1 Clostridioides difficile-mucus interactions encompass shifts in gene expression,

2 metabolism, and biofilm formation.

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27 ABSTRACT

28 In a healthy colon, the stratified mucus layer serves as a crucial innate immune barrier to protect 29 the epithelium from microbes. Mucins are complex glycoproteins that serve as a nutrient source 30 for resident microflora and can be exploited by pathogens. We aimed to understand how the 31 intestinal pathogen, *Clostridioides diffiicile*, independently uses or manipulates mucus to its 32 benefit, without contributions from members of the microbiota. Using a 2-D primary human 33 intestinal epithelial cell model to generate physiologic mucus, we assessed C. difficile-mucus 34 interactions through growth assays, RNA-Seg, biophysical characterization of mucus, and 35 contextualized metabolic modeling. We found that host-derived mucus promotes C. difficile 36 growth both in vitro and in an infection model. RNA-Seg revealed significant upregulation of 37 genes related to central metabolism in response to mucus, including genes involved in sugar 38 uptake, the Wood-Ljungdahl pathway, and the glycine cleavage system. In addition, we 39 identified differential expression of genes related to sensing and transcriptional control. Analysis 40 of mutants with deletions in highly upregulated genes reflected the complexity of C. difficile-41 mucus interactions, with potential interplay between sensing and growth. Mucus also stimulated 42 biofilm formation in vitro, which may in turn alter viscoelastic properties of mucus. Context-43 specific metabolic modeling confirmed differential metabolism and predicted importance of 44 enzymes related to serine and glycine catabolism with mucus. Subsequent growth experiments 45 supported these findings, indicating mucus is an important source of serine. Our results better 46 define responses of C. difficile to human gastrointestinal mucus and highlight a flexibility in 47 metabolism that may influence pathogenesis.

48

49 **IMPORTANCE**

50 Clostridioides difficile results in upwards of 250,000 infections and 12,000 deaths annually in the

- 51 United States. Community-acquired infections continue to rise and recurrent disease is
- 52 common, emphasizing a vital need to understand C. difficile pathogenesis. C. difficile

53 undoubtedly interacts with colonic mucus, but the extent to which the pathogen can 54 independently respond to and take advantage of this niche has not been explored extensively. 55 Moreover, the metabolic complexity of C. difficile remains poorly understood, but likely impacts 56 its capacity to grow and persist in the host. Here, we demonstrate that C. difficile uses native colonic mucus for growth, indicating C. difficile possesses mechanisms to exploit the mucosal 57 58 niche. Furthermore, mucus induces metabolic shifts and biofilm formation in C. difficile, which 59 has potential ramifications for intestinal colonization. Overall, our work is crucial to better 60 understand dynamics of *C. difficile*-mucus interactions in the context of the human gut.

61

62 INTRODUCTION

63 As the leading cause of hospital-acquired diarrhea, Clostridioides difficile remains an 64 urgent public health threat¹. Although typically classified as a nosocomial pathogen, community-65 acquired cases of C. difficile infection (CDI) now comprise almost half the total number of cases¹. As recurrent CDI affects nearly 50% of first-time patients², a better mechanistic 66 67 understanding of *C. difficile* pathogenesis is crucial to breaking this debilitating cycle. As an 68 obligate anaerobe transmitted via spores, C. difficile germinates within the small intestine and 69 establishes infection in the colon. C. difficile possesses mechanisms to directly adhere to the 70 epithelium during colonization, including surface layer proteins^{3,4}, flagella⁵, type IV pili⁶, and binary toxin in certain epidemic isolates⁷⁻⁹. Before accessing the epithelium, *C. difficile* must 71 72 interact with colonic mucus, a key feature of innate host immunity.

The colonic mucus barrier is stratified, consisting of a diffuse luminal layer of secreted mucins inhabited by commensal microbes and a relatively sterile layer of membrane-bound mucins. The predominant secreted mucin in the colon is MUC2. Among membrane-bound mucins, MUC1 is particularly important in protection from bacterial invasion¹⁰. Past work suggests *C difficile* associates with the mucus barrier at multiple levels. Studies using animal colonization models indicate *C. difficile* inhabits the outer mucus layer¹¹, while others showed

79 co-localization of C. difficile and mucus in CDI patient stool samples, which are particularly rich 80 in MUC1¹². Subsequent work demonstrated direct adherence of *C. difficile* to purified MUC2¹³. This evidence indicates mucus serves as an anchoring point for C. difficile during colonization. 81 82 Mucins are heavily glycosylated, with O-glycans decorating both MUC1 and MUC2 and 83 N-glycans present on MUC1^{10,14,15}. Glycans contribute to 80% of the mass of MUC2, and thus 84 make up a significant proportion of mucin¹⁶. These glycans can be degraded by several 85 bacterial species, providing a rich source of carbohydrates to the microbiota. Monosaccharides 86 available from colonic mucins include fucose, mannose, galactose, N-acetylglucosamine (GlcNAc), N-acetylgalactosamine, and N-acetylneuraminic acid^{14,15}. Following glycan cleavage, 87 the peptide backbone also provides nutrients to the microbiota¹⁴. These backbones are rich in 88 serine, threonine, and proline^{14,17}. In humans, nearly 45% of the amino acid composition of 89 90 MUC1 and over 55% of MUC2 consists of serine, threonine, and proline based on canonical 91 sequences in UniProt (P15941 and Q02817, respectively); others have predicted greater 92 proportions of these amino acids¹⁸. Overall, interactions between commensal microbiota and 93 mucus are often symbiotic, resulting in a thicker, more protective mucus layer for the host and 94 increased nutrient availability for the microbiota^{14,19}. To maintain healthy conditions, mucin 95 degradation by bacteria and regeneration by the host must be carefully balanced. 96 Pathogens can alter and exploit mucus during infection¹⁰. Previous work showed that

oligosaccharide composition within mucus is altered during CDI, and that *C. difficile* reduces expression of human *MUC2* while preferentially interacting with MUC1¹². *C. difficile* also benefits from the cleavage of mucins by specific members of the microbiota²⁰, however, the extent to which mucus is altered or metabolized specifically by *C. difficile* remains unclear. The carbohydrate active enzymes (CAZy) database indicates *C. difficile* R20291 possesses enzymes from 31 families²¹, at least one of which, glycosyl hydrolase family 38, contains enzymes likely involved in mucin degradation²⁰. To our knowledge, no study has assessed the

104 mucolytic capacity of any enzymes listed in the CAZy database for *C. difficile*. Nonetheless,

105 evidence to date indicates that alterations to mucus promote *C. difficile* colonization.

106 There are substantial challenges in obtaining mucus that accurately recapitulates native 107 human mucus in its composition and viscoelasticity²², properties likely vital to *C. difficile*-mucus 108 interactions. Human mucus varies from that of animal models, and the processing of 109 commercial mucins removes important components from native mucus and disrupts its 110 structure²³. Furthermore, immortalized colonic cell lines often do not secrete the same 111 proportions of mucin types as those in a healthy colon, if mucins are secreted at all^{23–25}. 112 Recently, a human primary intestinal epithelial cell (IEC) co-culture system was validated for use with *C. difficile*²⁶. These IECs can secrete a thick mucus barrier²⁷, which can be harvested or 113 114 directly inoculated to assess C. difficile-mucus interactions. Importantly, the biophysical 115 properties and composition of IEC-derived mucus are similar to mucus derived from ex vivo 116 human tissues²⁸.

117 The goal of this study was to assess specific interactions between *C. difficile* and human 118 colonic mucus to better understand the extent to which C. difficile can independently use or 119 manipulate mucus to its benefit. Using the physiologically relevant, primary IEC-derived mucus 120 described above, we measured the contribution of mucus to C. difficile growth. We then used 121 transcriptomics to explore the response of *C. difficile* to mucus and used these data in metabolic 122 modeling to predict how mucus shapes C. difficile metabolism. We additionally assessed the 123 capacity of C. difficile to alter biophysical and biochemical properties of mucus. Our work 124 provides a multi-faceted understanding of C. difficile-mucus interactions, which may influence 125 colonization or disease progression.

126

127 **RESULTS**

128 Mucus derived from primary human IECs promotes C. difficile growth

To test whether colonic mucus derived from primary human IECs supports or promotes *C. difficile* growth, we examined growth *in vitro* in *C. difficile* minimal medium (CDMM)²⁹ containing 1% glucose with and without 50 μ g/mL mucus. We also tested conditions without glucose, wherein mucus was the only source of sugars. All media tested supported *C. difficile* growth due to the presence of casamino acids. In the presence of mucus, *C. difficile* exited lag phase earlier and reached higher maximum OD₆₀₀ than without mucus, both with and without glucose (Fig 1A).

136 In CDMM with glucose, the addition of mucus resulted in faster growth rates (k) during 137 exponential phase ($k = 0.176 \pm 0.013$ OD₆₀₀/hour) compared to the no-mucus condition (k =138 0.140±0.004 OD₆₀₀/hour) (Fig 1B). At 24h, cultures with glucose and mucus contained 2.25-fold 139 more CFU/mL on average than cultures without mucus (Fig. 1C). By the end of exponential 140 phase at 36h, we again recovered more viable cells from conditions with mucus, with 2.10-fold 141 more CFU/mL than without mucus. Without glucose, C. difficile exhibited a higher growth rate 142 during exponential phase with mucus ($k = 0.142 \pm 0.085 \text{ OD}_{600}$ /hour) compared to the no-mucus 143 condition ($k = 0.085 \pm 0.000 \text{ OD}_{600}$ /hour) (Fig 1B). In addition, the presence of mucus increased 144 the number of viable cells; we recovered on average 2.68-fold more CFU/mL at 24h and 8.43-145 fold more CFU/mL at 36h from cultures grown with mucus versus without (Fig. 1C). Altogether, 146 differences in optical density, growth rates, and CFU indicate mucus enhances C. difficile 147 growth, both when mucus supplements glucose and when mucus is the sole carbohydrate 148 source.

Because *C. difficile* exhibited increased growth in media with IEC-derived mucus, we examined growth in co-culture with IECs with and without an intact mucus layer. The IECs were stimulated to produce a robust mucus layer during differentiation as previously described (Fig. 1D, right)²⁷. For controls without mucus, we removed the mucus layer and replaced it with PBS (Fig. 1D, left). *C. difficile* was then inoculated at an MOI ~0.01. After 2h in co-culture, we observed 14.0-fold greater expansion in CFU in co-cultures where the mucus layer was intact

compared to those without mucus (Fig. 1E). Overall, our results indicate that IEC-derived mucus
 promotes *C. difficile* growth, both in broth and in the context of an infection model.

157 Transcriptional profiling suggests mucus alters expression of genes with roles in

158 metabolism and nutrient acquisition

159 To determine how *C. difficile* responds to the IEC-derived mucus, we used RNA-seq to 160 assess transcription in exponential-phase cultures grown with and without 50 µg/mL mucus in 161 CDMM. Because we were most interested in responses to mucus as opposed to stress or 162 starvation, 1% glucose was retained in the media. We identified 282 upregulated and 285 163 downregulated genes in the presence of mucus (567 total; fold change > 2, p-adj < 0.05) (File 164 S2, Fig. 2A). Among the five genes most upregulated in mucus, three are potential transporters 165 (CDR0455, CDR1626, and CDR2495), one is annotated as a TetR transcriptional regulator 166 (CDR0508), and one is annotated as a putative xanthine/uracil permease (CDR2014). The five 167 most downregulated genes are largely annotated as putative or hypothetical proteins, with one 168 probable protease (CDR3145). Principal components analysis indicated that mucus was the 169 main variable contributing to variance in the dataset (Figure 2B).

170 We next used gene set enrichment analysis (GSEA) to identify KEGG pathways 171 enriched in each condition. Using GSEAPreranked with all genes in C. difficile, we identified four 172 gene sets enriched with mucus and seven enriched without mucus (Fig. 2C, File S3). We further 173 refined these results using GSEAPreranked with the 567 most differentially expressed genes. 174 This analysis identified no gene sets significantly enriched in conditions without mucus; with 175 mucus, only the fructose and mannose metabolism pathway remained enriched (nominal p =176 0.049, FDR q = 0.197). Figure 2D shows relative expression of highly differentially expressed 177 genes in this gene set. Among the seven genes contributing to core enrichment, five are 178 annotated as phosphotransferase system (PTS) components, which are important for sugar 179 uptake (Table S1). Specifically, CDR0692-0696 are involved in the transport of sorbitol, a host-180 and diet-derived metabolite³⁰, while CDR2904 likely encodes part of a mannose PTS. These

analyses suggest mucus alters sugar uptake and metabolism in *C. difficile*, which prompted us
to search for additional genes that could play a role in utilizing nutrients from mucus.

183 Increased proportions of amino acids in the gut can lead to increased susceptibility for 184 CDI³¹, with Stickland metabolism playing a key role in the conversion of amino acids for 185 growth³². Proline and glycine are particularly important for reductive Stickland metabolism, in 186 which proline and glycine reductases (PR and GR, respectively) are used to regenerate 187 NAD+³³. Our analysis showed that all but three of the 19 genes within PR and GR clusters were 188 significantly downregulated with mucus (Table S1), suggesting that Stickland reduction of 189 proline and glycine is suppressed by C. difficile during mid-exponential phase when mucus is 190 present.

191 Recent work has revealed the importance of the Wood-Ljungdahl pathway (WLP), which 192 provides metabolic flexibility to *C. difficile* and potential advantages during infection^{34,35}. 193 Expression of WLP genes tends to be inversely correlated with PR and GR³⁶, and increased 194 expression of WLP genes could indicate an abundance of Stickland electron donors, such as 195 alanine, valine, serine, isoleucine, threonine, or glutamic acid^{36,37}. Under such conditions, 196 alternative mechanisms of reduction are needed³⁶. Given apparent inhibition of PR and GR by 197 mucus, we investigated WLP gene expression. Of 38 genes that have been previously identified 198 as part of the WLP or a linked glycine cleavage system (GCS, explained below) in C. difficile, 19 199 were upregulated and 15 were downregulated with mucus (p-adj < 0.05, File S2). We observed 200 increased expression of genes corresponding to branches of the WLP that fix CO₂ and convert it 201 to acetyl-CoA (Table S1). Upregulated genes encoding enzymes in these branches included: fdh 202 and hyd genes for reversible conversion between formate and CO₂; metV and metF encoding 203 components of N^5 , N^{10} -methylene-tetrahydrofolate reductase, *cooS* for fixation of CO₂ via CO 204 dehydrogenase; and homologs of acsE, acsC, acsD, and acsB, which encode components of 205 acetyl-CoA synthase. WLP genes downregulated in mucus corresponded to interconversions 206 between acetyl-CoA and acetate, butyrate, or ethanol. These included homologs of *pta* and *ptb*,

encoding enzymes that convert between acetyl-CoA and acetylphosphate, as well as *ackA* and *buk* for conversion between acetylphosphate and acetate. We also observed downregulation of *thlA, hbd, crt2,* and *bcd-etfAB* homologs for conversion of acetyl-CoA to butyrate, and of *adhE*,
for conversion of acetyl-CoA to ethanol via acetaldehyde.

211 Linked to the WLP is a reversible glycine cleavage system (GCS) that provides additional options for carbon assimilation in *C. difficile*^{36,38}. We observed increased expression 212 213 of gcvH and gcvL, and decreased expression of gcvP and gcvT, which encode components of 214 the glycine cleavage reaction complex^{39,40} (Table S1). Expression of glyA, which encodes a 215 serine/glycine hydroxymethyltransferase to interconvert glycine and serine, was also increased. 216 In addition, sdaB, which encodes a serine dehydratase that produces pyruvate from serine, was 217 upregulated. Overall, the presence of mucus decreased expression of PR and GR gene 218 clusters, but increased expression of genes related to CO₂ fixation via the WLP and glycine and 219 serine catabolism via the GCS.

220 Mechanisms for transcriptional control are differentially expressed with mucus

221 An abundance of genes for transcriptional regulation and responding to environmental 222 stimuli were differentially expressed (File S2), suggesting C. difficile senses mucus. Of highly 223 differentially expressed genes with fold change > 2 (Table S2), many are annotated to encode 224 transcriptional regulators, sigma factors, or antiterminators. Genes encoding transcriptional 225 regulators from the GntR family were most prevalent, and genes annotated as members of the 226 TetR, MarR, AraC, and MerR regulator families were also differentially expressed. These 227 families can regulate many cellular processes, including overall metabolism of carbon and 228 nitrogen (GntR, AraC), stress responses (TetR, AraC), and resistance to antibiotics, metals, or 229 other toxins (MarR, MerR)⁴¹.

Two-component systems play a critical role in sensing and responding to environmental
 stimuli. Among TCS genes (Table S2), CDR1568-1569 were upregulated, while CDR2206-2205,
 hexRK, CDR2021-2020, and CDR2188-2187 were downregulated. Based on work in *C. difficile*

and with orthologous genes in *B. subtilis*, CDR1568-1569 could be involved in maintaining cell
surface homeostasis⁴², while *hexRK*, and potentially CDR2021-2020, are involved in antibiotic
sensing and resistance^{43,44}. Altogether, our data suggest mucus is an important stimulus for *C. difficile*, perhaps indicating increased nutrient availability or proximity to the epithelium.

237 Mutants lacking upregulated genes exhibited altered growth phenotypes with mucus.

238 Among the genes most highly upregulated in *C. difficile* grown with mucus, we identified 239 several predicted to be involved in transport. CDR0455 and CDR2495 were among the five 240 most upregulated genes in mucus (Fig. 2A). CDR0455 forms a predicted operon with CDR0454-241 0453, which were also significantly upregulated (Fig. 3A, File S2). Based on analyses of protein homology in Phyre2⁴⁵, the operon likely encodes three membrane proteins consisting of an 242 243 endopeptidase (CDR0453), Na⁺/H⁺ antiporter (CDR0454), and transport protein (CDR0455). 244 CDR2495 encodes a membrane protein with homology to E. coli GadC, indicating potential 245 function in glutamate/ γ -aminobutyrate exchange. GSEA identified upregulated PTS components 246 within the fructose and mannose metabolism gene set (Figure 2C, 2D, Table S1). Several of 247 these genes belong to a predicted operon encoding a sorbitol PTS encompassing gutM, gutA, 248 srlE (CDR0693), srlE', srlB, and gutD, all of which were significantly upregulated in mucus (Fig. 249 3A. Table S1). Using gRT-PCR, we independently confirmed increased expression of CDR0455. 250 CDR0693, and CDR2495 under conditions used in the RNA-Seq experiment (Fig. S1). Given 251 consistent upregulation of these genes and their potential role as transporters, we predicted that 252 deletions in these genes would result in reduced growth in mucus. Thus, we generated in-frame 253 gene and operon deletions in *C. difficile* R20291: Δ 0453-0455, Δ 0693-0696, and Δ 2495.

We evaluated growth of the mutants in CDMM containing 1% glucose with or without 50 µg/mL mucus (Fig. 3B). Like wildtype, all mutants had higher growth rates with mucus than without (Fig. 3C). While wildtype and mutants showed similar growth in the absence of mucus, unexpectedly, the $\Delta 0693-0696$ and $\Delta 2495$ mutants had significantly higher growth rates relative to wildtype in mucus. Furthermore, after 24h $\Delta 0453-0455$ and $\Delta 0693-0696$ had 2.99-fold and

3.24-fold more CFU/mL with mucus, relative to respective growth without mucus (Fig. 3D). We observed similar, albeit statistically insignificant, trends with wildtype and Δ 2495 in mucus. In media lacking glucose, we again observed that all strains had significantly more growth overall with mucus than without mucus based on OD₆₀₀ measurements and CFU at 24h (Fig. S2A-C). However, in the absence of glucose, mucus did not significantly alter growth rates for any strain (Fig. S2D), and the increased growth rates and shorter lag phases of mutants in conditions with glucose were not observed.

To assess growth phenotypes in a native mucus layer, we evaluated the growth of each mutant in co-culture with IECs and an intact mucus layer. After 6h co-culture, we observed at least one log of growth for all strains (Fig. 3E). Consistent with results from broth culture experiments, the mutants tended toward more growth relative to wildtype, with significantly greater growth of $\Delta 2495$ (6.17-fold more CFU/mL for $\Delta 2495$ vs. wildtype; Fig. 3E). Altogether, mutations in the selected genes and operons did not lead to growth defects in mucus as we predicted, but instead resulted in greater growth than wildtype under these conditions.

273 *C. difficile* biofilm formation may increase viscosity of ex vivo mucus.

274 To evaluate the extent to which C. difficile can manipulate mucus, we performed 275 biophysical and biochemical analyses on native ex vivo mucus incubated for 24 hours with and 276 without C. difficile. Importantly, C. difficile remained viable and expanded within ex vivo mucus 277 (Fig. S3A). We applied particle tracking microrheology (PTMR) to measure the viscosity C. 278 difficile- and mock-inoculated mucus, using a Gaussian mixture model to distinguish watery 279 (less viscous) vs. mucoid (more viscous) fractions of mucus^{28,46–48}. After 24 hours, mucus 280 containing C. difficile had more mucoid signal relative to the mock-inoculated control, as 281 indicated by increased detection of microbeads within the mucoid vs. watery fraction (Fig. 4A, 282 4C). This increased mucoid fraction corresponded to greater complex viscosity in samples 283 containing C. difficile relative to the mock-inoculated control (Fig. 4B). Multiangle laser light 284 scattering (MALLS), which measures mucin molecular weight, radius of gyration, and

concentration, indicated no changes in these metrics between inoculated and mock-inoculated
samples after 24h (Fig S3B-D).

287 While results indicate that C. difficile does not break down mucins sufficiently to detect 288 decreased molecular weights, the observed increase in viscosity could reflect additional ways C. 289 difficile responds to mucus. Biofilm formation within mucus can lead to increased viscosity, as observed with *Pseudomonas aeruginosa*⁴⁸. We therefore examined the impact of mucus on *C*. 290 291 difficile biofilm formation in vitro. We detected significantly greater biofilm biomass for C. difficile 292 grown with mucus versus without mucus (Fig. 4D), indicating that mucus promotes biofilm 293 formation, which may contribute to the increased viscosity we observed. 294 Metabolic modeling predicts increased uptake of specific amino acids from mucus. 295 To assess the metabolic potential of *C. difficile* during growth in mucus, we used 296 RIPTiDe to contextualize an established genome-scale metabolic network reconstruction 297 (GENRE) for *C. difficile* R20291 with our transcriptomic data^{49–51}. To recapitulate conditions from 298 the RNA-Seq experiment, we allowed the model to use mucin-derived monosaccharides for 299 conditions with mucus and excluded them from the no-mucus condition. Ordination analyses 300 revealed that predicted core metabolic activity was distinct between conditions with and without 301 mucus (Fig. 5A). These differences in metabolic activity corresponded to a predicted 52.6% 302 increase in biomass flux, a proxy for growth rate, in conditions with mucus versus without (Fig. 5B). Overall, comparing biomass fluxes to experimental data (Fig. 1, 3) suggests the model 303 304 accurately predicted growth trends given respective transcriptomic contexts. 305 To rank relative importance of reactions in contributing to predicted differences in

biomass, we used a Random Forests classifier to determine mean decrease accuracies (MDA)
(Fig. 5C). The positive or negative median flux values shown indicate directionality of each
reaction. The first two reactions, corresponding to glycine hydroxymethyltransferase (GHMT)
and glycine synthase, are involved in the GCS. Negative flux values for GHMT indicated
conversion from serine to glycine in the mucus condition, while flux in the opposite direction was

311 predicted without mucus. Negative flux for glycine synthase also indicated biosynthesis of 312 glycine from 5,10-methylenetetrahydrofolate, which simultaneously generates NAD+, in the 313 presence of mucus. NADPH:oxidized-thioredoxin oxidoreductase and L-Glu:NAD+ 314 oxidoreductase are also involved in redox chemistry. In the presence of mucus, positive flux 315 indicated oxidation of NADPH and reduction of thioredoxin was predicted for the former, and 316 negative flux indicated oxidation of NADH and reduction of 2-oxoglutarate to L-glutamate was 317 predicted for the latter. These results suggest glycine biosynthesis and regeneration of electron 318 carriers is important in the presence of mucus.

319 Reactions converting or transporting GlcNAc were also among the most important. GlcNAc is a mucin-derived monosaccharide that can stimulate biofilm formation in C. difficile⁵², 320 321 and is a component of biofilms^{50,53}. For GlcNAc-1-phosphate 1,6-phosphomutase, negative flux 322 values with mucus indicated conversion from GlcNAc-1-phosphate to GlcNAc-6-phosphate (Fig. 323 5C). For GlcNAc transport, negative flux values, which were 8.42-fold greater with mucus than 324 without, indicated conversion of GlcNAc-6-phosphate to GlcNAc. Direct analysis of GlcNAc 325 exchange suggested that GlcNAc efflux was due to flux through the above reactions, with 5.16-326 fold greater efflux with mucus than without (Fig. 5D).

327 Because glycine and serine are involved in reactions with the greatest MDA, we 328 examined predicted uptake for these amino acids. Glycine exchange was predicted to be 329 negligible in both conditions. Serine uptake, however, was predicted only in conditions with 330 mucus (Fig. 5E). This result makes sense considering flux through GHMT predicted 331 biosynthesis of glycine from serine in conditions with mucus, whereas without mucus, opposite 332 flux toward serine biosynthesis was predicted. As mucins are proline-, threonine-, and serine-333 rich, we also examined predicted uptake of proline and threonine. We observed 1.53-fold 334 greater threonine uptake with mucus versus without. However, we observed the opposite trend 335 for proline uptake, with 29.4-fold more uptake predicted for the no-mucus condition versus with 336 mucus. These results coincide with RNA-Seq data suggesting proline metabolism via PR is less

337 active with mucus. Nonetheless, predicted increases in threonine and serine uptake in mucus

are intriguing as glycans are attached to mucins at serine and threonine residues.

339 Mucus restores growth in defined media lacking specific amino acids.

340 Metabolic modeling predicted glycine and serine interconversion to be particularly 341 important for differentiating growth with versus without mucus, and also predicted greater 342 uptake of serine and threonine from conditions with mucus. Hence, we experimentally 343 investigated the importance of these amino acids using DCAMM, a modified version of CDMM 344 with defined amino acid composition. We assessed growth with and without mucus in media 345 containing all amino acids (complete), lacking threonine (-T), or lacking serine (-S). Due to 346 interconversion of glycine and serine, we also assessed media lacking glycine (-G) or lacking 347 glycine and serine (-G -S). Importantly, complete DCAMM supported C. difficile growth 348 comparably to CDMM, with similar patterns of growth, including higher growth rates and more 349 CFU/mL at exponential phase, with versus without mucus (Fig. 1, 3, 6).

Removing threonine from the medium did not affect growth, but addition of mucus to -T media promoted growth overall relative to conditions without mucus, as indicated by slightly faster exits from lag phase (Fig. 6A) and increased growth rates (0.255±0.074 OD₆₀₀/h with mucus vs. 0.217±0.018 without, Fig. 6D). However, we did not observe changes in CFU between conditions with and without mucus in -T media at mid-exponential phase (Fig. 6C).

Conditions lacking both glycine and serine resulted in significant growth defects,
particularly a prolonged lag phase (Fig. 6A, 6B). Addition of mucus to -G -S medium enhanced
growth (Fig. 6B), yielding 24.3-fold more CFU/mL than -G -S medium without mucus (Fig 6C).
Growth rates between the two conditions were similar (Fig. 6D). Overall, a lack of glycine and
serine lengthened lag phase, and addition of mucus partially ameliorated this effect (Fig. 6B).
Cultures in -S medium without mucus also took longer to exit lag phase relative to -S
medium with mucus (Fig. 6A, 6B). Similar to -G -S conditions, addition of mucus increased

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growth such that curves appeared more similar to those from complete media with mucus (Fig.

6B). In addition, growth in -S media with mucus yielded 3.65-fold more CFU/mL with mucus versus without (Fig. 6C). In contrast, growth in -G media largely matched that in complete media (Fig. 6A, 6B), with 1.74-fold more CFU/mL and significantly increased growth rates with mucus compared to no mucus ($k = 0.219\pm0.026$ vs. 0.131 ± 0.004 OD₆₀₀/h) (Fig. 6C, 6D). Together, these results indicate that lack of serine has a greater impact on *C. difficile* growth than glycine in the absence of mucus and suggests mucus serves as a source of serine.

369

370 **DISCUSSION**

In this study, we demonstrated that mucus derived from primary human IECs enhances *C. difficile* growth and produces a variety of responses in the pathogen, particularly changes in metabolism. These changes emphasize the metabolic plasticity and complexity of *C. difficile* in its adaptive responses to mucus, which may involve differential sensing and transcriptional regulation. Conversely, induction of biofilm formation by *C. difficile* may impact the viscoelastic properties of mucus, which has ramifications for persistence.

377 Prior work examining the ability of *C. difficile* to utilize mucus as a nutrient source 378 indicated that other bacterial species are needed to liberate moleties from mucus. Our finding 379 that a low concentration of mucus produced a consistent, albeit subtle, increase in growth 380 indicates C. difficile can metabolize mucus independently. Indeed, this concentration was even 381 sufficient to elicit dramatic shifts in gene expression. Nonetheless, it remains likely that 382 contributions from other species *in vivo* enhances the use of mucus as a growth substrate. 383 Distinct properties of the mucus models used may have contributed to these different outcomes. 384 Prior work employed mucus from commercialized sources and immortalized cell lines and 385 applied a purification process resulting in a mono-component mucus containing a single mucin 386 type (MUC2)^{20,23}. In contrast, our strategy was to remove free sugars and nutrients while 387 retaining as many features of native mucus as possible. Thus, the mucus we used to

supplement media would have retained more of the components and mucin types of nativecolonic mucus, better reflecting nutrient availability in the colon.

390 In the presence of mucus, we observed increased expression of genes contributing to 391 CO₂ fixation via the WLP, and of genes encoding enzymes within the GCS, which is linked to the 392 WLP via methylene-THF (Fig. 7). The WLP may be particularly important later in infection, such as when electron acceptors for Stickland metabolism are low⁵⁴. However, others have reasoned 393 394 that the WLP remains important under heterotrophic conditions to allow utilization of CO₂ 395 produced during glycolysis³⁵. Metabolic modeling emphasized the importance of the GCS and 396 the conversion of serine to glycine in the presence of mucus (Fig. 7), as predicted fluxes from 397 the GCS and from GHMT indicate that glycine biosynthesis is particularly important. Glycine is a 398 key electron acceptor in Stickland metabolism, where it is reduced to acetylphosphate via 399 GR^{33,34}. We observed reduced expression of GR with mucus, suggesting alternative 400 mechanisms for glycine metabolism under the conditions tested.

401 Serine also appears to be important during growth in mucus. Metabolic models predicted 402 uptake of serine only when mucus is present and a role for serine in glycine biosynthesis via 403 GHMT. Consistent with this prediction, the growth defect observed in DCAMM lacking serine 404 was improved by adding mucus, suggesting that mucus is a source of serine for C. difficile. 405 Importantly, serine deamination is one of the largest contributors to the pyruvate pool in C. *difficile*³⁶ (Fig. 7), thus influencing glycolysis, the TCA cycle, and the WLP³⁴. In addition, 406 407 pyruvate fermentation is linked to toxin repression^{55,56}, so an increase in serine uptake from 408 mucus has potential ramifications for C. difficile pathogenesis. Overall, serine and glycine likely 409 contribute synergistically to the flexibility of *C. difficile* metabolism and its growth. 410 Experimental data and metabolic modeling suggest that mucus stimulates biofilm

formation (Fig. 7). *C. difficile* has been demonstrated to form biofilms on purified MUC2,

- 412 particularly in co-culture with *Fusobacterium nucleatum*¹³, suggesting *C. difficile* can form
- biofilms in the human colon. Several biofilm-related genes, such as those involved in GlcNAc

414 biosynthesis^{57,58} and polysaccharide II synthesis and export⁵⁹, were upregulated in the mucus 415 condition (File S2). In line with these data, metabolic modeling predicted the efflux of GlcNAc, a component of biofilm polysaccharides from various organisms^{60–63}. Furthermore, when provided 416 417 alongside pyruvate, GlcNAc promotes biofilm formation⁵². Past work in *B. subtilis* indicated GlcNAc export was enhanced by manipulating features of glucose metabolism⁶⁴; we can thus 418 419 speculate that alterations to C. difficile metabolism may promote the GlcNAc efflux predicted by 420 modeling (Fig. 7). Others have noted increased production of proteins from the WLP and GCS 421 in some biofilm models⁶⁵, indicating that there are several potential connections between *C*. 422 difficile metabolic activity and mucus-induced biofilm formation. 423 Biophysical and biochemical analyses did not demonstrate substantive breakdown of 424 mucins by C. difficile independently, which fits prior evidence that multiple species working in 425 concert are required for efficient degradation of mucins^{20,66,67}. Nonetheless, given the repertoire 426 of carbohydrate-active enzymes in C. difficile R20291²¹, activity may exist to cleave glycans or 427 other fragments from mucus without producing detectable differences in molecular weight. 428 Indeed, we observed significant upregulation of 31 of the 72 CAZy genes in *C. difficile* (File S2), 429 including enzymes with potential mucolytic activity^{20,68,69}. 430 Many genes related to transcriptional regulation and signal transduction were 431 differentially expressed in response to mucus. In a past study looking at the transcriptional response of *Pseudomonas aeruginosa* to mucus-supplemented media⁷⁰, researchers concluded 432 433 that selection for specific regulatory and signaling mechanisms likely led to the differential 434 expression of metabolism-related genes they observed with mucus. The differential expression 435 of transcriptional regulators in our dataset could contribute to the phenotypic and metabolic 436 changes we observed with mucus, but further exploration into these mechanisms is needed. 437 Finally, deleting genes upregulated during growth in mucus, which included genes with 438 predicted roles in sugar uptake or transport, did not lead to growth defects in mucus. Instead, 439 mutants exhibited growth that exceeded that of wildtype. These unexpected growth phenotypes

440 could be related to tradeoffs in adaptation to versus growth in mucus. The identification of many 441 differentially expressed genes related to transcriptional control and signal transduction supports 442 a role for mucus as a stimulus to alter C. difficile metabolism, and indeed, mucin glycans have 443 been widely demonstrated to stimulate shifts in microbial gene expression and behavior⁷¹. 444 Moreover, it has been posited that a greater capacity to sense multiple nutrients in an environment is metabolically costly, contributing to longer lag phases⁷². Under these 445 446 assumptions, inefficiencies in sensing, as might be expected for strains lacking transporters⁷³, 447 could result in shorter lag phases but incur other long-term fitness costs. Further analysis for 448 gene essentiality may identify mechanisms C. difficile relies on in its interactions with mucus. 449 Overall, our data support a model in which colonic mucus promotes C. difficile growth as 450 a source of specific amino acids and a likely source of carbohydrates, which could translate to 451 enhanced colonization in vivo. Alterations in expression observed with mucus highlight the 452 metabolic flexibility of C. difficile, which is likely a key factor for biofilm formation and persistence in a dynamic host environment³⁵. Importantly, biofilms are a main contributor to recurrence⁷⁴, 453 454 providing an environment protected from antibiotics and from which spores can be generated to 455 promote continued infection⁷⁵. Our work demonstrates that *C. difficile* possesses mechanisms to 456 take advantage of this niche. In better understanding C. difficile-mucus interactions, more 457 effective therapeutics to disrupt colonization or promote mucosal immunity can be developed. 458

459 MATERIALS AND METHODS

Bacterial strains and growth conditions. Table S3 lists strains and plasmids used in this
study. *Clostridioides difficile* R20291 was routinely cultured in TY (3% w/v Bacto tryptone, 2%
w/v yeast extract, 0.1% w/v thioglycolate)⁷⁶, BHIS (3.7% w/v brain heart infusion, 0.5% w/v
yeast extract, 0.1% w/v cysteine)⁷⁶, *C. difficile* minimal medium (CDMM)²⁹, or CDMM with
defined amino acids (DCAMM, described below and in File S1) at 37°C in an anaerobic
chamber (Coy) with an atmosphere of 5% CO₂, 10% H₂, and 85% N₂. *E. coli* strains were grown

aerobically at 37°C in lysogeny broth (LB, Miller), and conjugations with C. difficile performed 466 467 anaerobically. Methods for cloning and *C. difficile* mutagenesis, as previously applied^{77,78}, are 468 detailed in Text S1. Preparation of C. difficile cultures for growth assays are detailed in Text S1. 469 Primary human intestinal epithelial cell (IEC) cultures and generation of a mucus layer. All 470 IECs were derived from the transverse colon of a 23-year-old male cadaveric donor. Cultures were maintained in Sato's Expansion Medium (Sato's EM)⁷⁹. Transwells (0.4 µm pore, PET, 471 472 Corning) were coated with 10 µg/mL collagen at least four hours prior to seeding cells in 473 Expansion Medium (EM). EM was replaced every other day until a confluent monolayer formed 474 (5-7 days, or until trans-epithelial electrical resistance measured \geq 500 ohms x cm²). To 475 generate a mucus layer, confluent monolayers were cultured in differentiation medium with 330 ng/mL vasoactive intestinal peptide (DM+VIP) in an air-liquid interface^{27,28}. DM+VIP was 476 477 replaced daily. File S1 contains compositions of cell culture media. 478 **Ex vivo mucus purification.** After 4-5 days of differentiation, mucus was removed from the 479 apical surface of the IECs. Epithelia were rinsed with PBS to collect residual mucus. Collected 480 mucus and rinses were stored at -20°C prior to purification. Mucus samples were pooled and 481 filtered using nominal molecular weight limit membranes (Amicon Ultra 3K, Millipore Sigma) to 482 remove free nutrients, metabolites, and contaminants. This purified mucus was suspended in PBS, and total mucus protein concentration was determined using PierceTM BCA Protein Assay 483 (Thermo Fisher) for standardization¹². For supplementing media, a relatively low standard 484 485 concentration of 50 µg/mL mucus was used due to limited availability of IEC-derived mucus. 486 C. difficile-IEC co-cultures. Mucus-producing IECs (4-5 days in DM+VIP) were used to assess 487 growth of C. difficile with or without a mucus barrier. Controls lacking mucus were prepared by 488 removing the mucus layer and rinsing epithelia three times with PBS. PBS was then added to 489 the apical compartment (100 µl, approximately the same volume as mucus). IECs were 490 transferred to an anaerobic chamber and inoculated with C. difficile (10^3 CFU, MOI ~0.01). To

491 recover C. difficile after co-culture, 0.1% DTT in PBS was added to each apical compartment, 492 then the plate was placed on a rocking platform for 20 minutes at room temperature break down 493 mucus. CFU in the apical compartment were enumerated by plating serial dilutions. 494 **RNA-sequencing.** Early stationary phase cultures in TY broth were pelleted and washed with 495 PBS, then inoculated into CDMM with or without 50 μ g/mL mucus at an OD₆₀₀ of 0.05. At 496 exponential phase (OD₆₀₀ ~0.5), cultures were collected and RNA extracted using TriZol as 497 described⁸⁰, followed by purification and DNase treatment (RNeasy kit, RNase-Free DNase Set, 498 Qiagen). RNA was submitted for 150 bp paired-end sequencing on an Illumina HiSeq platform 499 (Azenta Life Sciences). Read processing, including quality assessment, filtering, and mapping steps, were performed using established bioinformatic tools^{81–83}. To perform genomic feature 500 501 counting, we used a prokaryote-specific algorithm, Feature Aggregate Depth Utility (FADU; 502 v1.8)⁸⁴. After obtaining read counts per gene, we used DESeg2 (v1.42.0) in R for differential 503 expression analysis⁸⁵. For Gene Set Enrichment Analysis (GSEA, v4.1.0)^{86,87}, we used 504 normalized counts from DESeq2 and gene sets from KEGG. We then used default ranking 505 metrics generated by GSEA to run GSEAPreranked and generate normalized enrichment 506 scores for each gene set. We also narrowed the list of genes applied to GSEAPreranked to only 507 those meeting a differential expression threshold (Benjamini-Hochberg corrected p < 0.05, fold 508 change > 2), using Log_2 fold change as the ranking metric. Select differentially expressed genes were validated using gRT-PCR as previously described^{78,88,89}. Text S1 contains further RNA 509 510 isolation, read processing, and gRT-PCR details. 511 Ex vivo mucus preparation for biophysical and biochemical characterization. Mucus was

collected and stored at -20°C, then pooled before use to achieve sufficient material. To the pool,
CDMM salts (final concentration in mucus 0.5X), trace salts (1X), iron sulfate heptahydrate (1X),
and vitamins (1X) (File S1) were added to provide minimally necessary components for *C. difficile* survival. To ensure adequate mucus concentration (>2.5% solids), aliquots were dried
and percent solids determined by comparing initial aliquot weight to dry weight. To prepare *C*.

difficile inoculums, cultures were grown to exponential phase in CDMM with 50 µg/mL mucus,
then pelleted and washed with CDMM salts (1X) and trace salts (1X) (File S1, hereafter 1X
CDMM salts). Mucus samples were inoculated with 10⁶ CFU *C. difficile* in 1X CDMM salts at a
1:20 dilution. To prepare controls lacking *C. difficile*, we mock-inoculated mucus with 1X CDMM
salts. Samples were collected at inoculation and 24 hours post-inoculation to confirm *C. difficile*viability and for biophysical and biochemical analyses.

523 **Biophysical and biochemical analysis of** *ex vivo* **mucus.** Biophysical analysis using particle

524 tracking microrheology (PTMR) to determine complex viscosity of *ex vivo* mucus was performed

525 as described^{28,90,91}. Biochemical analyses using multiangle laser light scattering (MALLS) to

526 measure mucin molecular weights, radii of gyration, and concentrations in *ex vivo* mucus were

527 also performed as described²⁸. Specific details for each technique are in Text S1.

528 **Biofilm assays.** Overnight cultures of *C. difficile* grown in TY broth were pelleted and washed

529 with PBS, then diluted 1:30 in CDMM with or without 50 μg/mL mucus. Cultures were grown to

an OD₆₀₀ 0.8-1, normalized toOD₆₀₀ 0.5, and aliquoted into untreated 96-well polystyrene plates.

531 Assay methods were adapted from past work^{92–94}; details are in Text S1.

532 Context-specific metabolic modeling. We contextualized a published C. difficile R20291

533 genome-scale metabolic network reconstruction (GENRE) for conditions with and without

534 mucus as described^{49–51}, using transcript per million values from the RNA-Seq experiment and

the maxfit_contextualize() function in RIPTiDe with default settings. The model was constrained

to fit minimal media conditions used (CDMM with or without mucus)⁴⁹. Bray-Curtis dissimilarity,

537 nonmetric multidimensional scaling, and PERMANOVA statistical testing were performed using

538 the vegan R package (v.2.6-4)⁵⁰. To determine reactions important for differentiating conditions,

supervised machine learning was performed using the randomForest R package (v. 4.7-1.1)⁵⁰.

540 Differences in predicted fluxes were determined using Wilcoxon rank sum test⁵⁰.

541 Growth experiments with defined amino acids minimal medium (DCAMM). To test the

542 contribution of glycine, serine, or threonine to *C. difficile* growth while keeping conditions

543 consistent with prior experiments, we created a defined casein amino acids minimal medium 544 (DCAMM, File S1). To approximate relative proportions of each amino acid in 10 mg/mL 545 casamino acids (the concentration in CDMM), amino acid content for bovine casein (alpha-S1, 546 alpha-S2, and beta casein subunits, UniProt IDs P02662, P02663, P02666 respectively) was 547 used. All other components of DCAMM were unchanged. C. difficile growth curves in each 548 media with or without 50 µg/mL mucus were performed as described in Text S1. 549 Data Availability. Unless otherwise noted, all statistical analyses were performed using R 550 (v4.3.2) or GraphPad Prism 10. R, Python, and bash scripts for applying bioinformatic tools are 551 available from GitHub: https://github.com/klfurtado/2024 Cdiff Mucus Paper. RNA-Seg reads 552 are available from NCBI Gene Expression Omnibus (GSE254621). 553 554 ACKNOWLEDGEMENTS 555 This work was supported by NIH R01-DK120606 to RT and NLA; NIH R01-Al143638 to RT; and 556 NIH P30-DK065988 and Cystic Fibrosis Foundation HILL20Y2-OUT to DBH. NLA has a 557 financial interest in Altis Biosystems. We thank Kimberly Walker for her careful review of the 558 manuscript and Jilarie Santos Santiago for her assistance in maintaining IEC cultures. 559 560 561 562 563 564 565 566 567 FIGURES 568



569 570 Figure 1. Mucus derived from primary human IECs enhances C. difficile growth. (A) 571 C. difficile R20291 growth curves in CDMM containing purified mucus and glucose (+/+). 572 glucose only (-/+), purified mucus only (+/-), or no mucus or glucose (-/-). Data are from one representative experiment, n=4. (B) Growth rates during exponential phase in each medium. 573 Exponential phase was defined by having at least three time points in a linear range; samples 574 575 for which at least three time points in a linear range could not be identified were excluded. (C) 576 Viable cell counts expressed as CFU/mL after 24 hours (left) and 36 hours (right) growth in each medium. (D) Schematic of the primary human IEC co-culture system. IECs secrete produce a 577 thick mucus barrier that can be inoculated with bacteria (right). As a control, the mucus layer 578 was removed mechanically and replaced with PBS (left). (E) C. difficile viable cell counts after 579 580 2h co-culture with IECs. CFU/mL values were normalized to the CFU/mL present in the 581 respective inoculum, then expressed relative to the mean normalized CFU/mL in the PBS 582 condition. Data are from three independent experiments, n=3 per experiment. *p < 0.05, **p < 0.01, ***p < 0.001, ****p < 0.0001, unpaired, two-tailed t-test. 583 584







601 602 Figure 3. Deletion of genes and operons upregulated with mucus enhances growth. (A) 603 Log₂ fold change expression values and standard error for genes and operons selected for mutagenesis. CDR0453-0455 and CDR2495 were among the most highly upregulated; 604 605 CDR0693-0696 contributed to core enrichment of the fructose and mannose metabolism gene 606 set in mucus (Fig 2). Predicted functions based on Phyre2 analysis or prior studies are 607 indicated. (B) Growth curves for mutants and wildtype in CDMM with mucus (filled symbols) and 608 without mucus (open symbols). Data are from one representative experiment, n=3. (C) Growth rates during exponential phase. (D) Viable cell counts expressed as CFU/mL. (E) Viable cell 609 610 counts after 6h co-culture with IECs with an intact mucus barrier. Viable cell counts are 611 expressed as CFU/mL in each sample after 6h, normalized to CFU/mL present in respective inoculum for each strain. Data are combined from two independent experiments, n=2 or 3 per 612 613 experiment. Outliers were determined and removed using Grubbs' method. *p < 0.05, **p < 0.01, ***p < 0.001, ****p < 0.0001, one-way ANOVA with Tukey's or Sidak's tests 614 615



616 617 Figure 4. C. difficile increases viscosity of ex vivo mucus. (A) PTMR analysis of ex vivo IEC mucus inoculated with C. difficile or mock-inoculated with 1X CDMM salts. A Gaussian mixture 618 model was employed to distinguish mucoid rheological behavior from that of watery mucus after 619 620 24 hours. An increasing frequency of detection of microbeads within the mucoid fraction is 621 indicated by larger green peaks. (B) Complex viscosity (n^*) of mucus-grown samples after 24h. 622 Individual points represent measured complex viscosity from each microbead, and crosses 623 represent mean η^* per sample. (C) Quantified mucoid fractions in mucus inoculated with C. difficile relative to the mock-inoculated control based on PTMR data in (A) For each sample, 624 625 three slides were prepared and 10 videos recorded per slide. (D) Biofilm formation by C. difficile 626 in CDMM with or without mucus after 24h, expressed as absorbance at 570nm for each sample 627 relative to mean absorbance of the no mucus condition. Data from 2 independent experiments, 628 n=4 per experiment, were combined. **p < 0.01, unpaired two-tailed t-test. 629



631 Figure 5. Modeled C. difficile growth predicts distinct metabolic activity in the presence 632 of mucus. (A) Predicted core metabolic activity for C. difficile from conditions with vs. without mucus, using a C. difficile GENRE contextualized with transcriptomic data. Data are 633 634 represented as NMDS ordination of the Bray-Curtis dissimilarity of flux distributions from shared reactions in each contextualized model. Differences between conditions were determined by 635 636 PERMANOVA. (B) Predicted biomass flux in CDMM with vs. without mucus. (C) Median fluxes 637 for reactions determined by Random Forests analysis to be important in differentiating 638 conditions with (green) vs. without mucus (blue). Reactions are ranked by MDA with larger 639 values indicating greater importance. (D) Predicted GlcNAc efflux in conditions with vs. without 640 mucus. (E) Predicted uptake of the indicated amino acids in conditions vs. without mucus. Data 641 were generated from n=250 samplings from each contextualized model. Median flux values in 642 B, D, and E are indicated (white dot). Differences in B, D, and E were determined by measuring p-values from a Wilcoxon rank sum test based on n=12 random subsamples from each 643 644 condition (5% of total samples). This random subsampling and testing process was repeated 1000 times and the median p-value was used: *p < 0.05, **p < 0.01, ***p < 0.001, ****p < 645 646 0.0001.





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649 Figure 6. Mucus restores growth in media lacking specific amino acids. (A) C. difficile 650 growth curves in a modified version of CDMM with defined casamino acids (DCAMM) without 651 mucus (left) and with mucus (right), comparing growth between complete medium and media 652 lacking specific amino acids. (B) Growth curves from (A) comparing growth with and without mucus (filled vs. open symbols) for specific conditions: lacking glycine and serine (left), lacking 653 654 serine only (middle), and lacking glycine only (right). The growth curve from complete medium with mucus is shown on each graph for comparison (grey). (C) Viable cell counts (CFU/mL) at 655 656 exponential phase. For each pair of media conditions with and without mucus, samples were 657 collected when cultures for either condition first reached exponential phase (OD₆₀₀ \sim 0.5), which occurred at: 12 hours for complete, -G, and -T media; 16 hours for -S medium; and 20 hours for 658 -G -S medium. (D) Growth rates during exponential phase. * p < 0.05, ** p < 0.01, *** p < 0.001, 659 660 **** p < 0.0001 determined by (C, D) one-way ANOVA with Sidak's test.

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Figure 7. Overview of responses to IEC mucus in C. difficile. Simplified diagram of key reactions in the metabolic model and/or identified in the RNA-Seq experiment. Thicker green arrows indicate select reactions determined to be important in Random Forests analysis following contextualization of a C. difficile R20291 metabolic model; arrow directions indicate the direction of flux predicted with mucus. Paths within which we identified upregulation of genes corresponding to enzymes are identified with thin green lines. Abbreviations: Ser, serine; Thr, threonine; Gly, glycine; GHMT, glycine hydroxymethyltransferase; Methylene-THF, methylene-tetrahvdrofolate: GlcN-6P. glucosamine-6-phosphate: GlcNAc. N-acetvlglucosamine: GlcNAc-6P, N-acetylglucosamine-6-phosphate; GlcNAc-1P, N-acetylglucosamine-1-phosphate; CO₂, carbon dioxide; CO, carbon monoxide. Created with Biorender.com.

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