1 Emerging *Clostridioides difficile* ribotypes have divergent metabolic phenotypes 2 Firas S. Midani,^{1,2} Heather A. Danhof,^{1,2} Nathanael Mathew,^{1,2} Colleen K. Ardis,^{1,2} Kevin W. Garey,³ Jennifer K. 3 Spinler,⁴ and Robert A. Britton^{1,2,#} 4 5 6 ¹Alkek Center for Metagenomics and Microbiome Research, Baylor College of Medicine, Houston, Texas, USA 7 ²Department of Molecular Virology and Microbiology, Baylor College of Medicine, Houston, Texas, USA 8 ³Department of Pharmacy Practice and Translational Research, University of Houston, Houston, Texas, USA 9 ⁴Department of Pathology and Immunology, Baylor College of Medicine, Houston, Texas, USA [#]Address correspondence to Robert Britton, robert.britton@bcm.edu. 10 11 12 **Running Title**: Divergent metabolism of *C. difficile* ribotypes 13 14 **Keywords**: *Clostridioides difficile*, growth modeling, carbon metabolism, ribotyping. 15 16 **Word Counts**:185 (abstract) and 4.158 (text excluding references and figure legends). 17 ABSTRACT 18 19 Clostridioides difficile is a gram-positive spore-forming pathogen that commonly causes diarrheal infections in 20 the developed world. Although C. difficile is a genetically diverse species, certain ribotypes are 21 overrepresented in human infections. It is unknown if metabolic adaptations are essential for the emergence of 22 23 these epidemic ribotypes. Here, we tested carbon substrate utilization by 88 C. difficile isolates and looked for differences in growth between 22 ribotypes. By profiling clinical isolates, we assert that C. difficile is a 24 generalist species capable of growing on a variety of carbon substrates. Further, C. difficile strains clustered by 25 phylogenetic relationship and displayed ribotype-specific and clade-specific metabolic capabilities. Surprisingly, 26 27 we observed that two emerging lineages, ribotypes 023 and 255, have divergent metabolic phenotypes. In 28 addition, although C. difficile Clade 5 is the most evolutionary distant clade and often detected in animals, it 29 displayed more robust growth on simple dietary sugars than Clades 1-4. Altogether, our results corroborate the 30 generalist metabolic strategy of *C. difficile* and demonstrate lineage-specific metabolic capabilities. In addition, 31 our approach can be adapted to the study of additional pathogens to ascertain their metabolic niches in the 32 gut. 33 34 **IMPORTANCE** 35

The gut pathogen *Clostridioides difficile* utilizes a wide range of carbon sources. Microbial communities can be rationally designed to combat *C. difficile* by depleting its preferred nutrients in the gut. However, *C. difficile* is

- 38 genetically diverse with hundreds of identified ribotypes and most of its metabolic studies were performed with
- 39 lab-adapted strains. Here, we profiled carbon metabolism by a myriad of *C. difficile* clinical isolates. While the
- 40 metabolic capabilities of these isolates clustered by their genetic lineage, we observed surprising metabolic
- 41 divergence between two emerging lineages. We also found that the most genetically distant clade grew
- 42 robustly on simple dietary sugars, posing intriguing questions about the adaptation of *C. difficile* to the human
- 43 gut. Altogether, our results underscore the importance of considering the metabolic diversity of pathogens in
- 44 the study of their evolution and the rational design of therapeutic interventions.
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47 INTRODUCTION

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Clostridioides difficile is a common cause of gastrointestinal infections with symptoms ranging from mild 49 diarrhea to pseudomembranous colitis which can be fatal (1). By disrupting the gut microbiome, antibiotic use 50 lessens microbial competition for nutrients in the gut and increases the risk of C. difficile infection (2). Although 51 hospital-acquired C. difficile infections are decreasing likely due to better infection-prevention and antibiotic 52 53 stewardship efforts, community-acquired C. difficile infections are increasing (3). Therefore, gut microbial 54 alterations due to factors other than antibiotics may also increase the risk of C. difficile infections. As a strong driver of gut microbial composition (4), diet modulates the risk or severity of C. difficile infection in animals (5, 55 56 6), and dietary additives may have contributed to the emergence of epidemic C. difficile lineages (7). However, the contribution of the human diet to C. difficile epidemiology and pathogenesis remains incompletely 57 58 understood.

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As a generalist species, C. difficile occupies various nutritional niches in the human gut. Because it is adept at 60 fermenting both amino acids and carbohydrates (8, 8), C. difficile thrives during antibiotic disturbance (2, 9), 61 chronic inflammation (10), or toxin-induced inflammation (11, 12). However, this rich understanding of C. 62 63 difficile metabolism was derived from animal studies using lab-adapted C. difficile strains, and confounded by the phenotypic divergence of the same C. difficile strain passaged in different laboratories (13). Additionally, C. 64 difficile is a diverse species that has five well-defined phylogenetic clades (14) and at least 116 PCR ribotypes 65 (15). Metabolic capabilities including fermentation of amino acids and central carbon metabolites also varied 66 considerably between strains comprising the five major clades (16). Accordingly, it is unknown if clinical C. 67 difficile isolates have similar metabolic capabilities as lab-adapted strains and whether dominant ribotypes 68 69 have metabolic advantages over ribotypes that cause a lower burden of human infections.

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Here, we address these issues by measuring and comparing the growth of 88 *C. difficile* isolates on a variety of carbon substrates. By profiling growth in Biolog Phenotype Microarray plates, we identified a wide range of carbon sources used by the *C. difficile* species and compared how ribotypes differentially grew on these substrates. We also contrasted the growth of the emerging ribotypes 023 and 255, and the growth of ancestral Clade 5 ribotypes to newer Clade 1-4 ribotypes. Altogether, our results expand our understanding of the metabolic diversity of *C. difficile* and pose new questions about the evolution of the *C. difficile* species.

- 77
- 78 RESULTS
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80 Broad survey of carbon substrate utilization by various clinical *C. difficile* ribotypes

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We profiled the growth of 88 *C. difficile* strains on 190 unique carbon substrates using Biolog Phenotype microarray plates. Tested strains comprised all five phylogenetic clades and at least 22 ribotypes. Strains

profiled were from patient samples (n=82) or lab-adapted isolates (n=6), including CD630, R20291, VPI 10463, 84 and M68. Strains were grown anaerobically for 17 hours in Biolog plates which are pre-loaded with a single 85 carbon substrate in each well. We estimated the maximum population size for each monoculture (carrying 86 capacity) using the maximum change in optical density during the growth experiments. Because C. difficile 87 grows in minimal media using Stickland fermentation of amino acids, maximum changes in optical density 88 reflect the additive growth on amino acids in the minimal media and on the single carbon source pre-loaded in 89 each well. We therefore adjusted the carrying capacities for each isolate by subtracting its carrying capacity on 90 91 minimal media alone in the control well (normalized carrying capacity). This normalization allowed us to discriminate the contribution of a carbon source versus amino acids to bacterial growth, and account for 92 variation in the growth of different isolates on minimal media. 93

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95 C. difficile is a generalist species that grows on a variety of carbon substrates

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97 C. difficile isolates grew on a variety of carbon substrates. Out of 190 tested carbon sources, 26 substrates increased optical density by at least 0.1 units for at least 10% of the tested isolates (Figure 1). To rank these 98 substrates based on their contribution to C. difficile growth, we ordered them by their median normalized 99 carrying capacities. C. difficile reached the highest biomass on simple sugars, followed by sugar derivatives, 100 sugar alcohols, amino acids, then carboxylic acids. Conversely, our survey also revealed several substrates 101 that decreased optical density by a mean of at least 0.05 units. These inhibitory substrates were dominated by 102 acids and included substrates with known antimicrobial effects, such as capric acid, and those that can be 103 microbially produced, such as phenylethylamine (17, 18). 104

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106 *C. difficile* lineages are distinguished by phylogenetically conserved metabolic capabilities

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Because C. difficile is a genetically diverse species with many ribotypes, we wondered if ribotypes cluster 108 based on their carbon substrate utilization profiles. We performed a principal component analysis of the 109 normalized carrying capacities for the top 26 carbon substrates. Isolates strongly clustered by phylogenetic 110 clades for the first two principal components which collectively explained 56.9% of the variance (Figure 2A,C). 111 and showed clustering by ribotype for the first four principal components, which collectively explained 73.8% of 112 113 the variance (Figure 2C-D). Principal component loadings, which describe how substrates contribute to each principal component, showed that the clustering of both clades and ribotypes was mostly driven by 9 114 substrates (Figure 2E-F). These substrates were the sugars trehalose, mannose, ribose, and melezitose; the 115 sugar derivatives arbutin and salicin; and the sugar alcohols sorbitol, mannitol, and arabitol. The direction of 116 loadings aligned with the growth of ribotypes on each substrate (Figure S1). For example, trehalose supported 117 the highest carrying capacities for isolates in Clades 2 and 5, and these are the isolates most positively 118 correlated with trehalose loading on principal component 2. Likewise, Clade 5 and ribotype 015 isolates are 119 unable to grow on melezitose and occupy the principal component space opposite the direction of the 120

- melezitose loading on the first two principal components. In summary, genetically diverse isolates cluster by phylogenetic clade and ribotype based on their carbon substrate utilization.
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124 Emerging ribotypes have divergent metabolic phenotypes

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To determine how substrate utilization differentiates ribotypes, we compared the growth of ribotypes on carbon 126 substrates that supported C. difficile growth. First, we grouped isolates into sets based either on ribotype or 127 habitat (e.g., lab-adapted). For each substrate, isolates were then ranked based on their normalized carrying 128 capacity. Next, we used strain set enrichment analysis (an approach akin to gene set enrichment analysis; see 129 Methods) to compute an enrichment score that reflects the degree to which a strain set (group of isolates) is 130 overrepresented at the extremes (top or bottom) of the entire ranked list of isolates. Our analysis focused on 131 groups that were profiled with a minimum of 4 isolates and included the following groups: RT027+, RT014+, 132 RT106+, RT255, RT023, RT017, RT078, Clade 5+ (i.e., non-RT078 isolates), and lab-adapted strains (CD630. 133 R20291, VPI 10463, M68). Here, a "+" sign indicates that a group included closely related ribotypes. Our 134 analysis showed that ribotypes 255, 027, and 017 are positively enriched (higher carrying capacities) while 135 ribotypes 014-020, 106, and 023 are negatively enriched (lower carrying capacities) (Figure 3), Clade 5 136 ribotypes including ribotype 078 have a similar balance of positive and negative enrichments. Surprisingly, two 137 emerging ribotypes displayed polarized enrichment patterns (Figure 4A), Ribotype 255 had 24 out of 26 138 positive enrichments with 9 of those being significant, while ribotype 023 had 20 out of 26 negative 139 enrichments with 5 of those being significant (Figure S2). This divergence in enrichments suggests that a 140 ribotype can emerge even if it grows poorly on many of the carbon sources commonly used by C. difficile. 141

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143 Emerging ribotype 255 grows robustly on a variety of substrates

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Ribotype 255 is an emerging C. difficile lineage that comprised approximately 2-5% of cases in the United 145 States between 2016 and 2018 (19–21). We observed that ribotype 255 was significantly enriched on various 146 substrates (Figure 3). Notably, ribotype 255 grew significantly higher than other ribotypes on minimal media 147 supplemented with fructose or ribose (Figure S3). To verify these observations, we re-tested the growth of 148 ribotype 255 and other isolates representing various common ribotypes on minimal media supplemented with 149 150 fructose or ribose at multiple concentrations. Unlike Biolog assays, where cultures were started with inocula harvested from overnight cultures, we started cultures from inocula harvested during exponential growth and 151 monitored growth for 24 hours. We observed significantly higher growth for ribotype 255 on fructose and ribose 152 (P < 0.05, linear mixed effects model; Figure 4B). We repeated this assay with fewer isolates but more 153 substrates. The order of ribotypes on fructose, mannitol, salicin, and ribose, recapitulated the patterns detected 154 by our Biolog assays (Figure S4). Ribotype 255 grew to a higher density than ribotypes 027, 106, and 014 on 155 fructose, mannitol, and ribose, while ribotype 255 had the worst growth on salicin. Notably, although overnight 156

157 cultures of ribotypes 017 and 078 were unable to grow on ribose in fresh media (**Figure S1**), these ribotypes 158 grew on ribose when it was introduced during exponential growth.

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160 Clade 5 ribotypes grow more robustly on simple sugars than Clade 1-4 ribotypes

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Clade 5 is the most evolutionary distant C. difficile clade and includes ribotypes that are frequently detected in 162 animals (22, 23), Comparative genomics suggested that the divergence of Clades 1-4 from Clade 5 is linked to 163 positive selection on genes involved in metabolism of simple sugars (24). Therefore, we expected significant 164 metabolic differences between Clades 1-4 and Clade 5, but we only observed modest differences in growth 165 between these clade groups. Animal-associated ribotypes (Clade5+) were also distinguished only by increased 166 growth on trehalose and sorbitol and decreased growth on glucose, N-acetyl-glucosamine, ethanolamine, and 167 melezitose (Figure 3). To further investigate these observations, we compared the growth of Clade 5 ribotypes 168 to Clades 1-4 ribotypes on eight different substrates including the simple sugars glucose, fructose, tagatose, 169 and ribose (Figure 5). Cultures were started with mid-exponential growth inoculum and growth was monitored 170 for 48 hours. For Clade 5 isolates, we included both human- and animal-associated ribotype 078 strains and 171 animal-associated ribotypes 033, 126, and 288 strains, Surprisingly, Clade 1-4 isolates had significantly lower 172 growth on simple sugars (P < 0.001, linear mixed effects model), although Clade 1-4 and Clade 5 isolates had 173 similar growth overall (P > 0.05, linear mixed effects model). Indeed, substrate-specific comparisons showed 174 that Clade 5 isolates grew to a significantly higher density on ribose and tagatose (P < 0.05, linear mixed 175 effects model). In summary, Clade 5 ribotypes grew more robustly on simple sugars than common ribotypes in 176 Clades 1-4. 177

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179 Gene-environment interactions are necessary for growth on certain substrates

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We previously showed that ribotypes 027, 078, and 017 encode genetic variants or operons that facilitate 181 competitive growth on trehalose (7, 25). Here, we observed that ribotypes 017 isolates, which have a C171S 182 amino acid substitution in the trehalose operon repressor treR (25), did not grow on trehalose in our Biolog 183 assay. So, we re-tested M68, a ribotype 017 reference strain, on Biolog Phenotype Microarray plates using 184 different growth media for its overnight culture, before dilution and inoculation into Biolog plates, M68 was able 185 186 to grow on trehalose when its inoculum was cultured overnight on brain-heart infusion media supplemented with high (5%) but not low (0.5%) yeast extract (Figure 6). We hypothesized that high yeast extract in 187 overnight culture provided a limiting growth cofactor for trehalose metabolism by ribotype 017. To test this, we 188 reasoned that cell cultures that are either washed or highly diluted before inoculating into minimal media would 189 not retain the unknown growth factor and would not be able to grow on trehalose. Indeed, we observed that 190 M68, which was pre-grown overnight on BHI with high yeast extract, was unable to grow on trehalose as the 191 sole carbon source if it had been washed or highly diluted before inoculation (Figure S5A). In contrast. 192 CD2015, a ribotype 027 isolate, was able to grow on trehalose even after both washing and dilution (Figure 193

S5B). Altogether, this precarious growth of M68 suggests that an unknown limiting factor can modify the
 growth of some *C. difficile* strains on certain substrates, including trehalose, ribose, and cellobiose.

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197 DISCUSSION

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By identifying the metabolic needs and preferences of C. difficile, we can begin to inform the design of 199 microbial and dietary interventions for the prevention and treatment of C. difficile infections. Indeed, microbial 200 communities can be rationally designed to resist C. difficile by blocking access to key nutrients (26, 27), and 201 dietary alterations can prevent enteric infections (28). Here, we expand our metabolic understanding of C. 202 difficile by profiling carbon substrate utilization of clinical isolates comprising all five major clades. Our results 203 corroborate that C. difficile is a bacterial generalist that can grow on a wide array of carbon sources, and that 204 common C. difficile lineages exhibit unique metabolic capabilities. Surprisingly, we observed divergent 205 metabolic profiles for emerging ribotypes 023 and 255, and robust growth of the evolutionary distant Clade 5 206 on simple sugars. Altogether, our findings underscore the importance of considering the metabolic diversity of 207 C. difficile in the design of microbial and dietary interventions. 208

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Our results also highlight several carbohydrates that are variably used by C. difficile lineages and may be 210 crucial in the design of dietary interventions. We have previously shown that trehalose metabolism is variable 211 between ribotypes and that increased use of trehalose in food manufacturing correlated with the emergence of 212 ribotypes that are highly adept at consuming trehalose (7, 25). In contrast, sugar alcohols are derived in the 213 intestines from both the host metabolism and the diet. In mouse models of C. difficile infections, sugar alcohols 214 were highly abundant in guts of susceptible animals (29), and sorbitol utilization genes were highly upregulated 215 during C. difficile toxin-induced inflammation (12). Because sorbitol comprises the most used non-nutritive 216 sweetener globally (30, 31), it is likely more common in the human diet than trehalose. Ribose is also highly 217 abundant in the out because it comprises the backbone of nucleobases. Importantly, out commensals have 218 219 adapted to sense and scavenge ribose from dietary nucleosides (32) and ribose transport and metabolism are highly expressed in mice mono-colonized with C. difficile (33). Additional studies are needed to verify the role 220 of these nutrients in *C. difficile* colonization and pathogenesis. 221

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223 By profiling the growth of all five major clades, our study also tested prevailing hypotheses about the evolution of the C. difficile species. A large-scale genomic analysis suggested that the divergence of Clades 1-4 from 224 Clade 5 is linked to the metabolism of dietary simple sugars, and a related mouse experiment showed that 225 fructose and glucose could differentially impact colonization of Clades 1-4 (24). However, this mouse 226 experiment was biased by testing only two strains, Clade 2 R20291 and Clade 5 M120, which are both lab-227 adapted. In contrast, we showed that ancestral Clade 5 isolates are just as capable as newer Clade 1-4 228 isolates in terms of growth on simple sugars. Further, the two emerging lineages, ribotypes 255 and 023 which 229 are in Clades 1 and 3 respectively (20, 34), had divergent metabolic phenotypes especially in terms of growth 230

on simple sugars. While these findings highlight the need for more representation of a pathogen's diversity in
 animal studies, it remains possible that simple sugars differentially impact the growth of newer *C. difficile* lineages in the gut.

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Our results also emphasize that genomic potential does not always translate to metabolic activity. We 235 previously showed that certain ribotypes can utilize trehalose at ultra-low concentrations due to unique gene 236 variants or operons. These genetic signatures were also shown to be encoded in additional ribotypes (35), but 237 it is unclear if the presence of these gene variants is sufficient for growth on trehalose. For example, while 238 ribotype 023 lacks the canonical treRA operon, it encodes an alternative four-gene operon (35, 36) that grants 239 ribotype 078 (and other Clade 5 isolates) the ability to grow on 10 mM trehalose (7). Yet, we were unable to 240 grow ribotype 023 isolates even at higher concentrations of trehalose, possibly because of a truncation in treX 241 (36). Similarly, we have previously shown that ribotype 017 isolates can grow on trehalose (25), but replication 242 of this growth required an unknown limiting factor available in yeast extract. 243

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245 Despite the evidence presented here, metabolic capabilities by clinical C. difficile isolates still need to be further studied. Our analysis was limited to the 190 carbon substrates included in the Biolog Phenotype 246 Microarray plates. Also, these substrates are seeded in these plates at unknown proprietary concentrations 247 which may result in missing interesting patterns, including the ability of certain ribotypes to grow on low levels 248 of substrates such as trehalose (7). Moreover, we profiled growth using a specific growth protocol, and results 249 may not generalize to different experimental conditions. For example, Clade 5 isolates were able to robustly 250 grow on ribose if exposed to it during mid-exponential but not after overnight growth. Finally, Stickland 251 fermentation of amino acids is crucial for C. difficile pathogenesis (8, 37–39), but our assay does not 252 adequately discern the growth contribution of amino acids in the Biolog plates from amino acids in the minimal 253 media. Although amino acids were the sole nitrogen source in our minimal media, they were also fermented as 254 carbon sources by C. difficile. A defined growth medium that minimizes amino acids is necessary to properly 255 investigate Stickland fermentation, as has been developed for the study of the Wood-Ljungdahl pathway in C. 256 difficile (40). 257

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Ultimately. our comprehensive study of carbon source utilization shows that clinical C. difficile isolates are 259 bacterial generalists with lineage-specific metabolic adaptations. It remains unclear if these adaptations have 260 contributed to the emergence of certain lineages or if they provide a competitive advantage in the human gut. 261 Further, our results suggest the existence of unknown factors that are necessary for the growth of specific C. 262 difficile lineages in certain nutritional environments. The discovery of these growth factors presents new 263 opportunities to understand and control the engraftment of C. difficile. Finally, our analytical approach for 264 comprehensively profiling the metabolic capacities of C. difficile can be adapted for the study of additional 265 pathogens to discover insights about their metabolic needs in the gut. 266

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268 MATERIALS AND METHODS

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270 Bacterial strains

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Clinical *C. difficile* strains were isolated from a variety of sources including patients in the United States (n=62),
the Netherlands (n=6), Colombia (n=5), Japan (n=4), Australia (n=2), Czech Republic (n=1), Spain (n=1), and
the United Kingdom (n=1). Lab-adapted *C. difficile* strains included R20291, CD630, VPI 10463, and M68. **Tables S1-2** describe the source and molecular typing of these isolates respectively. Notably, ribotype 255
strains were isolated from patients in the state of Texas by Kevin Garey's lab, while ribotype 023 strains were
isolated from patients in various European sites by the labs of Ed Kuijper and Brendan Wren.

279 Bacterial growth assays

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All preparation of bacterial strains and growth of bacterial cultures were performed under an anaerobic
atmosphere (5% CO2, 5% H2, 90% N2) inside a vinyl anaerobic chamber (Coy Laboratory Products). Bacterial
strains were revived from frozen stocks by streaking on brain heart infusion agar supplemented with 0.5%
yeast extract then growing at 37C.

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286 Biolog Phenotype Microarrays assays

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Colonies on agar plates were cultured overnight for approximately 15-18 hours in BHIS broth, which is brain 288 heart infusion media supplemented with 5% yeast extract. Cell cultures were then diluted 1:10 in a defined 289 minimal media, which is a basal defined medium adapted from Table 1 of Karasawa et al. (41) with several 290 adjustments (Table S3). Each well in the pre-reduced Biolog Phenotype Microarray plates were then filled with 291 µl of the diluted cell cultures. Plates were sealed with gas-permeable film then incubated in a microplate 100 292 reader (Sunrise by Tecan Life Sciences or AccuSkan by Thermo Scientific) for 17 hours. Optical density (620 293 nm) was measured every 10 minutes immediately after 5 seconds of orbital shaking. The growth profiles for 294 isolates were repeated at least twice except for two isolates, a Ribotype 106 isolate and another of unknown 295 ribotype, which were measured only once. 296

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298 Bacterial growth validation assays

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Overnight cultures in BHIS broth were subcultured 1:5 in fresh media and grown to mid-exponential phase (OD ~0.6), then diluted 1:50 in defined minimal media. Cell suspensions were mixed 1:1 with twice-concentrated
 substrate solutions which were prepared in double-deionized water then filter-sterilized (0.22 µm pore size).
 Each well had a final volume of 200 ul of cell cultures which were gown statically for 24 hours in a microplate
 reader (Sunrise by Tecan Life Sciences). Optical density (620 nm) was measured every 10 minutes

immediately after 5 seconds of orbital shaking. For validation of M68 and CD2015 growth on trehalose,
 overnight cultures were washed inside the anaerobic chamber by spinning at 2,000 g for 2 minutes with a
 pulse centrifuge, decanting the supernatant, then resuspending pellets in defined minimal media.

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309 Microbial growth curve analysis

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The "AMiGA" software was used for analysis of growth curves collected in this study (42). To flag wells with 311 growth issues, we used the "summarize" command by AMiGA to generate 96-well growth curve plots. We 312 manually flagged wells where growth curves displayed either rapid spikes or dips in optical density (often 313 caused by gas bubbles), high background noise (as determined by starting OD), or unusual noisy fluctuations 314 in optical density. Plates that included a large number of flagged wells were excluded from analysis. Because 315 growth curves of C. difficile do not always follow the classical logistic growth dynamics, we modeled growth 316 curves using Gaussian Process regression with the "fit" command by AMiGA which estimated growth metrics 317 including area under the curve, carrying capacity, and growth rates. Because C. difficile can grow in defined 318 minimal media using Stickland fermentation of amino acids, we wanted to compare the growth dynamics of 319 each C. difficile isolate on different substrates relative to its own growth on minimal media. Therefore, we 320 computed the difference in each growth metric relative to its median value during growth on minimal media. 321 either using the "normalize" command by AMiGA or custom-written Python script. 322

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324 Principal Component Analysis

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To see if isolates cluster by molecular ribotype or phylogenetic identity, we performed principal component 326 analysis on the normalized carrying capacity for the top 26 substrates used by C. difficile. These top substrates 327 increased the carrying capacity by an OD of 0.1 (relative to carrying capacity on minimal media) for at least 328 10% (i.e., 8) of the tested C. difficile isolates. Principal component analysis was performed using "statsmodels" 329 Python package on zero-centered normalized carrying capacities. Using principal component loadings, we 330 compared the contribution of each substrate to the position of an isolate on each principal component. We 331 visualized the loadings only for substrates that were ranked in the top 5 in terms of loadings for each of the first 332 333 four principal components.

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335 Strain Set Enrichment Analysis

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We devised a statistical approach that we termed strain set enrichment analysis (SSEA) in order to identify whether a *C. difficile* lineage can use certain substrates better or worse on average than other lineages. SSEA is methodologically similar to gene set enrichment analysis (GSEA). Whereas GSEA tests how sets of genes are enriched or depleted in terms of expression on a specific experimental condition (43), SSEA tests how sets of isolates (e.g. clades, ribotypes, or other arbitrary grouping) are enriched or depleted in terms of normalized

carrying capacity on a specific substrate. Strain set enrichment analysis was implemented using the "prerank"
 function by "gseapy" Python package (44). For this analysis, we only included sets with a minimum size of four,
 weighted enrichment scores by a value of 0.5, and estimated p-values with 10,000 permutations. *P* values
 were adjusted with Benjamni-Hocheberg false discovery rate correction.

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347 Linear Mixed Effects Models

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We ran linear mixed effects models, using the "Ime4" R package, to determine the effect of different substrates 349 molecular identities on the growth of C. difficile isolates. P values were obtained by likelihood ratio tests and 350 using the "anova" function between two models which only differ by the inclusion of the fixed effects of interest. 351 For evaluating the growth of ribotype 255 isolates on fructose and ribose (Figure 4B), likelihood ratio tests 352 compared the full model (Carrying capacity ~ Ribotype 255:Substrate + Ribotype 255 + Substrate + 353 Substrate Concentration + 1|Isolate) with several reduced models. Comparison determined that both ribotype 354 and ribotype:susbtrate interaction terms significantly affected carrying capacity. For evaluating the growth of 355 Clade 5 isolates on simple sugars (Figure 5), likelihood ratio tests compared the full model (Carrying capacity 356 ~ Clade 5:Substrate Type + Substrate Type + Clade 5 + Substrate + 1|Isolate) with a reduced model that 357 omitted the interaction term. Comparison determined that the interaction of Clade 5 with substrate type 358 significantly affected carrying capacity. We also tested the differential growth between Clade 5 and Clades 1-4 359 on each substrate by comparing the full model (Carrying capacity ~ Clade 5 + Substrate + 1|Isolate) with a 360 reduced model that omitted the Clade 5 term. These substrate-specific analyses identified significantly higher 361 growth for Clade 5 on ribose and tagatose. 362

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364 Data and code availability

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Microplate reader data is available at https://doi.org/10.5281/zenodo.12626878. Code for analyzing data and creating figures is available at https://github.com/firasmidani/cdiff-biolog-growth. The full list and versions of computational tool used for data analysis is included in the GitHub repository.

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371

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378

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- 384

385 AUTHOR CONTRIBUTIONS

- 386
- 587 FSM and RAB conceptualized the study; FSM and HAD administered the study; FSM, HAD, and RAB
- developed methods; KWG and JKS provided bacterial strains; JKS sequenced isolates; FSM, HAD, NM, and
- 389 CKA performed growth experiments; FSM and NM performed validation experiments; FSM developed
- 390 software, analyzed data, curated data, and visualized results; RAB and KWG acquired funding; RAB
- 391 supervised the project; FSM wrote the manuscript; and all authors reviewed and edited the manuscript.
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393 CONFLICT OF INTEREST

- 394
- 395 Authors declare no conflicts of interest.
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537 Figure 1. C. difficile is a generalist species that grows on a variety of carbon sources. (A) Plot displays the normalized carrying capacity for 88 C. difficile isolates on the top 26 most commonly used substrates. 538 539 Normalized carrying capacity is defined as the optical density (OD) on minimal media supplemented with a single carbon source beyond the OD of growth on minimal media alone. (B) Bottom panel display carbon 540 sources that inhibited growth. Box plots display the median and interguartile range of values. Whiskers extend 541 to the farthest point within 1.5x of the interguartile range. Horizontal bars on the right side display the 542 coefficients of variation for each distribution and the shading of these bars scales with the coefficient's value. 543 544 For inhibitory substrates, coefficients of variation were computed on -1x normalized carrying capacity. Top legend maps each substrate to a chemical group. 545



546 Figure 2. Isolates cluster by phylogenetic clade and molecular ribotype based on their growth on 547 carbon sources. (A-B) Top panels display the principal component analysis of the growth of isolates on the 548 top 26 carbon substrates. Isolates are grouped by clades with circles indicating the centroid for each group and 549 lines pointing to the location of each isolate in the ordination plots. (C-D) Middle panels display the same principal component analysis, and further delineate the ribotype of each isolate with colors and clade with 550 shapes, as indicated in the legend on the right. (E-F) Bottom panels visualize how certain substrates contribute 551 to the position of isolates on the principal components (loading factors). Left column displays analysis for the 552 first and second principal components while the right column displays analysis for the third and fourth principal 553 554 components.



Figure 3. Emerging and epidemic *C. difficile* ribotypes exhibit unique metabolic phenotypes. Heatmap displays which ribotypes are positively or negatively enriched for growth on each of the top carbon sources. Normalized enrichment scores were computed using strain set enrichment analysis. Strain groups (columns) are hierarchically clustered based on similarity of their normalized enrichment scores, while substrates (rows) are ordered from top to bottom based on the median growth of all isolates as shown in Figure 1. For each substrate, statistical significance was estimated with a permutation-based test procedure and corrected with the Benjamini-Hochberg method. **P* < 0.05, ***P* < 0.01, ****P* < 0.001.

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Figure 4. Emerging C. difficile ribotypes have divergent metabolic phenotypes. (A) Based on Biolog 562 Phenotype Microarray assays, ribotypes 255 and 023 were significantly enriched or depleted in growth on a 563 564 combined total of 14 substrates (P < 0.05, strain set enrichment analysis). Black text labels indicate substrates that differentially impacted growth for both ribotypes 255 and 023. Blue and green text labels indicate 565 566 substrates that differentially impacted growth for only ribotype 255 or ribotype 023 respectively. Whiskers span 567 the range of each distribution from lowest to highest value. (B) In validation experiments, "RT255" isolates reached significantly higher carrying capacity on fructose and ribose than isolates belonging to "other" 568 569 ribotypes. C. difficile isolates harvested during exponential growth were inoculated into minimal media supplemented with either fructose or ribose at the indicated concentrations. As controls, we display the growth 570 of isolates on minimal and rich media. Each data point represents the average of technical duplicates. Using 571 likelihood tests on linear mixed effects models, we found that both ribotype identity (RT255 or Other) and 572 interaction of ribotype identity with substrate (fructose, ribose, or none) improved model performance (P < P573 0.05). 574



Figure 5. Clade 5 ribotypes grow more robustly on simple sugars than Clade 1-4 ribotypes. C. difficile 575 isolates harvested during exponential growth were inoculated into minimal media supplemented with one of 576 577 eight different carbon substrates, including the simple sugars glucose, fructose, tagatose, and ribose. Strip plots visualize the normalized carrying capacity or the additional growth for each isolate on each carbon source 578 579 beyond baseline growth on minimal media. Colors and markers indicate the ribotype and clade of each isolate 580 as shown in Figure 2. Clade 5 isolates included ribotypes 078, 033, 126, and 288. Additional isolates tested 581 belonged to ribotypes 001, 002, 014-020, 017, 027, and 053. Substrates were ordered from left to right by median growth of all isolates as shown in Figure 1. Each data points represents average of technical 582 duplicates. Using likelihood tests on linear mixed effects models, we found that interaction of clade identity 583 584 (Clade 5 or Other) with substrate type (simple sugar vs other sugar) improved model performance (P < 0.001).



Concentration of Yeast Extract

Figure 6. Ribotype 017 isolate grow on trehalose and cellobiose only if pre-cultured on media with high 585 yeast extract. C. difficile strain M68 was profiled for growth in a Biolog PM1 plate after pre-culturing overnight 586 in brain heart infusion with either low (0.5%) or high (5%) yeast extract. Heatmaps display the fold-change for 587 carrying capacity on minimal media supplemented with each substrate relative to carrying capacity on minimal 588 media only. (A-B) All displayed substrates supported the growth of M68 with fold-change values of at least 1.2 589 590 on either or both of the yeast extract concentrations. (A) Heatmap displays only the substrates with foldchange values for growth on high yeast extract that were at least 10% higher or lower than fold-change values 591 for growth on low yeast extract, while (B) heatmap displays the remaining substrates. For each heatmap, 592 substrates were ordered by agglomerative hierarchical clustering of fold-change values using UPGMA. 593



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Figure S1. Normalized carrying capacity (K) for all isolates on the top carbon sources. Colors and
 markers indicate the ribotype and clade of each isolate as shown in Figure 2. Whiskers extend to the farthest
 point within 1.5x of the interquartile range.



597 **Figure S2. Summary chart for the strain set enrichment analysis shown in Figure 3.** Bars display the total 598 count of positive enrichments (red bars) and negative enrichments (blue bars) for each ribotype. Dark and light 599 shading indicates enrichments that are statistically significant or not significant (NS), respectively.



- Figure S3. Normalized carrying capacities for isolates grown on minimal media supplemented with
- either fructose or ribose in the Biolog Phenotype Microarray plates. Colors and markers indicate the
 ribotype and clade of each isolate as shown in Figure 2. Ribotype 255 isolates are marked by purple circles in
- 603 Clade 1. OD: Optical density; MM: Minimal Media.



Figure S4. Growth validation experiment recapitulated patterns detected by the Biolog phenotype
 microarray assays. *C. difficile* harvested during exponential growth was inoculated into minimal media with
 one of four carbon substrates. Colors indicate the ribotype of each isolate as shown in Figure 2.



Figure S5. Unknown limiting factor in yeast extract enabled ribotype 017 to grow on trehalose. Ribotype 607 017 isolate M68 and ribotype 027 isolate CD2015 were grown overnight in brain heart infusion supplemented 608 with high yeast extract, serially diluted in defined minimal media, then grown on minimal media (MM) alone or 609 610 minimal media supplemented with 40 mM trehalose. Overnight cultures were either washed in defined minimal media, or not, prior to dilution and inoculation. Left and right panels display results for M68 and CD2015 611 respectively. Top and bottom panels display results for growth using unwashed and washed inocula 612 respectively. Using unwashed inocula, the maximum optical density of M68 on trehalose decreased with 613 increasing dilution factors which suggests that a limiting factor is necessary for growth on trehalose. In 614 addition, M68 was unable to grow on trehalose after washing likely because washing eliminated this limiting 615 factor. 616

- 617 SUPPLEMENTAL TABLE LEGENDS
- 618
- 619 Table S1. Sources of *C. difficile* isolates.
- 620
- 621 Table S2. Molecular typing of *C. difficile* isolates.
- 622
- Table S3. Composition of *C. difficile* minimal media.