Clostridioides*.

Evolutionary and ecological insights from the C. difficile species pangenome. Next, we sought to 155 quantify the C. difficile species pangenome and identify genetic loci that are significantly associated 156 157 with the taxonomically divergent clades. With Panaroo, the C. difficile species pangenome comprised 158 17,470 genes, encompassing an accessory genome of 15,238 genes and a core genome of 2,232 genes, just 12.8% of the total gene repertoire (Fig 6). The size of the pangenome reduced by 2,082 genes 159 160 with the exclusion of clades CI-III, and a further 519 genes with the exclusion of C5. Compared to Panaroo, Roary overestimated the size of the pangenome (32,802 genes), resulting in markedly 161 162 different estimates of the percentage core genome, 3.9 and 12.8%, respectively (p<0.00001). Panaroo can account for errors introduced during assembly and annotation, thus polishing the 260 Prokka-163 annotated genomes with Panaroo resulted in a significant reduction in gene content per genome 164 (median 2.48%; 92 genes, range 1.24-12.40%; 82-107 genes, p<0.00001). The C. difficile species 165 166 pangenome was determined to be  $open^{28}$  (Fig 6). 167 Pan-GWAS analysis with Scoary revealed 142 genes with significant clade specificity. Based

167 Pan-GwAS analysis with Scoary revealed 142 genes with significant clade specificity. Based 168 on KEGG orthology, these genes were classified into four functional categories: environmental

information processing (7), genetic information processing (39), metabolism (43), and signalling and
cellular processes (53). We identified several uniquely present, absent or organised gene clusters
associated with ethanolamine catabolism (C-III), heavy metal uptake (C-III), polyamine biosynthesis
(C-III), fructosamine utilisation (C-I, C-III), zinc transport (C-II, C5) and folate metabolism (C-I,
C5). A summary of the composition and function of these major lineage-specific gene clusters is
given in Table 2, and a comparative analysis of their respective genetic architecture can be found in
the Supplementary Data.



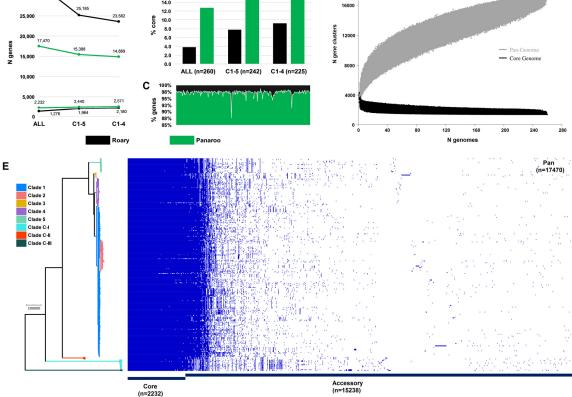
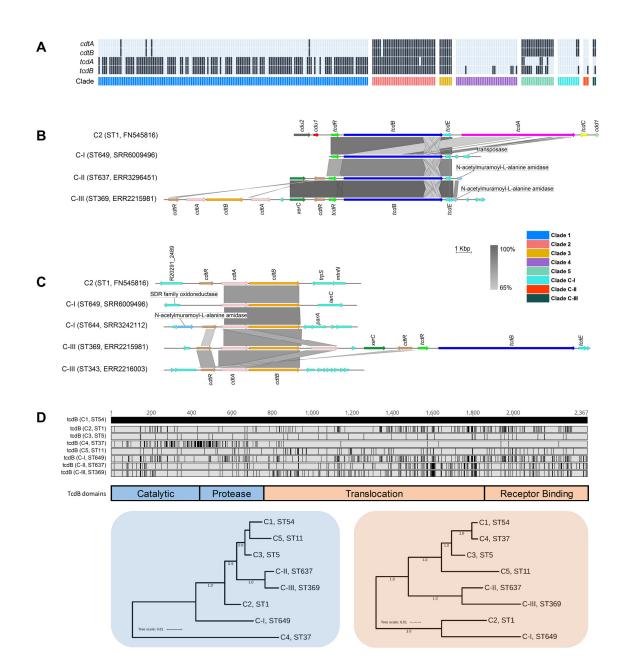


Figure 6. Clostridioides difficile species pangenome. (A) Pan and core genome estimates for all 260 STs, clades C1-4 (n=242 STs) and clades C1-5 (n=225 STs). (B) The difference in % core genome and pangenome sizes with Panaroo and Roary algorithms. (\*) indicates  $\chi^2 p < 0.00001$  and (\*\*) indicates  $\chi^2 p = 0.0008$ . (C) The proportion of retained genes per genome after polishing Prokka-annotated genomes with Panaroo. (D) The total number of genes in the pan (grey) and core (black) genomes are plotted as a function of the number of genomes sequentially added (n=260). Following the definition of Tettelin *et al.*<sup>28</sup>, the *C. difficile* species pangenome showed characteristics of an "open" pangenome. First, the pangenome increased in size exponentially with sampling of new genomes. At n=260, the pangenome exceeded more than double the average number of genes found in a single C. difficile genome ( $\sim$ 3,700) and the curve was yet to reach a plateau or exponentially decay, indicating more sequenced strains are needed to capture the complete species gene repertoire. Second, the number of new 'strain-specific' genes did not converge to zero upon sequencing of additional strains, at n=260, an average of 27 new genes were contributed to the gene pool. Finally, according to Heap's Law,  $\alpha$  values of  $\leq 1$  are representative of open pangenome. Rarefaction analysis of our pangenome curve using a power-law regression model based on Heap's Law<sup>28</sup> showed the pangenome was predicted to be open (*Bpan* ( $\approx \alpha^{28}$ ) = 0.47, curve fit, r<sup>2</sup>=0.999). (E) Presence absence variation (PAV) matrix for 260 C. difficile genomes is shown alongside a maximum-likelihood phylogeny built from a recombination-adjusted alignment of core genes from Panaroo (2,232 genes, 2,606,142 sites).

176 <b>T</b>	Fable 2 Maior	clade-specific gene	clusters identifie	d by pan-GWAS
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Protein	Gene	Clade specificity	Functional insights	
Ethanolamine kinase	ETNK, EKI	Unique to C-III and is in	An alternative process for the	
Agmatinase	speB	addition to the highly conserved <i>eut</i> cluster found in all lineages. Has a unique composition and includes six additional genes that are not present	breakdown of ethanolamine and its utilisation as a source of reduced nitrogen and carbon.	
1-propanol dehydrogenase	pduQ			
Ethanolamine utilization protein EutS	eutS			
Ethanolamine utilization protein EutP	eutP			
Ethanolamine ammonia-lyase large subunit	eutB	in the traditional CD630		
Ethanolamine ammonia-lyase small subunit	eutC	eut operon or any other		
Ethanolamine utilization protein EutL	eutL	non-C-III strains.		
Ethanolamine utilization protein EutM	eutM			
Acetaldehyde dehydrogenase	E1.2.1.10			
Putative phosphotransacetylase	K15024			
Ethanolamine utilization protein EutN	eutN			
Ethanolamine utilization protein EutQ	eutQ			
TfoX/Sxy family protein	-			
Iron complex transport system permease protein	ABC.FEV.P	Unique to C-III	Multicomponent transport	
Iron complex transport system ATP-binding protein	ABC.FEV.A		system with specificity for	
Iron complex transport system substrate-binding protein	ABC.FEV.S		chelating heavy metal ions.	
Hydrogenase nickel incorporation protein HypB	hypB			
Putative ABC transport system ATP-binding protein	yxdL			
Class I SAM-dependent methyltransferase	-			
Peptide/nickel transport system substrate-binding protein	ABC.PE.S			
Peptide/nickel transport system permease protein	ABC.PE.P			
Peptide/nickel transport system permease protein	ABC.PE.P1			
Peptide/nickel transport system ATP-binding protein	ddpD			
Oligopeptide transport system ATP-binding protein	oppF			
Class I SAM-dependent methyltransferase	-			
Heterodisulfide reductase subunit D [EC:1.8.98.1]	hdrD	Unique to C-III and is in	Alternative spermidine uptake	
CDP-L-myo-inositol myo-inositolphosphotransferase	dipps	addition to	processes which may play a ro	
Spermidine/putrescine transport system substrate-binding protein	ABC.SP.S	the highly conserved spermidine uptake cluster	in stress response to nutrient limitation. The additional cluste	
Spermidine/putrescine transport system permease protein	ABC.SP.P1	found in all other lineages.	has homologs in <i>Romboutsia</i> ,	
Spermidine/putrescine transport system permease protein	ABC.SP.P		Paraclostridium and	
Spermidine/putrescine transport system ATP-binding protein	potA		Paeniclostridium spp.	
Sigma -54 dependent transcriptional regulator	, gfrR	Present in all lineages	Mannose-type PTS system	
Fructoselysine/glucoselysine PTS system EIIB component	gfrB	except C-I. Cluster found	essential for utilisation of	
Mannose PTS system EIIA component	manXa	in a different genomic position in C-III.	fructosamines such as fructoselysine and	
Fructoselysine/glucoselysine PTS system EIIC component	gfrC		glucoselysine, abundant	
Fructoselysine/glucoselysine PTS system EIID component	gfrD		components of rotting fruit and	
SIS domain-containing protein	-		vegetable matter.	
Fur family transcriptional regulator, ferric uptake regulator	furB	Unique to C-II and C5	Associated with EDTA	
Zinc transport system substrate-binding protein	znuA		resistance in <i>E.coli</i> , helping the	
Fe-S-binding protein	yeiR		bacteria survive in Zn-depleted environment.	
Rrf2 family transcriptional regulator	-			
Putative signalling protein	-	Unique to C-I and C5 STs	In <i>E. coli</i> , AbgAB proteins	
Aminobenzoyl-glutamate utilization protein B	abgB	163, 280, and 386	enable uptake and cleavage of the folate catabolite p-	
MarR family transcriptional regulator	-		aminobenzoyl-glutamate, allowing the bacterium to survive on exogenous sources	

177Cryptic clades CI-III possessed highly divergent toxin gene architecture. Overall, 68.8%178(179/260) of STs harboured *tcdA* (toxin A) and/or *tcdB* (toxin B), indicating their ability to cause179CDI, while 67 STs (25.8%) harboured *cdtA/cdtB* (binary toxin). The most common genotype was180A+B+CDT<sup>-</sup> (113/187; 60.4%), followed by A+B+CDT+ (49/187; 26.2%), A-B+CDT+ (10/187; 5.3%),181A-B-CDT+ (8/187; 4.3%) and A-B+CDT<sup>-</sup> (7/187; 3.7%). Toxin gene content varied across clades182(C1, 116/149, 77.9%; C2, 35/35, 100.0%; C3, 7/7, 100.0%; C4, 6/34, 17.6%; C5, 18/18, 100.0%;183C-I, 2/12, 16.7%; C-III, 1/3, 33.3%; C-III, 2/2, 100.0%) (Fig. 7).



**Figure 7. Toxin gene analysis.** (A) Distribution of toxin genes across *C. difficile* clades (n=260 STs). Presence is indicated by black bars and absence by light blue bars. (B) Comparison of PaLoc architecture in the chromosome of strain R20291 (C2, ST1) and cognate chromosomal regions in genomes of cryptic STs 649 (C-I), 637 (C-II), and 369 (C-III). All three cryptic STs show atypical 'monotoxin' PaLoc structures, with the presence of syntenic *tcdR*, *tcdB*, and *tcdE*, and the absence of *tcdA*, *tcdC*, *cdd1* and *cdd2*. ST369 genome ERR2215981 shows colocalization of the PaLoc and CdtLoc, see below. (C) Comparison of CdtLoc architecture in the chromosome of strain R20291 (C2, ST1) and cognate chromosomal regions in genomes of cryptic STs 649/644 (C-I) and 343/369 (C-III). Several atypical CdtLoc features are observed; *cdtR* is absent in ST649, and an additional copy of *cdtA* is present in ST369, the latter comprising part of a CdtLoc co-located with the PaLoc. (D) Amino acid differences in TcdB among cryptic STs 649, 637, and 369 and reference strains from clades C1-5. Variations are shown as black lines relative to CD630 (C1, ST54). Phylogenies constructed from the catalytic and protease domains (in blue) and translocation and receptor-binding domains (in orange) of TcdB for the same eight STs included in (D). Scale bar shows the number of amino acid substitutions per site. Trees are mid-point rooted and supported by 500 bootstrap replicates.

Critically, at least one ST in each of clades C-I, C-II and C-III harboured divergent tcdB (89-94% 184 identity to  $tcdB_{R20291}$  and/or cdtAB alleles (60-71% identity to  $cdtA_{R20291}$ , 74-81% identity to 185 186  $cdtB_{R20291}$ ). These genes were located on atypical and novel PaLoc and CdtLoc structures flanked by 187 mediators of lateral gene transfer (Fig. 7). Sequence types 359, 360, 361 and 649 (C-I), 637 (C-II) and 369 (C-III) harboured 'monotoxin' PaLocs characterised by the presence of syntenic tcdR, tcdB 188 189 and tcdE, and complete absence of tcdA and tcdC. In STs 360 and 361 (C-I), and 637 (C-II), a gene 190 encoding an endolysin with predicted N-acetylmuramoyl-L-alanine amidase activity (cwlH) was 191 found adjacent to the phage-derived holin gene *tcdE*.

192 Remarkably, a full CdtLoc was found upstream of the PaLoc in ST369 (C-III). This CdtLoc 193 was unusual, characterised by the presence of cdtB, two copies of cdtA, two copies of cdtR and xerC194 encoding a site-specific tyrosine recombinase (Fig. 7). Both ST644 (C-I) and ST343 (C-III) were 195 CdtLoc-positive but PaLoc-negative (A<sup>-</sup>B<sup>-</sup>CDT<sup>+</sup>). In ST649 (C-I) cdtR was completely absent and, 196 in ST343 (C-III), the entire CdtLoc was contained within the genome of a 56Kbp temperate bacteriophage termed  $\Phi$ Semix9P1<sup>29</sup>. Toxin regulators TcdR and CdtR are highly conserved across 197 clades C1-5<sup>21</sup>. In contrast, the CdtR of STs 644 (C-I), 343 (C-III) and 369 (C-III) shared only 46-54% 198 199 amino acid identity (AAI) with CdtR of strain R20291 from clade 2 and ~40% AAI to each other. 200 Similarly, the TcdR of ST 369 shared only 82.1% AAI compared to R20291 (Supplementary Data). 201 Compared to TcdB of R20291 (TcdB<sub>R20291</sub>), the shared AAI for TcdB<sub>ST649</sub> C-I, TcdB<sub>ST637</sub> C-II 202 and TcdB<sub>ST369</sub> C-III were 94.0%, 90.5% and 89.4%, respectively. This sequence heterogeneity was 203 confirmed through the detection of five distinct HincII/AccI digestion profiles of tcdB B1 fragments 204 possibly reflecting novel toxinotypes (Supplementary Data). TcdB phylogenies identified clade C2

as the most recent common ancestor for  $TcdB_{ST649\_C-1}$  (**Fig. 7**). Phylogenetic subtyping analysis of the TcdB receptor-binding domain (RBD) showed the respective sequences in C-I, C-II and C-III clustered with *tcdB* alleles belonging to virulent C2 strains (**Supplementary Data**). Notably, the TcdB-RBD of ST649 (C-I) shared an AAI of 93.5% with TcdB-RBD allele type 8 belonging to hypervirulent STs 1 (RT027)<sup>13</sup> and 231 (RT251)<sup>30</sup>. Similarly, the closest match to *tcdB*-RBDs of ST637 (C-II) and ST369 (C-III) was allele type 10 (ST41, RT244)<sup>31</sup>.

### 211 Discussion

Through phylogenomic analysis of the largest and most diverse collection of *C. difficile* genomes to date, we identified major incoherence in *C. difficile* taxonomy, and provide new insight into intraspecies diversity and evolution of pathogenicity in this major One Health pathogen.

215 Our analysis found high nucleotide identity (ANI > 97%) between C. difficile clades C1-4, indicating that strains from these four clades (comprising 560 known STs) belong to the same species. 216 217 This is supported by our core genome and Bayesian analyses, which estimated the most recent 218 common ancestor of C. difficile clades C1-4 existed ~1.61 mya. After this point, there appears to have 219 been rapid population expansion into the four closely related extant clades described today, which 220 include many of the most prevalent strains causing healthcare-associated CDI worldwide<sup>11</sup>. On the 221 other hand, ANI between C5 and C1-4 is on the borderline of the accepted species threshold (95.9-222 96.2%) and their common ancestor existed 3.89 mya, over 2 Ma before C1-4 diverged. This degree 223 of speciation likely reflects the unique ecology of C5 - a lineage comprising 33 known STs which is 224 well established in non-human animal reservoirs worldwide and recently associated with CDI in the community setting<sup>32</sup>. We identified major taxonomic incoherence among the three cryptic clades and 225 226 C1-5, evident by ANI values well below the species threshold (~91%, C-I; ~94%, C-II; and ~89%, 227 C-III). Similar ANI value differences were seen between the cryptic clades themselves, indicating 228 they are as divergent from each other as they are individually from C1-5. This extraordinary level of 229 discontinuity is substantiated by our core genome and Bayesian analyses which estimated the 230 common ancestors of clades C-I, C-II and C-III existed 13, 22 and 48 Ma, respectively, at least 9 to 231 45 Ma before the common ancestor of C1-5. For context, divergence dates for other pathogens range 232 from 10 Ma (Campylobacter coli and C. jejuni)<sup>33</sup>, 47 Ma (Burkholderia pseudomallei and 233 B. thailandensis)<sup>34</sup> and 120 Ma (Escherichia coli and Salmonella enterica)<sup>35</sup>. Corresponding whole 234 genome ANI values for these species are 86%, 94% and 82%, respectively (Supplementary Data).

235 Comparative ANI analysis of the cryptic clades with >5000 reference genomes across 21 236 phyla failed to provide a better match than C. difficile (89-94% ANI). Similarly, our revised ANI-237 based taxonomy of the Peptostreptococcaceae placed clades C-I, C-II and C-III between C. difficile 238 and C. mangenotii, the latter sharing ~77% ANI. The rate of 16S rRNA divergence in bacteria is 239 estimated to be 1-2% per 50 Ma<sup>35</sup>. Contradicting our ANI and core genome data, 16S rRNA 240 sequences were highly conserved across all 8 clades. This indicates that in C. difficile, 16S rRNA 241 gene similarity correlates poorly with measures of genomic, phenotypic and ecological diversity, as reported in other taxa such as Streptomyces, Bacillus and Enterobacteriaceae<sup>36, 37</sup>. Another interesting 242 observation is that C5 and the three cryptic clades had a high proportion (>90%) of MLST alleles that 243 244 were absent in other clades (Supplementary Data) suggesting minimal exchange of essential 245 housekeeping genes between these clades. Whether this reflects divergence or convergence of two species, as seen in *Campylobacter*<sup>38</sup>, is unknown. Taken together, these data strongly support the 246 247 reclassification of C. difficile clades C-I, C-II and C-III as novel independent Clostridioides 248 genomospecies. There have been similar genome-based reclassifications in Bacillus<sup>39</sup>, 249 Fusobacterium<sup>40</sup> and Burkholderia<sup>41</sup>. Also, a recent Consensus Statement<sup>42</sup> argues that the genomics and big data era necessitate easing of nomenclature rules to accommodate genome-based assignment 250 251 of species status to nonculturable bacteria and those without 'type material', as is the case with these 252 genomospecies.

253 The NCBI SRA was dominated by C1 and C2 strains, both in number and diversity. This 254 apparent bias reflects the research community's efforts to sequence the most prominent strains 255 causing CDI in regions with the highest-burden, e.g. ST 1 from humans in Europe and North America. As such, there is a paucity of sequenced strains from diverse environmental sources, animal reservoirs 256 257 or regions associated with atypical phenotypes. Cultivation bias - a historical tendency to culture, 258 preserve and ultimately sequence C. difficile isolates that are concordant with expected phenotypic 259 criteria, comes at the expense of 'outliers' or intermediate phenotypes. Members of the cryptic clades 260 fit this criterion. They were first identified in 2012 but have been overlooked due to atypical toxin 261 architecture which may compromise diagnostic assays (discussed below). Our updated MLST 262 phylogeny shows as many as 55 STs across the three cryptic clades (C-I, n=25; C-II, n=9; C-III, n=21) (Fig. 2). There remains a further dozen 'outliers' which could either fit within these new taxa or be 263 264 the first typed representative of additional genomospecies. The growing popularity of metagenomic 265 sequencing of animal and environmental microbiomes will certainly identify further diversity within these taxa, including nonculturable strains<sup>43, 44</sup>. 266

267 By analysing 260 STs across eight clades, we provide the most comprehensive pangenome 268 analysis of C. difficile to date. Importantly, we also show that the choice of algorithm significantly 269 affects pangenome estimation. The C. difficile pangenome was determined to be open (i.e. an unlimited gene repertoire) and vast in scale (over 17000 genes), much larger than previous estimates 270 271 (~10000 genes) which mainly considered individual clonal lineages<sup>16, 22</sup>. Conversely, comprising just 272 12.8% of its genetic repertoire (2,232 genes), the core genome of C. difficile is remarkably small, 273 consistent with earlier WGS and microarray-based studies describing ultralow genome conservation 274 in C. difficile<sup>11, 45</sup>. Considering only C1-5, the pangenome reduced in size by 12% (2,082 genes); 275 another 519 genes were lost when considering only C1-4. These findings are consistent with our 276 taxonomic data, suggesting the cryptic clades, and to a lesser extent C5, contribute a significant 277 proportion of evolutionarily divergent and unique loci to the gene pool. A large open pangenome and small core genome are synonymous with a sympatric lifestyle, characterised by cohabitation with, 278 279 and extensive gene transfer between, diverse communities of prokarya and archae $^{46}$ . Indeed, 280 C. difficile shows a highly mosaic genome comprising many phages, plasmids and integrative and conjugative elements<sup>11</sup>, and has adapted to survival in multiple niches including the mammalian 281 gastrointestinal tract, water, soil and compost, and invertebrates<sup>32</sup>. 282

Through a robust Pan-GWAS approach we identified loci that are enriched or unique in the genomospecies. C-I strains were associated with the presence of transporter AbgB and absence of a mannose-type phosphotransferase (PTS) system. In *E. coli*, AbgAB proteins allow it to survive on exogenous sources of folate<sup>47</sup>. In many enteric species, the mannose-type PTS system is essential for 287 catabolism of fructosamines such as glucoselysine and fructoselysine, abundant components of 288 rotting fruit and vegetable matter<sup>48</sup>. C-II strains contained Zn transporter loci *znuA* and *yeiR*, in 289 addition to Zn transporter ZupT which is highly conserved across all eight C. difficile clades. 290 S. enterica and E. coli harbour both znuA/yeiR and ZupT loci, enabling survival in Zn-depleted environments<sup>49</sup>. C-III strains were associated with major gene clusters encoding systems for 291 292 ethanolamine catabolism, heavy metal transport and spermidine uptake. The C-III eut gene cluster 293 encoded six additional kinases, transporters and transcription regulators absent from the highly 294 conserved *eut* operon found in other clades. Ethanolamine is a valuable source of carbon and/or 295 nitrogen for many bacteria, and *eut* gene mutations (in C1/C2) impact toxin production *in vivo*<sup>50</sup>. The 296 C-III metal transport gene cluster encoded a chelator of heavy metal ions and a multi-component 297 transport system with specificity for iron, nickel and glutathione. The conserved spermidine operon 298 found in all C. difficile clades is thought to play an important role in various stress responses including 299 during iron limitation<sup>51</sup>. The additional, divergent spermidine transporters found in C-III were similar 300 to regions in closely related genera Romboutsia and Paeniclostridium (data not shown). Together, 301 these data provide preliminary insights into the biology and ecology of the genomospecies. Most 302 differential loci identified were responsible for extra or alternate metabolic processes, some not 303 previously reported in C. difficile. It is therefore tempting to speculate that the evolution of alternate 304 biosynthesis pathways in these species reflects distinct ancestries and metabolic responses to evolving 305 within markedly different ecological niches.

306 This work demonstrates the presence of toxin genes on PaLoc and CdtLoc structures in all 307 three genomospecies, confirming their clinical relevance. Monotoxin PaLocs were characterised by the presence of *tcdR*, *tcdB* and *tcdE*, the absence of *tcdA* and *tcdC*, and flanking by transposases and 308 recombinases which mediate LGT<sup>20, 21, 52</sup>. These findings support the notion that the classical bi-toxin 309 PaLoc common to clades C1-5 was derived by multiple independent acquisitions and stable fusion of 310 311 monotoxin PaLocs from ancestral Clostridia<sup>52</sup>. Moreover, the presence of syntenic PaLoc and CdtLoc 312 (in ST369, C-I), the latter featuring two copies of *cdtA* and *cdtR*, and a recombinase (*xerC*), further 313 support this PaLoc fusion hypothesis<sup>52</sup>.

314 Bacteriophage holin and endolysin enzymes coordinate host cell lysis, phage release and toxin 315 secretion<sup>53</sup>. Monotoxin PaLocs comprising phage-derived holin (tcdE) and endolysin (cwlH) genes 316 were first described in C-I strains<sup>52</sup>. We have expanded this previous knowledge by demonstrating 317 that syntenic *tcdE* and *cwlH* are present within monotoxin PaLocs across all three genomospecies. 318 Moreover, since some strains contained *cwlH* but lacked toxin genes, this gene seems to be implicated 319 in toxin acquisition. These data, along with the detection of a complete and functional<sup>29</sup> CdtLoc 320 contained within  $\Phi$ Semix9P1 in ST343 (C-III), further substantiate the role of phages in the evolution 321 of toxin loci in C. difficile and related Clostridia 53.

The CdtR and TcdR sequences of the new genomospecies are unique and further work is needed to determine if these regulators display different mechanisms or efficiencies of toxin expression<sup>12</sup>. The presence of dual copies of CdtR in ST369 (C-I) is intriguing, as analogous duplications in PaLoc regulators have not been documented. One of these CdtR had a mutation at a key phosphorylation site (Asp61 $\rightarrow$ Asn61) and possibly shows either reduced wild-type activity or non-functionality, as seen in ST11<sup>54</sup>. This might explain the presence of a second CdtR copy.

328 TcdB alone can induce host innate immune and inflammatory responses leading to intestinal 329 and systemic organ damage<sup>55</sup>. Our phylogenetic analysis shows TcdB sequences from the three genomospecies are related to TcdB in Clade 2 members, specifically ST1 and ST41, both virulent 330 lineages associated with international CDI outbreaks<sup>13, 31</sup>, and causing classical or variant 331 (C. sordellii-like) cytopathic effects, respectively<sup>56</sup>. It would be relevant to explore whether the 332 333 divergent PaLoc and CdtLoc regions confer differences in biological activity, as these may present 334 challenges for the development of effective broad-spectrum diagnostic assays, and vaccines. We have previously demonstrated that common laboratory diagnostic assays may be challenged by changes in 335 336 the PaLoc of C-I strains<sup>21</sup>. The same might be true for monoclonal antibody-based treatments for CDI 337 such as bezlotoxumab, known to have distinct neutralizing activities against different TcdB 338 subtypes<sup>57</sup>.

Our findings highlight major incongruence in C. difficile taxonomy, identify differential 339 340 patterns of diversity among major clades and advance understanding of the evolution of the PaLoc and CdtLoc. While our analysis is limited solely to the genomic differences between C. difficile 341 342 clades, our data provide a robust genetic foundation for future studies to focus on the phenotypic, 343 ecological and epidemiological features of these interesting groups of strains, including defining the 344 biological consequences of clade-specific genes and pathogenic differences in vitro and in vivo. 345 Finally, our findings reinforce that the epidemiology of this important One Health pathogen is not 346 fully understood. Enhanced surveillance of CDI and WGS of new and emerging strains to better 347 inform the design of diagnostic tests and vaccines are key steps in combating the ongoing threat posed 348 by C. difficile.

## 349 Methods

Genome collection. We retrieved the entire collection of *C. difficile* genomes (taxid ID 1496) held at the NCBI Sequence Read Archive [https://www.ncbi.nlm.nih.gov/sra/]. The raw dataset (as of 1<sup>st</sup> January 2020), comprised 12,621 genomes. After filtering for redundancy and Illumina paired-end

data (all platforms and read lengths), 12,304 genomes (97.5%) were available for analysis.

Multi-locus sequence typing. Sequence reads were interrogated for multi-locus sequence type (ST) using SRST2 v0.1.8<sup>58</sup>. New alleles, STs and clade assignments were verified by submission of assembled contigs to PubMLST [https://pubmlst.org/cdifficile/]. A species-wide phylogeny was generated from 659 ST alleles sourced from PubMLST (dated 01-Jan-2020). Alleles were concatenated in frame and aligned with MAFFT v7.304. A final neighbour-joining tree was generated in MEGA v10<sup>59</sup> and annotated using iToL v4 [https://itol.embl.de/].

Genome assembly and quality control. Genomes were assembled, annotated and evaluated using a
 pipeline comprising TrimGalore v0.6.5, SPAdes v3.6.043, Prokka v1.14.5, and QUAST v2.344<sup>16</sup>.
 Next, Kraken2 v2.0.8-beta<sup>60</sup> was used to screen for contamination and assign taxonomic labels to
 reads and draft assemblies.

364 Taxonomic analyses. Species-wide genetic similarity was determined by computation of wholegenome ANI for 260 STs. Both alignment-free and conventional alignment-based ANI approaches 365 366 were taken, implemented in FastANI<sup>5</sup> v1.3 and the Python module  $pyani^{61}$  v0.2.9, respectively. 367 FastANI calculates ANI using a unique k-mer based alignment-free sequence mapping engine, whilst pyani utilises two different classical alignment ANI algorithms based on BLAST+ (ANIb) and 368 369 MUMmer (ANIm). A 96% ANI cut-off was used to define species boundaries<sup>4</sup>. For taxonomic 370 placement, ANI was determined for divergent C. difficile genomes against two datasets comprising (i) members of the *Peptostreptococcaceae*  $(n=25)^{23}$ , and (ii) the complete NCBI RefSeq database 371 372 (n=5895 genomes, https://www.ncbi.nlm.nih.gov/refseq/, accessed 14th Jan 2020). Finally, 373 comparative identity analysis of consensus 16S rRNA sequences for C. mangenotii type strain 374 DSM1289T<sup>23</sup> (accession FR733662.1) and representatives of each C. difficile clade was performed 375 using Clustal Omega https://www.ebi.ac.uk/Tools/msa/clustalo/.

Estimates of clade and species divergence. BactDating v1.0.1<sup>62</sup> was applied to the recombination corrected phylogeny produced by Gubbins (471,708 core-genome sites) with Markov chain Monte

corrected phylogeny produced by Gubbins (471,708 core-genome sites) with Markov chain Monte Carlo (MCMC) chains of 10<sup>7</sup> iterations sampled every 10<sup>4</sup> iterations with a 50% burn-in. A strict 378 clock model was used with a rate of  $2.5 \times 10^{-9}$  to  $1.5 \times 10^{-8}$  substitutions per site per year, as previously 379 defined by He *et al.*<sup>16</sup> and Kumar *et al.*<sup>27</sup>. The effective sample sizes (ESS) were >200 for all estimated 380 parameters, and traces were inspected manually to ensure convergence. To provide an independent 381 estimate from BactDating, BEAST v1.10.4<sup>63</sup> was run on a recombination-filtered gap-free alignment 382 383 of 10,466 sites with MCMC chains of  $5 \times 10^8$  iterations, with a  $9 \times 10^{-7}$  burn-in, that were sampled every 10<sup>4</sup> iterations. The strict clock model described above was used in combination with the discrete 384 385 GTR gamma model of heterogeneity among sites and skyline population model. MCMC convergence 386 was verified with Tracer v1.7.1 and ESS for all estimated parameters were >150. For ease of

comparison, clade dating from both approaches were transposed onto a single MLST phylogeny. Tree
 files are available as **Supplementary Data** at <u>http://doi.org/10.6084/m9.figshare.12471461</u>.

389 Pangenome analysis. The 260 ST dataset was used for pangenome analysis with Panaroo v1.1.0<sup>64</sup> 390 and Roary v3.6.0<sup>65</sup>. Panaroo was run with default thresholds for core assignment (98%) and blastP 391 identity (95%). Roary was run with a default threshold for core assignment (99%) and two different 392 thresholds for BlastP identity (95%, 90%). Sequence alignment of the final set of core genes (Panaroo; 393 n=2.232 genes, 2.606,142 bp) was performed using MAFFT v7.304 and recombinative sites were 394 filtered using Gubbins v7.304<sup>66</sup>. A recombinant adjusted alignment of 471,708 polymorphic sites was used to create a core genome phylogeny with RAxML v8.2.12 (GTR gamma model of among-site 395 396 rate-heterogeneity), which was visualised alongside pangenome data in Phandango<sup>67</sup>. Pangenome dynamics were investigated with PanGP v1.0.1<sup>16</sup>. 397

398 Scoary<sup>68</sup> v1.6.16 was used to identify genetic loci that were statistically associated with each 399 clade via a Pangenome-Wide Association Study (pan-GWAS). The Panaroo-derived pangenome 400 (n=17,470) was used as input for Scoary with the evolutionary clade of each genome depicted as a 401 discrete binary trait. Scoary was run with 1,000 permutation replicates and genes were reported as 402 significantly associated with a trait if they attained *p*-values (empirical, naïve and Benjamini-403 Hochberg-corrected) of  $\leq 0.05$ , a sensitivity and specificity of > 99% and 97.5%, respectively, and 404 were not annotated as "hypothetical proteins". All significantly associated genes were reannotated 405 using prokka and BlastP and functional classification (KEGG orthology) was performed using the 406 Koala suite of web-based annotation tools<sup>69</sup>.

407 Comparative analysis of toxin gene architecture. The 260 ST genome dataset was screened for the 408 presence of tcdA, tcdB, cdtA and cdtB using the Virulence Factors Database (VFDB) compiled within 409 ABRicate v1.0 [https://github.com/tseemann/abricate]. Results were corroborated by screening raw reads against the VFDB using SRST2 v0.1.8<sup>58</sup>. Both approaches employed minimum coverage and 410 411 identity thresholds of 90 and 75%, respectively. Comparative analysis of PaLoc and CdtLoc 412 architecture was performed by mapping of reads with Bowtie2 v.2.4.1 to cognate regions in reference 413 strain R20291 (ST1, FN545816). All PaLoc and CdtLoc loci investigated showed sufficient coverage 414 for accurate annotation and structural inference. Genome comparisons were visualized using ACT 415 and figures prepared with Easyfig<sup>21</sup>. MUSCLE-aligned TcdB sequences were visualized in Geneious 416 v2020.1.2 and used to create trees in iToL v4.

417 **Statistical analyses.** All statistical analyses were performed using SPSS v26.0 (IBM, NY, USA). For 418 pangenome analyses, Chi-squared test with Yate's correction was used to compare the proportion of 419 core genes and a One-tailed Mann-Whitney U test was used to demonstrate the reduction of gene 420 content per genome, with a p-value  $\leq 0.05$  considered statistically significant.

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## 642 Author contributions

D.R.K., K.I., D.W.E., and T.V.R. designed the study. D.R.K., K.I., C.R., B.K., E.G.A., and K.E.D.
performed experimental work. D.R.K., K.I., C.R., B.K., E.G.A., D.P.S., X.D., K.E.D., D.W.E., C.R.,
and T.V.R. analysed data and drafted the manuscript. All authors edited and approved the final
version of the manuscript. The corresponding author had full access to all the data in the study and
had final responsibility for the decision to submit for publication.

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# 658 **Competing Interests**

659 DWE declares lecture fees from Gilead, outside the submitted work. No other author has a conflict

660 of interest to declare.

## 661 Additional information

662 Supplementary Data is available at <u>http://doi.org/10.6084/m9.figshare.12471461</u>