# **3D** mapping of host-parasite-microbiome interactions

# reveals metabolic determinants of tissue tropism and disease tolerance in Chagas disease

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42 **Abstract:** Chagas disease (CD) is a parasitic infection caused by *Trypanosoma cruzi* protozoa. 43 Over 8 million people worldwide are T. cruzi-positive, 20-30% of which will develop 44 cardiomyopathy, megaoesophagus and/or megacolon. The mechanisms leading to 45 gastrointestinal (GI) symptom development are however poorly understood. To address this 46 issue, we systematically characterized the spatial impact of experimental T. cruzi infection on the 47 microbiome and metabolome across the GI tract. The largest microbiota perturbations were 48 observed in the proximal large intestine in both acute and chronic disease, with chronic-stage 49 effects also observed in the cecum. Strikingly, metabolomic impact of acute-to-chronic stage 50 transition differed depending on the organ, with persistent large-scale effects of infection 51 primarily in the oesophagus and large intestine, providing a potential mechanism for GI 52 pathology tropism in CD. Infection particularly affected acylcarnitine and lipid metabolism. Building on these observations, treatment of infected mice with carnitine-supplemented drinking 53 54 water prevented acute-stage mortality with no changes in parasite burden. Overall, these results 55 identified a new mechanism of disease tolerance in CD, with potential for the development of 56 new therapeutic regimens. More broadly, these results highlight the potential of spatially-57 resolved metabolomic approaches to provide insight into disease pathogenesis, with translational applications for infectious disease drug development. 58

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60 **Introduction:** Chagas disease (CD), also known as American trypanosomiasis, is a neglected tropical disease endemic in Latin America<sup>1</sup>. However, due to migration CD now has a global 61 reach spanning North America, Europe and Asia<sup>2</sup>. Six to eight million people are infected with 62 T. cruzi, with approximately 12,000 deaths per year  $^3$ . CD is caused by infection with the 63 64 protozoan parasite *Trypanosoma cruzi*. Infected individuals pass first through an acute disease 65 stage, usually asymptomatic, then to a chronic asymptomatic (indeterminate) stage that can last 66 for decades. Thirty to forty percent of infected individuals progress from indeterminate to determinate (symptomatic) chronic CD<sup>4</sup>, 20-30% with cardiovascular complications (heart 67 failure, arrhythmias, and thromboembolism) and 15-20% of infected individuals with 68 gastrointestinal (GI) symptoms (megaesophagus and megacolon)<sup>5</sup>. Digestive CD has been 69 70 neglected compared to cardiac CD and consequently is much more poorly understood. However, 71 recent studies using bioluminescent parasites in mouse models have shown that specific sites in 72 the GI tract are parasite reservoirs in chronic CD and may be major contributors to cardiac

real symptom development, particularly after treatment failure <sup>678</sup>. Treatment of GI CD is also

real challenging, with limited options once symptoms become apparent  $^{1}$ . There is therefore a strong

75 need to improve our understanding of the interaction between *T. cruzi* and the GI tract, both to

clarify mechanisms of GI CD pathogenesis, and to define GI factors contributing to cardiac CD,

77 leading to new treatment strategies.

The GI tract is a complex environment where host, pathogen and microbiota interact to 78 affect disease pathogenesis<sup>9</sup>. We previously demonstrated that *T. cruzi* infection affects the fecal 79 microbiome and metabolome, but information on the specific GI sites driving this output had not 80 vet been determined <sup>10</sup>. In this study, we applied a novel integration of small molecule-focused 81 82 liquid chromatography-tandem mass spectrometry (LC-MS/MS) and 3D modeling ("chemical 83 cartography"), in conjunction with microbiome analysis, to systematically characterize the T. 84 cruzi-induced changes in the GI microenvironment in acute and chronic CD. We specifically focused on small molecule characterization because they represent the output of cellular 85 processes as well as their regulators, and therefore have the closest relationship to phenotype  $^{11}$ . 86 Given that most drugs are still small molecule-based  $^{12}$ , we further hypothesized that identifying 87 infection-associated disturbances in the small molecule profile can most rapidly lead to new 88 89 treatments for CD.

Results identified organ-specific and organ sub-site-specific magnitudes of disruptions in 90 91 the chemical and microbial GI environment by T. cruzi, and highlighted differential mechanisms 92 of acute to chronic stage transitions depending on organ. These results provide a mechanism by 93 which consistent perturbations of tissue biochemical pathways lead to GI CD pathology in the 94 oesophagus and large intestine. Consistent infection-induced elevation of acylcarnitine family 95 members across organs further led us to investigate the role of acylcarnitines in disease 96 pathogenesis. Supplementing animal drinking water with carnitine prevented acute-stage 97 mortality in experimental CD in the absence of antiparasitic effect, revealing a novel mechanism 98 of disease tolerance in CD. Overall, these results identified novel mechanisms of CD pathogenesis, with major translational applications to CD drug development. Furthermore, the 99 100 data collected here on uninfected animals, and our approach in general, can serve as a reference 101 to investigate determinants of tropism and novel treatment strategies for any other GI pathogen. 102

103

#### 104 **Results:**

#### 105 Regiospecific molecular impact of *T. cruzi* colonization in the GI tract

GI CD is still poorly understood. In our prior work, we identified specific small 106 molecules correlated with cardiac parasite tropism  $^{13}$ . Here, we sought to identify the 107 108 locoregional chemical changes associated with parasite GI colonization. Mice were infected with 1,000 luciferase-expressing T. cruzi strain CL Brener parasites <sup>6</sup>. Twelve days (acute stage) and 109 89 days (chronic stage) post-infection, animals were euthanized, the GI tract sectioned (Fig. 110 111 S1a), and parasite burden in each section determined by ex vivo bioluminescence imaging (Fig. 112 **1abc**). At 12 days post infection, parasite burden was high throughout the GI tract, with the 113 highest parasite burden in the distal small intestine (position 9; p<0.05 Student's T-test, distal 114 small intestine to mid and distal stomach, small intestine position 6 and small intestine position 115 7), and the lowest parasite burden in the cecum (position 10, p<0.05 Student's T test cecum vs 116 oesophagus, distal small intestine and distal large intestine; Fig. 1ab). In contrast, at 89 days 117 post-infection, the parasite burden was highest in the cecum (p<0.05 Student's T-test, cecum vs 118 oesophagus, proximal and distal small intestine), and lowest in the proximal small intestine 119 (p<0.05 Student's T-test, small intestine positions 5 and 6 vs oesophagus, proximal and distal 120 large intestine, **Fig. 1ac**). In general, as expected, parasite burden decreased from the acute stage 121 to the chronic stage (Fig. S1b). However, surprisingly, parasite burden increased in the cecum 122 during the acute to chronic transition, suggesting a possible role for the cecum as a parasite 123 reservoir protected from antiparasitic immune responses (Fig. S1b). These observations support 124 the concept that all GI sites can initially harbor T. cruzi, but then differentially respond to 125 parasite presence, leading to the ability of the parasite to persist and cause damage in some sites 126 but not others.

127 Given this differential parasite tropism in the chronic stage and the unique aspects of CD 128 pathology, we sought to investigate the molecular determinants of parasite persistence vs disease 129 resolution. To do so, we extracted small molecules (metabolites) from each collected GI section 130 (637 samples total) and analyzed these molecules by LC-MS/MS in positive and in negative 131 mode. As expected, the strongest determinant of overall chemical profile was the source organ, 132 and sample position within that organ, as observed by principal coordinate (PCoA) analysis (Fig. 1d. PERMANOVA based on source organ. p<0.001.  $R^2=46.374\%$  for positive mode LC-MS/MS 133 analysis and p<0.001, R<sup>2</sup>=47.033 % for negative mode LC-MS/MS analysis; PERMANOVA 134

based on sampling position, p<0.001,  $R^2$ =13.494% for positive mode LC-MS/MS analysis and 135 p<0.001, R<sup>2</sup>=16.477% for negative mode LC-MS/MS analysis (12 days post-infection); 136 PERMANOVA based on sampling position, p<0.001  $R^2$ =12.067% positive mode and p<0.001 137  $R^2$ =13.918% negative mode (all timepoints combined)). Overall impact of infection was much 138 139 more minor (Fig. S2, S3, PERMANOVA based on infection status, acute stage, p=0.019,  $R^{2}=1.011\%$  for positive mode LC-MS/MS analysis and p=0.07,  $R^{2}=0.692\%$  for negative mode 140 141 LC-MS/MS analysis; PERMANOVA based on infection status, chronic stage, p=0.014,  $R^2$ =0.982% for positive mode LC-MS/MS analysis and p=0.007,  $R^2$ =0.981% for negative mode 142 143 LC-MS/MS analysis). Comparison of chemical families differentially-modulated by infection 144 also identified few commonalities between sample sites (Fig. S4, S5). We therefore focused our 145 analysis on the impact of infection in each individual organ. Visualization of the chemical profile in each organ in relationship to infection status using PCoA analysis revealed organ-specific 146 147 differences in the impact of T. cruzi infection. Acute-stage infection was associated with major disturbances in the overall oesophagus chemical profile (PERMANOVA p=0.002,  $R^2=15.871\%$ ), 148 149 with lower-scale perturbations in the small intestine and cecum (PERMANOVA p<0.001,  $R^2$ =6.95% and PERMANOVA p=0.02,  $R^2$ =10.411%, respectively) (Fig. 1e, S6). The strongest 150 acute-stage disruption within the small intestine chemical environment was observed in the distal 151 152 small intestine, where parasite burden is the highest (Fig. 1e, PERMANOVA p<0.001,  $R^{2}=30.198\%$ ; p<0.001,  $R^{2}=26.063$ ; p=0.006,  $R^{2}=12.564$ , for positions 7, 8, 9, respectively). 153 154 These changes resolved in the chronic stage for the cecum (PERMANOVA p=0.171,  $R^{2}=6.955\%$ ), decreased in magnitude for the small intestine (PERMANOVA p<0.001, 155  $R^{2}$ =4.824), became apparent in the stomach and large intestine (PERMANOVA p=0.021, 156  $R^2$ =4.429% and PERMANOVA p=0.008,  $R^2$ =6.323%, respectively), and increased in magnitude 157 in the oesophagus (PERMANOVA p<0.001, R<sup>2</sup>=38.061%). Importantly, the largest statistically 158 159 significant sites of metabolome disturbance in the chronic stage were the oesophagus and large intestine, which are the sites of damage in symptomatic chronic-stage GI CD<sup>14</sup>. On a per-160 sampling site basis, spatial heterogeneity in terms of overall effect size  $(R^2)$  was observed within 161 a given organ. The largest increase in  $R^2$  during the transition from the acute to the chronic stage 162 163 were observed in the oesophagus, distal stomach and central large intestine (2.4, 2.0 and 1.9-fold 164 increases, respectively).

165 Next, we investigated the nature of the chemical shifts associated with these infection-166 altered chemical profiles. Feature annotation rates were considerably higher in positive mode 167 than in negative mode (35.4% vs 10.2%), so we focused this analysis on our positive mode LC-168 MS/MS data. We used machine learning (random forest) approaches to identify specific 169 molecular features driving the differences between infected and uninfected tissues. Given our 170 observations on the impact of sampling position on metabolite features (PCoA, Fig. 1d, Fig. S2, 171 Fig. S3, Fig. S5), these comparisons were independently performed for each organ. In the acute 172 stage, we observed elevation in specific acylcarnitines and specific phosphatidylcholine (PC) 173 family members in the different organs (Fig. 2a-f, Table S1, Fig. S7). We also observed 174 elevation in kynurenine in the stomach and large intestine in the acute stage. These differences 175 persisted in the chronic stage for the proximal and central large intestine only (Fig. 2g-h, Table 176 S1, Fig. S7). Strikingly, the levels of tryptophan, the precursor of kynurenine, were 177 correspondingly decreased in the acute stage at the same large intestine sites where kynurenine 178 was elevated, whereas it was increased by infection in the chronic stage in the oesophagus (Fig. 179 **2i-j**). Kynurenine is induced by inflammation; kynurenine metabolites have direct antiparasitic effects and contribute to the control of acute *T. cruzi* infection<sup>15</sup>. However, they can also induce 180 regulatory T cells <sup>16</sup>, and as such, our observation of kynurenine persistence in the large intestine 181 182 may contribute to parasite persistence in this organ. In accordance with our prior observations in the context of the fecal metabolome <sup>10</sup>, specific large intestine and small intestine bile acid 183 184 derivatives were increased in infected mice (Fig. 2k-m, Table S1, Fig. S7). At 89 days post-185 infection, molecular features identified as elevated by infection include specific acylcarnitines (e.g. C20:4 acylcarnitine in the oesophagus), specific PCs (e.g. PC(22:5), PC(20:4), PC(22:6) in 186 187 the oesophagus; PC(22:4) in the large intestine), specific amino acids and derivatives (e.g. 188 kynurenine in the large intestine, tryptophan in the oesophagus) (Fig. 2a-j, Table S1, Fig. S7). 189 Importantly, the pattern of persistence of these metabolic changes reflected known sites of CD: 190 for example, most of the top 10 metabolic perturbations observed in the acute stage in the 191 oesophagus were still perturbed by infection in the chronic stage, whereas none of the small 192 intestine acute-stage perturbations persisted in the chronic stage (Fig. 2, Table S1). Overall, 193 these results identified tissue metabolic changes linked to CD tropism and pathogenesis, at the 194 scale of overall chemical disturbances, as well as several metabolic pathways correlated with 195 infection status.

#### 196

#### 197 Impact of *T. cruzi* colonization on the GI tract microbiome

198 Several of the molecules identified in our dataset are of microbial origin or microbiallymodified, such as indole-L-lactate, indoxyl sulfate and secondary bile acids (Fig. S8, Table S2). 199 Dataset match analysis through the GNPS platform <sup>17</sup> identified 1689 unique matches in our 200 201 positive mode dataset to pure bacterial culture datasets not shared with pure mammalian culture 202 datasets, known plastics-derived contaminants or blank files, suggesting a potential bacterial origin. Studies comparing germ-free and colonized mice have also shown that the microbiota 203 204 influences a variety of the metabolites detected in our study, including tryptophan, tyrosine and maltotriose <sup>1819</sup>. Tryptophan and tyrosine in particular were affected by infection (tryptophan: 205 206 decreased in the large intestine overall, Mann-Whitney p=6.793e-06 (acute stage) and 207 p=0.004313 (chronic stage); tyrosine: decreased in the large intestine overall, Mann-Whitney p=0.01518 (acute stage), non-significant (chronic stage)). We have previously demonstrated that 208 experimental *T. cruzi* infection alters the fecal microbiome and metabolome <sup>10</sup>, a finding that was 209 recently confirmed in *T. cruzi*-infected children in Bolivia<sup>20</sup>. We therefore sought to evaluate the 210 spatial impact of *T. cruzi* infection on the microbiota at each collection site in acute-stage disease 211 212 (except for the oesophagus where insufficient material was available to perform both metabolomic and 16S analyses), and focusing on the cecum and large intestine in chronic 213 214 disease, given their role as major sites of CD pathogenesis and the unique metabolomic pattern 215 observed at these sites (Fig. 1e). 216 Differences in the overall microbiota composition (beta-diversity, all sites combined for a 217 given organ) were observed in the stomach and large intestine in the acute stage (PERMANOVA p=0.05,  $R^2=3.22\%$  and PERMANOVA p=0.04,  $R^2=3.837\%$ , respectively), with non-significant 218 changes in the small intestine and cecum (PERMANOVA p=0.069,  $R^2=1.791\%$  and 219 PERMANOVA p=0.058, R<sup>2</sup>=10.657%, respectively). These differences increased in magnitude 220 for the cecum and large intestine during the transition from acute to chronic stage 221 (PERMANOVA p=0.02,  $R^2$ =11.556% and PERMANOVA p=0.002,  $R^2$ =5.83%, respectively) 222 223 (Fig. 3a-f). Spatial heterogeneity was also observed within an organ (Fig. 3g), with the highest 224 disturbances in the microbiota found in the proximal large intestine (sampling position 11, PERMANOVA p=0.022, R<sup>2</sup>=12.36% and PERMANOVA p=0.009, R<sup>2</sup>=10.715% for acute and 225 chronic stage, respectively). Persistent disturbances in the large intestine microbiota reflect our 226

227 findings for the large intestine metabolome, while the discrepancies between cecal microbiota 228 and metabolome findings may reflect persistent luminal rather than tissue alterations. Overall, 229 the persistence of microbiota alterations in these sites correlates well with our observation of 230 continued alterations of the fecal microbiota and metabolome through acute and chronic experimental CD<sup>10</sup>. In accordance with prior reports<sup>2010</sup>, no significant differences in alpha-231 diversity were observed (Fig. S9) between infected and uninfected tissue in both acute and 232 233 chronic stages. Notably, the effect size observed for microbiota composition analysis was lower than for our tissue metabolomics analysis (Fig. 1), although in both cases the proximal large 234 235 intestine was one of the major sites of infection-associated perturbation. This may reflect 236 segregation of the microbiome from the site of infection, so that only indirect effects can be 237 observed. Furthermore, cage and batch effects were found to have a larger impact on microbiome composition (Fig. S10), while metabolome analysis was more robust to such effects, as we 238 previously reported <sup>10</sup>. 239

240

#### 241 Role of acylcarnitines in CD tolerance

242 Translating 'omics findings into novel therapeutic approaches is one of the major 243 challenges of this post-genome era. Because we observed larger metabolome than microbiome 244 infection-associated perturbations, and based on our current observations of infection-induced 245 elevation in specific acylcarnitine family members, and our prior findings of differential cardiac acylcarnitine distribution and mass range in mild vs severe acute T. cruzi infection<sup>13</sup>, we focused 246 247 here on acylcarnitines and the potential of acylcarnitine modulation for CD treatment. The 248 acylcarnitine sub-network (Fig. 4a) was manually annotated (Table S3, Fig. S11a), and impacts 249 of infection on short-chain (C3-C4), mid-chain (C5-C11) and long-chain (C12 and greater) 250 acylcarnitines assessed. While total and short-chain GI short-chain acylcarnitine levels were 251 comparable between infected and uninfected animals 12 days post-infection (Fig. S11bc), we 252 observed significant elevation in total and short-chain acylcarnitine levels at each small intestine 253 site, in infected animals (total acylcarnitines: FDR-corrected Mann-Whitney p=0.00543, 254 p=0.000422, p=7.04e-05, p=7.04e-05, p=0.000422 for positions 5, 6, 7, 8, 9; short-chain 255 acylcarnitines: FDR-corrected Mann-Whitney p=0.000668, p=0.000563, p=0.000141, 256 p=0.000563, p=0.00189 for positions 5, 6, 7, 8, 9; Fig. S11de). For long-chain acylcarnitines, 257 infection-induced acylcarnitine elevation was restricted to the distal portions of the small

258 intestine (FDR-corrected Mann-Whitney p=0.000141, p=0.000563, p=0.000563 for positions 7, 259 8, 9; Fig. 4bc). This difference between total and spatially-resolved short-chain acylcarnitine 260 levels highlight the strength of our chemical cartography approach. Mid-chain (C5 to C11) 261 acylcarnitine levels were not significantly different 12 days post-infection between infected and 262 uninfected animals at any GI site (Fig. S11f). Acylcarnitine small intestine elevation was no longer observed in the chronic stage, except for short-chain acylcarnitines in the duodenum 263 264 (sampling position 5, FDR-corrected Mann-Whitney p=0.0253), although select other GI sites showed infection-induced increases in acylcarnitines (Fig. S11ghi; distal large intestine, total 265 266 acylcarnitines and short-chain acylcarnitines, FDR-corrected Mann-Whitney p=0.0196 and 267 p=0.0387, respectively; oesophagus, short-chain acylcarnitines, FDR-corrected Mann-Whitney 268 p=0.00422). Acetyl-carnitine was also elevated in select sites 12 days post-infection (FDR-269 corrected Mann-Whitney p=0.0.0220, p=0.003413, p=0.000141, p=0.000141, p=0.0008913, 270 p=0.0220 for sites number 4-9 (stomach and small intestine, 12 days post-infection)), but was 271 comparable between infected and uninfected tissues at all sites 89 days post-infection (Fig. 272 S11jk). In contrast, unmodified carnitine levels were comparable throughout the intestine 12 273 days post-infection, and only significantly elevated in infected oesophagus and uninfected central 274 large intestine 89 days post-infection (FDR-corrected Mann-Whitney p=0.000141 and p=0. 275 0187, respectively) (Fig. S111).

276 To determine whether we could translate these findings towards novel CD therapeutics 277 and whether these acylcarnitine alterations play a causal role in disease progression, we assessed 278 whether carnitine supplementation could alter acute CD outcome. Mice were infected with either 279 an intermediate dose (5,000 trypomastigotes) or a high dose (50,000 trypomastigotes) of luciferase-expressing CL Brener parasites <sup>6</sup>. At 7 days post-infection, animals were distributed 280 281 into two groups of comparable parasite burden and one group switched from normal drinking 282 water to drinking water supplemented with L-carnitine (equivalent to 100 mg/kg/day based on 283 water consumption). Carnitine treatment completely abrogated acute CD-induced mortality up to 284 7 weeks post-infection (Fig. 4d, p=0.0027 Mantel-Cox test, 50,000 trypomastigote infection; 285 Fig. S12a), but without any effect on parasite burden or parasite distribution (Fig. 4ef, S12b). 286 This lack of antiparasitic activity is consistent with prior *in vitro* activity data showing no impact of carnitine on parasite burden<sup>21</sup>. Overall, these results indicate that acylcarnitine modulation by 287 288 carnitine supplementation can induce disease tolerance in CD. These results have important

implications for our understanding of the factors that contribute to the progression from

asymptomatic to symptomatic CD, and represent a novel avenue for CD drug development, in

291 conjunction with antiparasitics to kill *T. cruzi*.

292

### 293 **Discussion:**

Disease severity is tied to the balance between resistance and tolerance mechanisms<sup>22</sup>. 294 295 Resistance reduces pathogen load, but can cause collateral damage to the host, as indeed has been observed with immune clearance of T. cruzi-infected cells  $^{23}$ . In contrast, tolerance reduces 296 disease or immune-mediated collateral damage without affecting the pathogen load <sup>22</sup>. While 297 parasite persistence is required for progression to chronic CD<sup>24</sup>, only a minority of infected 298 patients progress to symptomatic disease <sup>4</sup>, and parasite load does not fully predict disease 299 severity (e.g.<sup>25</sup>), indicating that disease tolerance mechanisms also regulate CD progression, 300 301 although these are not well understood. Our novel finding that carnitine modulation determines 302 infection outcome (Fig. 4) paves the way for future studies of the role of acylcarnitines in the 303 progression from asymptomatic to symptomatic disease in humans, as well as the development 304 of novel interventional strategies for CD, most likely in combination with antiparasitic agents. 305 Our observations also represent the first time that carnitine metabolism has been directly linked 306 to disease tolerance mechanisms, rather than serving as a readout for altered fatty acid 307 metabolism. Importantly, acylcarnitines, as with many other infection-modulated metabolites in 308 our dataset, showed strong spatial effects that would have been masked by bulk tissue analysis, 309 demonstrating the strength of this spatially-resolved approach (Fig. 2, Fig. 4b, Fig. S11). 310 Strikingly, sites of largest statistically significant overall metabolic disturbance in the chronic 311 stage were the oesophagus and large intestine (Fig. 1), providing a mechanism whereby persistent metabolic alterations at these sites drive the striking selective tropism of CD for the 312 313 large intestine and oesophagus. In contrast, chronic parasite persistence in the cecum was 314 metabolically silent (Fig. 1), while cecal microbiome remained strongly and significantly affected by infection (Fig. 3). It is tempting to speculate a microbiota-mediated mechanism of 315 316 reduced antiparasitic immune responses in the cecum, perhaps via cecal microbiota-derived short-chain fatty acid <sup>26</sup>, or induction of parasite dormancy at this site <sup>27</sup>, leading to the observed 317 318 parasite recrudescence in the cecum following incomplete posaconazole or nifurtimox treatment <sup>828</sup>, and this awaits further experimentation. Lastly, the spatially-resolved metabolomic and 319

320 microbiome methods that we illustrate here with *T. cruzi* can readily be applied to study other

321 pathogens with specific tissue tropism, and we anticipate this approach to have broad

322 applicability. Likewise, initial pathogen tropism is affected by tissue characteristics. Our

323 comprehensive spatial characterization of the microbiome and metabolome of uninfected animals

324 therefore represents a resource that can serve as a hypothesis-generating starting point for studies

325 of pathogen tropism.

326

#### 327 Methods:

*In vivo* experimentation: All vertebrate animal studies were performed in accordance with the
 USDA Animal Welfare Act and the Guide for the Care and Use of Laboratory Animals of the
 National Institutes of Health. The protocol was approved by the University of California San

**331** Diego Institutional Animal Care and Use Committee (protocol S14187).

332 For chemical cartography and 16S analysis: 5-week-old male C3H/HeJ mice (The 333 Jackson Laboratory) were infected by intraperitoneal injection of 1,000 red-shifted luciferaseexpressing *T. cruzi* strain CL Brener<sup>6</sup> culture-derived trypomastigotes in 100 uL DMEM media 334 (infected group) or mock-infected by injection of 100 µL DMEM media only (uninfected group). 335 336 Prior to animal infection, T. cruzi parasites were maintained in coculture with C2C12 mouse 337 myoblasts, in DMEM (Invitrogen) supplemented by 5% iron-supplemented calf serum 338 (HyClone) and 1% penicillin-streptomycin (Invitrogen). Twelve or 89 days post-infection, 339 animals were injected with 150 mg/kg D-luciferin potassium salt (Gold Biotechnology) and 340 euthanized by isoflurane overdose followed by cervical dislocation. Mice were then immediately perfused with 10 mL of 0.3 mg/mL ice-cold D-luciferin in PBS <sup>6</sup>. GI organs were collected, 341 342 sectioned as displayed on Fig. S1a and each section placed in an individual 96-well-plate well containing 0.3 mg/mL ice-cold D-luciferin in PBS<sup>6</sup>. The plate was imaged in an *In vivo* Imaging 343 344 System (IVIS) Lumina LT Series III (Perkin Elmer) and tissues were then immediately snap-345 frozen in liquid nitrogen, followed by storage at -80 °C. Tissue section luminescence was 346 determined using Living Image 4.5 software, normalized to collected tissue weight, and plotted 347 using GraphPad Prism version 8. Two biological replicate experiments were performed, each 348 including n=5 mice for each timepoint and infection condition (total n=10 per timepoint and 349 infection condition). The same samples were used as source material for 16S and LC-MS

analysis (see below), with each tissue site from each individual animal representing a single datapoint in each analysis.

352 For carnitine supplementation experiments: mice were infected with either an 353 intermediate dose (5,000 culture-derived trypomastigotes) or a high dose (50,000 culture-derived trypomastigotes) of red-shifted luciferase-expressing CL Brener parasites <sup>6</sup>. Seven days post-354 355 infection, mice were injected with 150 mg/kg D-luciferin potassium salt (Gold Biotechnology) 356 and imaged (IVIS Lumina LT Series III). Animals were allocated to treatment groups to have 357 comparable total body luminescence signal between groups. Mice then received L-carnitine 358 (VWR) in drinking water *ad libitum*, normalized to mouse water consumptions so that animals 359 received ca. 100 mg/kg/day, or regular drinking water (n=5 per group). Bioluminescent imaging 360 was performed weekly. Animals reaching humane endpoints of weight loss >20% were 361 euthanized. Bioluminescence data was analyzed with Living Image 4.5 software and plotted 362 using GraphPad Prism version 8.

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364 Sample preparation for LC-MS/MS: Samples from both biological replicate experiments were 365 analyzed jointly. Metabolites were extracted from the collected tissue samples using a two-step process as implemented in our prior work <sup>13</sup>, normalizing to tissue weight. Tissue samples were 366 homogenized in LC-MS grade water (50 mg tissue in 125 µL water) using a 5 mm steel ball in 367 368 Oiagen TissueLyzer at 25 Hz for 3 min. 10 µL was set aside for DNA extraction and microbiome 369 profile analysis, except for oesophagus where the tissue amount was too small. LC-MS grade 370 methanol spiked with 4 µM sulfachloropyridazine was added to the homogenized sample, to a 371 final concentration of 50% methanol, and the sample was homogenized again at 25 Hz for 3 min. 372 Homogenate was centrifuged for 15 min at 14,980g, 4 °C. The centrifugation supernatant was 373 collected and dried in a Savant SPD111V (ThermoFisher Scientific) speedvac concentrator. The 374 centrifugation pellet was resuspended in 3:1 (by volume) dichloromethane/methanol solvent 375 mixture and further homogenized at 25 Hz for 5 minutes, followed by centrifugation at 14,980g 376 for 2 minutes. This latter centrifugation supernatant was collected and air dried. Both extracts 377 were stored at -80 °C until LC-MS analysis.

378

LC-MS/MS: The dried samples were resuspended in 50% methanol (LC-MS grade) spiked with
 2μM sulphadimethoxine as internal control, pooling aqueous and organic extracts together.

12

381 Liquid chromatography was performed using a ThermoScientific Vanquish UHPLC system

fitted with 1.7 μm 100 Å Kinetex C8 column (50 X 2.1 mm) (Phenomenex). Data-dependent

383 MS/MS (ddMS<sup>2</sup>) experiments were performed on a Q Exactive Plus (ThermoScientific) high

resolution mass spectrometer, under the control of XCalibur and Tune software

385 (ThermoScientific). Ions were generated for MS/MS analysis in both positive and negative ion

386 mode using heated electrospray ionization (HESI) source. Calibration of the instrument was

387 performed using recommended commercial calmix from ThermoScientific. See supplemental

- 388 information (**Table S4-7**) for detailed instrumental parameters.
- 389

390 LC-MS/MS data analysis: Raw data was converted to mzXML format using MS Convert software <sup>2930</sup>. Processing of the resulting mzXML files was done in MZmine version 2.30<sup>31</sup> (see 391 392 Table S8 for parameters). Data was filtered to only retain MS1 scans that were present in at least 6 samples and were associated with MS2 spectra (and therefore could potentially be annotated). 393 394 Blank removal was performed, with a minimum three-fold difference between blank and samples 395 required in order for a feature to be retained. Total Ion Current (TIC) normalization was performed in Jupyter notebook using R (http://jupyter.org). Principal coordinate analysis (PCoA) 396 397 was performed on the TIC-normalized MS1 data using the Bray-Curtis-Faith dissimilarity metric in QIIME 1<sup>32</sup>, visualized using Emperor<sup>33</sup>. PERMANOVA calculations were performed on 398 Bray-Curtis-Faith distance matrices using the R package "vegan" <sup>34</sup>. The 3D GI tract model was 399 400 built to scale from pictures of GI tract samples collected from our mice, using SketchUp 2017 software. Data was plotted onto this 3D model using 'ili (https://ili.embl.de/)<sup>35</sup>. Feature 401 402 annotation was performed through molecular networking on the Global Natural Products Social Networking (GNPS) platform <sup>17</sup> (see **Table S9** for detailed parameters). All annotations are 403 levels 2 or 3 according to the metabolomics standards initiative <sup>36</sup>. Molecular networks were 404 visualized using Cytoscape <sup>3738</sup>. Venn diagrams were generated using: 405 http://bioinformatics.psb.ugent.be/webtools/Venn/. Random forest analysis <sup>39</sup> was performed in 406 Jupyter notebook using the randomForest R package and 7501 trees, classifying based on 407 408 infected vs uninfected status. All code can be accessed at https://github.com/mccall-lab-OU/GI-409 tract-paper. 410

411 16S method and data analysis: DNA was extracted from homogenized tissue samples using the 412 DNeasy PowerSoil kit (Qiagen) following manufacturers protocols. The V4 hypervariable region 413 of the 16S rRNA gene was amplified using barcoded Illumina-compatible primers 515F and 806R as previously described <sup>40</sup>. The resulting amplicons were pooled in equimolar proportions 414 415 and sequenced on an Illumina MiSeq Instrument. Paired end sequencing reads were quality filtered and merged to reconstruct the complete V4 region using AdapterRemovalV2<sup>41</sup>. These 416 417 analysis-ready reads were used to identify operational taxonomic units (OTUs) following the UNOISE pipeline implemented in Usearch v10  $^{42}$ . Taxonomy was assigned to the representative 418 OTUs using the EzTaxon database  $^{43}$ . The resulting OTU table was rarefied to a depth of 5,000 419 420 reads per individual, and all downstream statistical analyses were performed using this rarefied 421 OTU table. Alpha- (observed species) and beta-diversity (unweighted UniFrac) analyses were performed using scripts implemented in QIIME 1<sup>32</sup>. Kruskal-Wallis tests with FDR correction 422 were used for comparison of genus-level taxonomic summaries to infection status and disease 423 424 stage.

425

Additional statistical information: All statistical tests are paired. Non-parametric tests were
used where possible (Mann-Whitney U-test), which makes no assumptions as to data normality.
No additional tests of normality were performed. For acylcarnitine data analysis and Figure 2
panels, where Mann-Whitney U-tests were performed for each sampling site, FDR correction
was performed to adjust for multiple comparison, as specified in the text and in figure legends.
Boxplots display first quartile, median and third quartile, with whiskers no more than 1.5 times
interquartile range.

433

434 **Data Availability:** Metabolomics data have been deposited on MassIVE, accession numbers 435 MSV000082614 (positive mode, oesophagus), MSV000082615 (negative mode, oesophagus), 436 MSV000082618 (positive mode, stomach), MSV000082619 (negative mode, stomach), 437 MSV000082612 (positive mode, small intestine), MSV000082613 (negative mode, small 438 intestine), MSV000082616 (positive mode, large intestine and cecum), and MSV000082617 439 (negative mode, large intestine and cecum). 16S data has been deposited in the NIH Short Read 440 Archive, project number PRJNA553060. Molecular networks can be accessed here: 441 https://gnps.ucsd.edu/ProteoSAFe/status.jsp?task=801f2cc53c504fad8e64a08565173309#

- 442 (positive mode networking from mzXML files; used for annotations and dataset matching);
- 443 https://gnps.ucsd.edu/ProteoSAFe/status.jsp?task=4592e7dfd96c440f8885fb312d50e124
- 444 (positive mode feature-based molecular networking; used to cluster MS1 data into chemical
- 445 families);
- 446 <u>https://gnps.ucsd.edu/ProteoSAFe/status.jsp?task=d86b3d7c69c646479ef2cf5e7a432ba8</u>
- 447 (negative mode networking from mzXML files; used for annotations and dataset matching);
- 448 https://gnps.ucsd.edu/ProteoSAFe/status.jsp?task=a6415577c1c24bc3823c9af5d9b5092c
- 449 (negative mode feature-based molecular networking; used to cluster MS1 data into chemical
- 450 families). Interactive 3D maps of metabolomic data for representative animals can be accessed
- 451 here: https://ili.embl.de/?ftp://massive.ucsd.edu/MSV000082614/updates/2019-07-
- 452 <u>10\_ehossain\_cee84dec/other/3D model of mouse</u>
- 453 <u>2</u> ili.stl;ftp://massive.ucsd.edu/MSV000082614/updates/2019-07-
- 454 <u>10\_ehossain\_cee84dec/other/Pos\_m10\_ili.csv</u> (mouse 10, infected, acute-stage sample
- 455 collection) <u>https://ili.embl.de/?ftp://massive.ucsd.edu/MSV000082614/updates/2019-07-</u>
- 456 <u>10\_ehossain\_cee84dec/other/3D model of mouse</u>
- 457 <u>2\_ili.stl;ftp://massive.ucsd.edu/MSV000082614/updates/2019-07-</u>
- 458 <u>10\_ehossain\_cee84dec/other/pos\_m18\_ili.csv</u> (mouse 18, uninfected, chronic-stage sample
- 459 collection). All code can be accessed at <u>https://github.com/mccall-lab-OU/GI-tract-paper</u>.
- 460

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- 470

# 471 Author contributions:

- 472 LIM designed the project. EH and LIM performed metabolite extractions and LC-MS
- 473 instrumental analysis. EH, CW, DL, MK, CG and LIM performed LC-MS data analysis. DL
- 474 built the 3D GI tract model. SLJ and DT performed *in vivo* experimentation, carnitine treatment,
- and tissue sample collection. SK and CMW performed DNA extractions and 16S library builds.
- 476 KS performed the16S sequencing and analysis. LIM, EH and KS wrote the paper.
- 477

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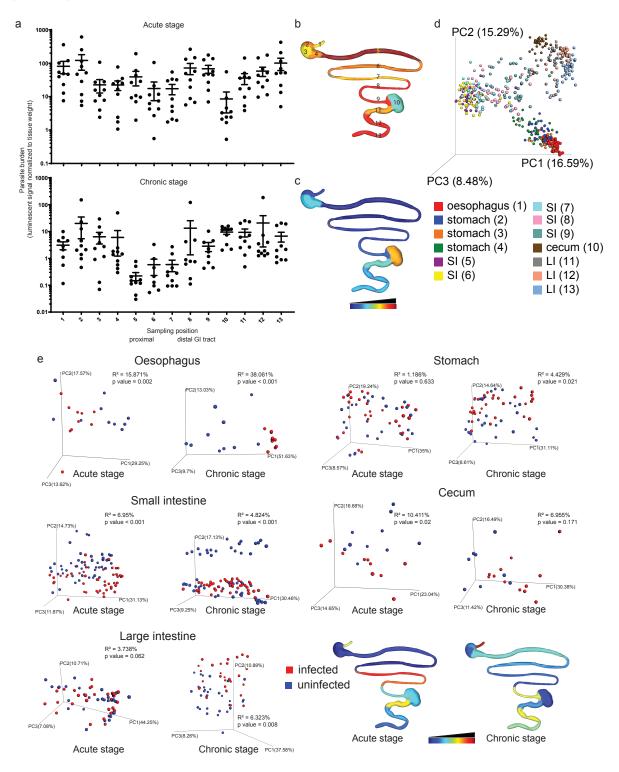
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- sequences and whole-genome assemblies. Int. J. Syst. Evol. Microbiol. 67, 1613–1617 (2017).

567

# 568 Figure legends:



569 Fig. 1. Spatial impact of *T. cruzi* infection is reflected by spatial modulation of the tissue

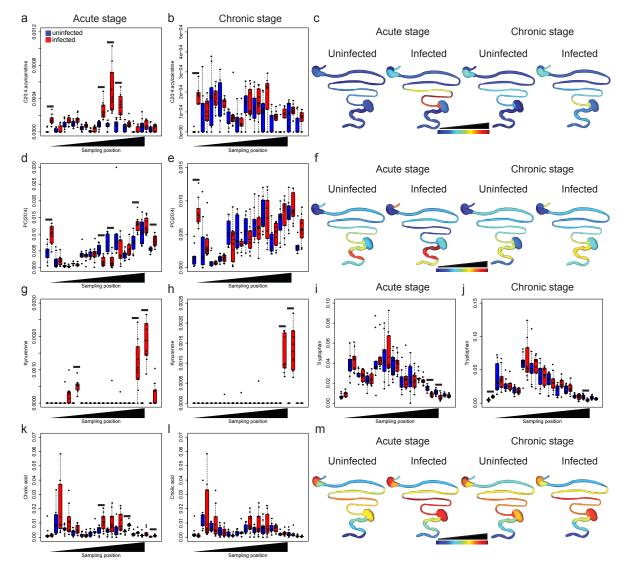
570 small molecule profile. C3H/HeJ male mice (n=5 per group and per replicate) were mock-

infected or infected with 1,000 luminescent *T. cruzi* strain CL Brener trypomastigotes, in two
biological replicates. GI samples were collected 12 and 89 days post-infection. (a) Parasite
burden at each sampling site. GI was sectioned into 13 segments, and luminescence quantified at

- each site. To correct for variations in sample size, luminescence counts were normalized to
- 575 sample weight, for each sample. Mean + standard error of mean are displayed. (b) Median
- 576 luminescent signal at each sampling site, 12 days post-infection. Sampling positions are
- 577 indicated. (c) Median luminescent signal at each sampling site, 89 days post-infection. Common
  578 scale for b and c. (d) Principal coordinate analysis showing separation between sampling sites in
- 579 terms of overall chemical composition, even within a given organ (negative mode, all timepoints
- 580 combined, Bray-Curtis-Faith distance metric; p<0.001 R2=13.918%). (e) Principal coordinate
- analysis showing significant chemical composition differences between infected and uninfected
- samples in oesophagus (acute stage, PERMANOVA p=0.002, R<sup>2</sup>=15.871%; chronic stage
- 583 PERMANOVA p<0.001,  $R^2$ =38.061%), stomach (chronic stage, PERMANOVA p=0.021,
- 584  $R^2$ =4.429%; non-significant acute stage), small intestine, (acute stage, PERMANOVA p<0.001,
- 585  $R^2$ =6.95%; chronic stage, PERMANOVA p<0.001,  $R^2$ =4.824), cecum (acute stage, PERMANOVA
- 586  $p=0.02, R^2=10.411\%$ ; non-significant chronic stage) and large intestine (chronic stage, PERMANOVA)
- 587 p=0.008,  $R^2$ =6.323%; non-significant acute stage). Bottom right-hand panels display  $R^2$  at each
- sampling site (common logarithmic scale, acute and chronic stage).

589

590



591

592 Fig. 2. Common and tissue-specific metabolic changes identified by random forest

593 demonstrate persistence of these alterations at sites of CD. (a) and (b) Infection-induced

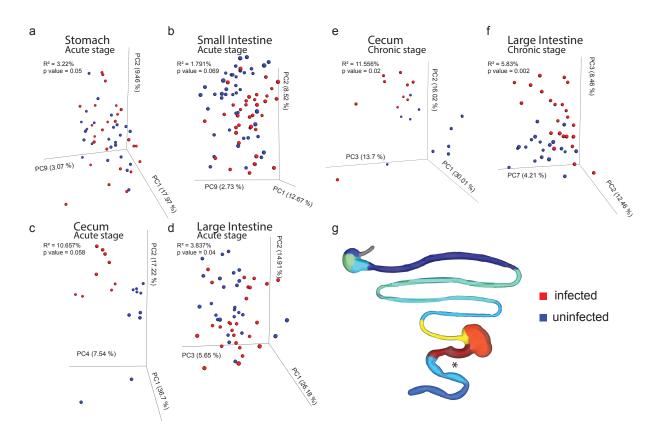
elevation of C20:4 acylcarnitine in the oesophagus and small intestine in the acute stage,

persisting in the oesophagus in the chronic stage (FDR-corrected Mann-Whitney p=0.000988,

596 p=0.000141, p=0.00107, p=0.00107 for acute-stage positions 1, 7, 8 and 9; p=0.0188 for chronic-

- 597 stage position 1). (c) Spatial distribution of C20:4 acylcarnitine (median, common linear scale).
- (d) and (e) Infection-induced elevation of PC(20:4) in the oesophagus and large intestine in the
- acute stage, persisting in the oesophagus in the chronic stage. PC(20:4) was decreased in the
- acute stage in the infected small intestine (FDR-corrected Mann-Whitney p=0.00189,

- 601 p=0.000844, p=0.00158, p=0.000844, p=0.000891 for acute-stage positions 1, 7, 8, 11 and 13;
- 602 p=0.000141 for chronic-stage position 1). (f) Spatial distribution of PC(20:4) (median, common
- 603 linear scale). (g) and (h) Infection-induced elevation of kynurenine in the stomach and large
- 604 intestine in the acute stage persists in the large intestine in the chronic stage (FDR-corrected
- 605 Mann-Whitney p=0.000796, p=0.00100, p=0.000796 for acute-stage positions 4, 11 and 12;
- p=0.000415 and p=0.000415 for chronic-stage positions 11 and 12. (i) and (j) Infection-induced
- 607 decrease in tryptophan at sites of increased kynurenine in the large intestine (acute and chronic
- stage). Infection also increased tryptophan in the oesophagus in the chronic stage. (FDR-
- 609 corrected Mann-Whitney p=0.001689 and p=0.0136 for acute-stage positions 11 and 12;
- 610 p=0.000281 and p=0.0253 for chronic-stage positions 1 and 12). All detected tryptophan adducts
- 611 combined. (k) and (l) Infection-induced increase in small intestine, cecum and large intestine
- 612 cholic acid (all detected adducts combined), acute stage only. (FDR-corrected Mann-Whitney
- 613 p=0.0498, p=0.000281, p=0.0297 for acute-stage positions 7, 10 and 13). (m) Spatial distribution
- of cholic acid (median, common logarithmic scale). Black lines in panels (a-e) and (g-l) indicate
- 615 FDR-corrected Mann-Whitney p<0.05.

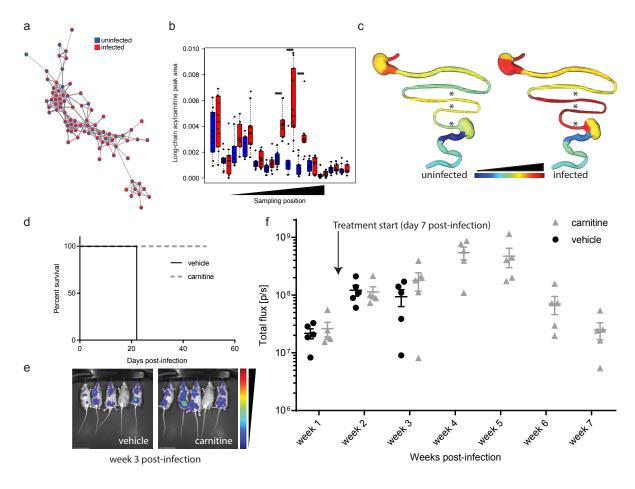


616

Fig. 3. Persistent, spatially heterogeneous impact of *T. cruzi* infection on the microbiota.

618 16S sequencing was performed on homogenate from all sampling sites except oesophagus in the acute stage, and focusing on large intestine and cecum in the chronic stage. Principal coordinate 619 620 analysis revealed significant differences in the overall microbiota composition in the stomach (a) and large intestine (d) in the acute stage (PERMANOVA p=0.05,  $R^2=3.22\%$  and PERMANOVA 621 p=0.04,  $R^2=3.837\%$ , respectively), which persisted in the chronic stage for the large intestine (f, 622 PERMANOVA p=0.002, R<sup>2</sup>=5.83%). Spatial heterogeneity was also observed within an organ 623 624 (g), with the highest disturbances in the microbiota in the proximal large intestine (sampling position 11, PERMANOVA p=0.022, R<sup>2</sup>=12.36% and PERMANOVA p=0.009, R<sup>2</sup>=10.715% for 625 acute and chronic stage, respectively). (g) displays  $R^2$  at each sampling site in the acute stage 626

627 (logarithmic scale). \*, PERMANOVA p<0.05.



628

629 Fig. 4. Chemical cartography reveals a causal role for carnitine metabolism in acute CD tolerance. (a) Acylcarnitine molecular network, showing relative abundance of each detected 630 acylcarnitine chemical family member (all tissue sites and timepoints combined; MS2 spectral 631 632 count relative abundance). Each node represents one metabolite feature. Connected nodes are structurally similar (MS2 cosine score > 0.7), with edge thickness proportional to the cosine 633 634 score. (b) Infection-induced increases in long-chain acylcarnitines in the distal small intestine 12 635 days post-infection (black lines indicate FDR-corrected Mann-Whitney p<0.05; p=0.000141, 636 p=0.000563, p=0.000563 for positions 7, 8, 9, comparing infected and uninfected samples for the 637 same positions) (c) Spatial distribution of median long-chain acylcarnitine peak area, 12 days post-infection (common logarithmic scale). Stars indicate sites of statistical significance, as 638 639 displayed in panel b. (d) Carnitine treatment prevents acute-stage mortality. Male C3H/HeJ mice 640 (n=5 per group) were infected with 50,000 luciferase-expressing *T. cruzi* strain CL Brener. Seven 641 days post-infection, mice were switched to carnitine-supplemented drinking water (carnitine 642 group; 1.3%; equivalent to 100 mg/kg/day based on water consumption) or continued on normal

- 643 drinking water (vehicle group). All vehicle-treated mice reached humane endpoints at 22 days
- post-infection, whereas carnitine-treated mice survived the acute infection stage (p=0.0027,
- 645 Mantel-Cox test). (e) and (f) Comparable parasite burden was observed between carnitine-treated
- and vehicle groups, indicating that carnitine's pro-survival effects represent disease tolerance
- 647 rather than antiparasitic efficacy. (e) Representative bioluminescent imaging, week 3 post-
- 648 infection (common scale). (f) Overall whole-body luminescence, weeks 1-7 post-infection. Mean
- 649 and standard error of mean are displayed.