1	Gut microbiota metabolically mediate intestinal helminth infection in Zebrafish
2	
3	Austin J. Hammer ^{1,*} , Chris A. Gaulke ^{2,*} , Manuel Garcia-Jaramillo ³ , Connor Leong ¹ , Jeffrey
4	Morre ⁴ , Michael J. Sieler ¹ , Jan F. Stevens ^{5,6} , Yuan Jiang ⁷ , Claudia S. Maier ⁴ , Michael L. Kent ¹ ,
5	Thomas J. Sharpton ^{1,7#}
6	
7	¹ Department of Microbiology, Oregon State University
8	² Department of Pathobiology, University of Illinois Urbana Champaign
9	³ Department of Environmental and Molecular Toxicology, Oregon State University
10	⁴ Department of Chemistry, Oregon State University
11	⁵ Department of Pharmaceutical Sciences, Oregon State University
12	⁶ Linus Pauling Institute, Oregon State University
13	⁷ Department of Statistics, Oregon State University
14	
15	
16	
17	*Indicates the authors contributed equally to the manuscript
18	
19	
20	*Corresponding Author: Thomas J. Sharpton, E-mail: Thomas.Sharpton@oregonstate.edu
21	Department of Microbiology and Department of Statistics
22	Oregon State University, 97330
23 24 25 26 27 28	

29 Abstract

30 Intestinal helminth parasite (IHP) infection induces alterations in the composition of 31 microbial communities across vertebrates, although how gut microbiota may facilitate or hinder 32 parasite infection remains poorly defined. In this work we utilized a zebrafish model to 33 investigate the relationship between gut microbiota, gut metabolites, and IHP infection. We 34 found that extreme disparity in zebrafish parasite infection burden is linked to the composition of 35 the gut microbiome, and that changes in the gut microbiome are associated with variation in a 36 class of endogenously-produced signaling compounds, N-acylethanolamines, that are known to 37 be involved in parasite infection. Using a statistical mediation analysis, we uncovered a set of 38 gut microbes whose relative abundance explains the association between gut metabolites and 39 infection outcomes. Experimental investigation of one of the compounds in this analysis reveals 40 salicylaldehyde, which is putatively produced by the gut microbe *Pelomonas*, as a potent 41 anthelmintic with activity against *Pseudocapillaria tomentosa* egg hatching, both in vitro and in vivo. Collectively, our findings underscore the importance of the gut microbiome as a mediating 42 43 agent in parasitic infection and highlights specific gut metabolites as tools for the advancement 44 of novel therapeutic interventions against IHP infection. 45 46 47 48 49 50 51

52 53

- -

55 Importance

56	Intestinal helminth parasites (IHPs) impact human health globally and interfere with
57	animal health and agricultural productivity. While anthelmintics are critical to controlling parasite
58	infections, their efficacy is increasingly compromised by drug resistance. Recent investigations
59	suggest the gut microbiome might mediate helminth infection dynamics. So, identifying how gut
60	microbes interact with parasites could yield new therapeutic targets for infection prevention and
61	management. We conducted a study using a zebrafish model of parasitic infection to identify
62	routes by which gut microbes might impact helminth infection outcomes. Our research linked the
63	gut microbiome to both parasite infection, and to metabolites in the gut to understand how
64	microbes could alter parasite infection. We identified a metabolite in the gut, salicylaldehyde,
65	that is putatively produced by a gut microbe and that inhibits parasitic egg growth. Our results
66	also point to a class of compounds, N-acyl-ethanolamines, which are affected by changes in the
67	gut microbiome and are linked to parasite infection. Collectively, our results indicate the gut
68	microbiome may be a source of novel anthelmintics which can be harnessed to control IHPs.
69	
70	
71	
72	
73	
74	
75	
76	
77	
78	
79	
80	

81 Introduction

82 Intestinal helminth parasitic infections present a significant global health burden, affecting at least one quarter of the global population^{1,2}, and are disproportionately experienced 83 84 by individuals in impoverished nations, particularly children³. These infections are also prominent among domestic animals^{4,5}, which places tremendous strain on livestock 85 management and veterinary practices^{4,6,7}. Among infected individuals intestinal helminth 86 parasite (IHP) infections can contribute to anemia⁸, cognitive impairment⁹, physical wasting¹⁰, as 87 88 well as a host of other conditions that contribute to the equivalent of millions of disabilityadjusted life vears¹¹. Unfortunately, the extreme burden of IHP infection may be exacerbated by 89 90 the emergence of drug-resistant parasites. High levels of broad anthelmintic drug resistance in animal populations have been observed globally for decades^{12,13} posing a tremendous risk to 91 92 humans because practices such as broad blanket anthelmintic administration¹⁴ and prior widespread prophylactic administration of anthelmintic drugs¹⁵ have provided strong selective 93 forces for virulent drug resistant organisms¹⁶. While improved helminth management practice 94 may help slow the rate of anthelmintic resistance^{16,17}, the future of controlling IHP infection may 95 96 depend on innovating new methods and resources in anthelmintic discovery to stay ahead in 97 the pugilistic battle with drug-resistance in infectious nematodes.

In the search for new approaches to control intestinal helminth parasites (IHPs), there is 98 suggestive evidence that the intestinal microbiome can enhance or reduce parasite infection¹⁸. 99 100 Microorganisms produce a diverse trove of metabolic compounds, including anthelmintic drugs. 101 For example, the avermectin class of compounds, which include the most widely administered 102 anthelmintic drugs on the planet, were originally derived from soil-borne bacteria such as 103 Streptomyces avermectilis¹⁹. Besides the soil, locations where helminths and microbes have 104 evolved to co-locate, such as the gut, may offer a rich resource of microbially derived anthelmintic compounds¹⁸ as their evolution by microbial community members may have been 105 106 critical to microbial exploitation of the shared ecological niche. However, the complex and

107 variegated metabolic landscape of microbially derived compounds which are found in the gut108 and relevant to IHP infection remains unexplored.

109 Little is known about the existence of anthelmintic compounds derived from gut bacteria, 110 but it is known that gut microbiota can drive intestinal helminth infection through a variety of mechanisms. For instance, bacteria can alter the protective integrity of mucosal barriers^{20–23}, 111 drive peristaltic activity^{24,25}, and produce inhibitory antibiotic compounds that limit pathogen and 112 parasite survival^{19,26-28}. Moreover, signals from specific gut bacteria can cause egg hatching of 113 114 helminthic parasites in the gut, such as in the case of *Trichuris muris* infections in mice²⁹. 115 Additionally, gut microbes engage in extensive interaction with the vertebrate host immune system³⁰, and intestinal helminths possess a diverse suite of immunomodulatory tools^{31,32}. Much 116 117 of this cross-talk depends on the production of metabolite products by host, microbe, and 118 parasite. However, our current understanding of the complex set of metabolite interactions that 119 may directly or indirectly drive parasite colonization success is limited. Clarifying the set of 120 metabolites that mediate the interaction between host, parasites, and the gut microbiome may 121 provide a toolkit of compounds to control parasite infection.

122 Efforts to understand the role of the gut microbiome in health and disease conditions can 123 benefit from the application of analytic techniques that examine possible mediating roles of 124 intestinal microbes and metabolites. To this end, mediation inference techniques seek to 125 examine whether the relationship between two variables depends on the hypothesized 126 mediating effect of some third variable. While early iterations of these methods relied on regression-based structural equation modeling³³ with strict assumptions regarding model type. 127 128 new methods are being innovated that account for data-specific assumptions, such as sparsity 129 and compositionality in microbiome data^{34–37}, and the suite of mediation tools available to 130 researchers is expanding rapidly. Recent applications of mediation analysis in microbiome 131 science have identified lipid compounds produced by Akkermansia muciniphila that modulate murine immunity and metabolism³⁸, clarified the role of gut microbiota in mediating the 132

relationship between diet and immune inflammation³⁹, and established the role of the gut 133 microbiome in the development of childhood asthma⁴⁰. However, the extension of mediation 134 techniques to high dimensional multi-omic data where there are a large number of both 135 136 independent and mediating features remains limited. Large sample sizes are often required to attain sufficient power to detect mediating effects⁴¹, which can impose substantial logistical 137 138 challenges on researchers seeking to use these techniques with expensive vertebrate models. 139 Despite this challenge, mediation techniques have played an important recent role in mapping 140 the gut microbiome to metabolites which may be involved in disease conditions such as anorexia nervosa⁴², and these methods offer a dynamic opportunity to ascertain the intricate 141 142 mechanisms by which the gut microbiome links to complex diseases, such as parasite infection. 143 Robustly identifying novel connections between the gut microbiome and parasite 144 infection via mediating metabolites presents a challenge that requires experimental investigation 145 using an organism that displays robust patterns of quantifiable IHP infection, displays a tractable 146 set of gut microbes, and may be scaled in the lab to deal with inherent statistical limitations of 147 mediation methods. In line with these requirements, the zebrafish model provides a powerful 148 tool for modeling parasite infections and shedding light on the intricate relationship between host-microbiota interactions⁴³ and disease outcomes^{44,45}. The model possesses a well 149 characterized taxonomic gut microbial composition^{46,47} with a functional composition which 150 151 resembles that of humans⁴⁸, zebrafish offers a well-established model of intestinal helminth parasite infection⁴⁹, and can be experimentally scaled in a cost-effective manner^{50–52}. Zebrafish 152 153 have previously been used to discover and assay disease-related natural products^{53–55} with 154 broad relevance. Collectively, the zebrafish-IHP model can be highly controlled to investigate 155 intricate routes by which the gut microbiome may mediate parasite infection, and insights 156 gleaned from connections between gut microbiota and gut metabolites may offer translational 157 potential for understanding the metabolite-based interactions between the gut microbiota, 158 intestinal helminth parasites, and the host.

159 In order to uncover gut microbial metabolites that mediate IHP infections, we used a 160 zebrafish model of intestinal helminth infection by the nematode Pseudocapillaria 161 tomentosa^{49,56}, as it affords access to the large sample sizes needed to disentangle these 162 relationships. In particular, instead of housing fish together we individually-housed parasite 163 infected fish hosts to understand why a small number of zebrafish bear a disproportionate 164 parasite burden in the absence of social or co-housing dynamics, and produced paired 165 microbiome and metabolome data from infected and uninfected fish to investigate links between 166 the microbiome, parasitic infection, and intestinal metabolites. We observed that the gut 167 microbiome explains the variation in infection burden across individuals. We then utilized a 168 mediation inference framework to identify microbe-metabolite interactions that statistically 169 mediate worm burden. This work reveals a potent anthelmintic, salicylaldehyde, whose effect on 170 infection burden is mediated by members of the gut microbiome. Analysis of the paired 171 microbiome-metabolome data also implicates N-acylethanolamines (NAEs) in the association 172 between microbiota and parasite infection burden. Collectively, our work demonstrates that the 173 zebrafish gut microbiome metabolically mediates IHP infection outcomes and reveals novel 174 microbiome-sourced anthelmintic drug leads. 175 176 Results 177 Intestinal helminthic parasite infections are overdispersed among socially isolated 178 zebrafish 179 IHP infections frequently manifest overdispersed distributions across wildlife populations, agricultural settings, and scientific laboratories^{57–59}. Prior work has shown that social behavior 180

181 and interactions can drive differences in parasite infection burden^{60–62} but it remains unclear if

182 such behavior and interactions underlie the distribution of burden. For example, in zebrafish,

183 social hierarchies and behaviors^{63–65} may impact feeding, which could result in interindividual

biases in oral exposure to infectious agents. To understand if zebrafish parasite burden

overdispersion occurs in the absence of co-housing or social dynamics, we individually housed
100 zebrafish in 1.2-L tanks and exposed 50 fish to *P. tomentosa* eggs. Stool samples were
collected from all surviving individuals at several time points: prior to *P. tomentosa* exposure,
immediately before exposure, and 29 days following parasite exposure, which prior work has
shown is the peak of infection^{49,66}. At this final time, point fish were sacrificed and infection
burden was quantified through cytological analysis of dissected intestinal tissue.
Interrogation of the distribution of infection burden among *P. tomentosa*-exposed fish 29

192 days post exposure (dpe) reveals that infection is overdispersed across the population 193 (σ^2/μ =4.719, Supplementary Figure 1), indicating that relatively small numbers of exposed 194 individuals carry the bulk of mature worms in their guts. Our investigation of socially isolated 195 individuals reveals that community social dynamics alone are not the sole drivers of 196 overdispersed helminth parasite worm burden among zebrafish populations and indicates that 197 other factors underlie this phenomenon.

198

199 Gut microbiome composition associates with parasite exposure and infection burden

Gut microbiomes display highly personalized forms across individuals^{67,68}, and variation 200 in gut microbial communities has been consistently linked to parasite infection^{66,69,70}. Thus. it is 201 202 conceivable that overdispersion in parasite infection burden outcomes results from the intricate 203 interplay between parasite exposure and gut microbiome composition that occurs in each 204 individual, where bacterial consortia could tip the scales toward susceptibility or resilience. We 205 investigated if zebrafish gut microbiome community structure is related to parasite exposure and 206 subsequent overdispersion of parasite infection burden. To investigate how gut microbiome 207 composition changes before and after parasite exposure, we generated 16S rRNA gene 208 sequence data from stool samples collected at both a pre-exposure baseline and at 29 days 209 post-exposure (dpe). In order to test whether the initial microbial community state influences the 210 microbiome's association with infection burden at the peak of infection, we initially altered fish

211	gut microbial communities by administering antibiotics three days prior to P. tomentosa parasite
212	exposure (Fig. 1). This strategy was employed to ensure variability in the gut microbiome
213	compositions across the individually housed fish, which was necessary for analyzing the
214	potential role of the gut microbiome in parasite infection. The resultant microbial diversity
215	enabled us to explore the association between distinct microbiome profiles and the differential
216	parasite burden outcomes. Microbial communities at 29 dpe were significantly stratified by both
217	parasite exposure (PERMANOVA, F=7.1618, p<0.0001) as well as parasite burden
218	(PERMANOVA, F=12.1514, p<0.0001). These results are consistent with our earlier findings ⁶⁶ ,
219	but in this case individually housing fish eliminates possible impacts of co-housing that may
220	drive homogeneity of the gut microbiome among infected versus non-infected individuals. Thus,
221	this design and these results provide particularly compelling evidence that zebrafish gut
222	microbial communities are connected to P. tomentosa and later infection success, and may
223	contribute to the overdispersion of infection burden across individuals.
223 224	contribute to the overdispersion of infection burden across individuals.
223 224 225	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure
223 224 225 226	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state
223 224 225 226 227	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked
223 224 225 226 227 228	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the
223 224 225 226 227 228 229	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the initial state of the microbiome may shape its relationship to subsequent IHP infection. Analysis
223 224 225 226 227 228 229 230	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the initial state of the microbiome may shape its relationship to subsequent IHP infection. Analysis of 16S rRNA gene sequences generated from fish stool collected after this antibiotic exposure
223 224 225 226 227 228 229 230 231	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the initial state of the microbiome may shape its relationship to subsequent IHP infection. Analysis of 16S rRNA gene sequences generated from fish stool collected after this antibiotic exposure but prior to <i>P. tomentosa</i> exposure reveals that antibiotic administration successfully altered the
223 224 225 226 227 228 229 230 231 232	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the initial state of the microbiome may shape its relationship to subsequent IHP infection. Analysis of 16S rRNA gene sequences generated from fish stool collected after this antibiotic exposure but prior to <i>P. tomentosa</i> exposure reveals that antibiotic administration successfully altered the composition of the zebrafish gut microbiome (PERMANOVA, F=27.565, p<0.0001). A
223 224 225 226 227 228 229 230 231 232 233	contribute to the overdispersion of infection burden across individuals. Effect of IHP exposure on the gut microbiome composition depends on the pre-exposure microbiome state Given that parasite colonization and the effects of parasite infection have been linked with gut microbiome composition in this work and elsewhere ⁷¹ , we reasoned that altering the initial state of the microbiome may shape its relationship to subsequent IHP infection. Analysis of 16S rRNA gene sequences generated from fish stool collected after this antibiotic exposure but prior to <i>P. tomentosa</i> exposure reveals that antibiotic administration successfully altered the composition of the zebrafish gut microbiome (PERMANOVA, F=27.565, p<0.0001). A corresponding analysis at 29 dpe shows that the relationship between fecal microbial

235 (PERMANOVA, F=3.16, p=0.009). Moreover, we find that parasite infection burden is strongly

linked to the composition of the microbiome (PERMANOVA, F=7.1618, p<0.0001, Fig. 2), but

237 that this relationship fundamentally depends on whether hosts were exposed to antibiotics first 238 (PERMANOVA, F=4.2087, p=0.002). This interaction is particularly noteworthy because at 29 239 dpe no strong relationship is observed between the composition of the gut microbiome and 240 antibiotic exposure alone (PERMANOVA, F=1.32, p=0.2277). These findings collectively 241 suggest that perturbations to the initial state of the microbiome, such as through antibiotic 242 exposure, have a cryptic effect on the successional interplay between IHP infection and the gut 243 microbiome, even when the statistical effects of antibiotic exposure are no longer prominently 244 observed.

245 This observation may be of special interest given that geographic locales which have 246 higher levels of IHP infection also tend to be locations where microbiomes may be disrupted by the use of antibiotics to manage bacterial infections^{72,73}. Given the varied influential roles of the 247 microbiome on parasite infection^{26–29}, disruption of the initial microbiome state by antibiotics may 248 249 interfere with the ability of the microbiome to protect the host from helminth infection. Elucidating 250 how antibiotic use alters the microbes involved in helminth resistance, as well as their specific 251 interactions with parasites, is crucial. This knowledge could guide the development of 252 microbiome-based therapies that supplement those protective elements and reduce the adverse 253 impacts of helminth infection.

254

255 Fecal metabolites, including salicylaldehyde and N-acylethanolamines, inversely

associate with helminth infection burden

Metabolic products convey information about the presence of pathogens and microbes^{70,74}, produce signals that underlie immune control⁷⁵, and interact within a complex network of gut microbes, the host immune system, and invading parasites, driving shifts in the intestinal environment. In order to understand the metabolomic landscape wherein zebrafish gut microbes and parasites co-locate, we performed untargeted metabolomic profiling of the fecal samples collected from the same individuals and at the same time point as our microbiome 263 profiling analysis. Prior research has shown that the zebrafish gut metabolome is composed of a diverse array of lipids and fatty acids^{76,77}, as well as amino acids and various biogenic 264 amines^{78,79}. Consistent with previous research, our annotated gut metabolomic data is also 265 266 dominated by a large number of complex lipids, vitamin and amino acid derivatives, as well as polar metabolites from many compound classes. We first sought to find metabolites from this 267 268 diverse metabolite set that are statistically associated with parasitic worm burden. Due to the high level of overdispersion frequently observed in parasite infection data^{57–59} we utilized 269 270 negative-binomial generalized linear models (GLMs) to examine the statistical relationship 271 between a set of 303 annotated metabolites and *P. tomentosa* worm burden. We uncovered 35 272 metabolites which associate with parasite worm burden among infected hosts (Negative 273 Binomial GLM, FDR<0.1, Supplementary Table 1).

274 Numerous compounds which are associated with helminth parasite worm burden have 275 also been linked to parasite infection in other work. Salicylaldehyde, a compound previously noted as a soil and plant nematicide^{80–82} shares an inverse relationship with worm burden. This 276 277 analysis also identifies compounds which have previously been linked to parasite infection such as a major form of Vitamin E, gamma-tocopherol⁸³. Additionally, at 29 dpe we find that 6 of the 8 278 compounds classed as N-acylethanolamines (NAEs) such as oleoyl ethanolamide (OEA), 279 280 linoleoyl ethanolamide (LEA), 2-linoleoyl glycerol, and related N-acylethanolamine (NAE) 281 precursor compounds (e.g., glycerophospho-N-oleoyl ethanolamine), manifest an abundance 282 profile that sharply distinguishes infected versus uninfected individuals, where infected 283 individuals display higher metabolite abundances (Wilcoxon-Rank Sum Test, p<0.05, Fig. 3a). 284 Furthermore, six of the eight NAE-related compounds in these data are strongly inversely 285 associated with parasite worm burden (Negative Binomial GLM, FDR<0.1, Fig. 3b, 286 Supplementary Table 1).

The NAE class of metabolites represents a broad family of lipid messengers that play a well-established role in energy metabolism and feeding behavior^{84–86}, as well as inflammation⁸⁵,

and prior work has established a relationship between the gut microbiome and NAEs^{87–89}, so we 289 next tested if the abundance of these metabolites is related to microbiome composition and 290 291 antibiotic exposure. Strikingly, we observed a robust association between the abundance of 292 these NAE compounds and gut microbiome composition at a time point prior to parasite exposure and following antibiotic treatment. (PERMANOVA, p<0.05, Supplementary Table 2). 293 294 Notably, at this time there is evidence that the relationship between the zebrafish gut 295 microbiome and the abundance of six NAEs depends on whether or not fish were exposed to 296 prior antibiotics (PERMANOVA, p<0.1, Supplementary Table 2). These results are further 297 underscored by our finding that the composition of the gut microbiome at 29dpe is still strongly 298 linked to NAE abundance for six different compounds (PERMANOVA, p<0.0002, 299 Supplementary Table 2). Furthermore, the relationship between the gut microbiome and NAEs 300 is underscored by our results that show antibiotic exposure interacts with NAE abundance in a 301 manner that is significantly related to gut microbiome composition for five of the eight NAE 302 metabolites (PERMANOVA, p<0.0002, Supplementary Table 2). 303 These findings reinforce the emerging view that the gut microbiome plays a fundamental 304 role in regulating NAE levels, an observation which is especially noteworthy because recent 305 work has shown that intestinal nematodes which infect humans, mice, and even insects have genes that encode functions for degradation of NAEs⁹⁰. The collective impact of our NAE 306 307 analysis shows that their abundance is starkly different in parasite-uninfected versus infected

hosts, that NAE abundance is linearly related to parasite infection burden, and that the gut
microbiome is a principal driver of NAE abundance in zebrafish hosts. Given the multifaceted
role of NAEs in host physiology, immune response, and intestinal microbiome control, plus the
ability of IHPs to degrade and produce these compounds, emphasizes the significance of these

312 compounds as a nexus in the battle between helminth parasites and vertebrates host.

314 Connections between fecal metabolite abundance and *P. tomentosa* worm burden are

315 putatively mediated by fecal microbiota

316 The prior analysis linking metabolites to parasite worm burden highlighted several 317 compounds which are also known to drive changes in intestinal microbiome composition. Given 318 the complex interplay between gut microbes and metabolite production, these findings open a 319 line of inquiry into microbiome-metabolite interactions. Zebrafish gut microbial taxa have been linked to parasite infection⁶⁶, and given the connection between some of the aforementioned 320 321 metabolites, such as NAEs, we hypothesized that the relationship between members of the gut 322 microbial community and parasite infection depends on metabolite-related cross talk. In order to 323 explore the interconnected role of metabolites, microbiota, and parasite worm burden we 324 selected parasite burden-linked metabolites and prevalent taxa, then statistically analyzed 325 individual metabolite-microbe pairings to identify relationships which may be relevant to parasite 326 burden. Our workflow applied partial correlation to a set of worm burden linked metabolites and 327 prevalent ASVs in order to identify microbe-metabolite associations which were robust after 328 accounting for the controlling influence of other microbial taxa. Additionally, we used mediation 329 inference methods to quantify whether a metabolite's statistical relationship to worm burden 330 may be hypothetically mediated by members of the microbiota. The results of this approach 331 provided a set of potential interactions between 25 metabolites and 17 members of the 332 microbiota (Adjusted Causal Mediating Effect FDR<0.3, Fig. 4), whose microbe-metabolite 333 relationship is uniquely strong in the context of other ASVs, and whose interacting relationship 334 may be relevant to parasite infection.

335 One particular edge in this possible interaction set includes salicylaldehyde and an 336 amplicon sequence variant (ASV) from the *Pelomonas* genera. Salicylaldehyde, also known as 337 2-hydroxybenzaldehyde, is an organic compound that occurs naturally in some foods such as 338 buckwheat⁹¹ and it is known that some salicylaldehyde derivatives exhibit antibacterial activity⁹². 339 As described earlier, salicylaldehyde manifests a robust inverse relationship among parasite 340 exposed fish 29 days following parasite exposure (Fig. 5a) and the microbe to which it is 341 correlated, ASV 4, is one member of a small set of microorganisms in this work that are 342 negatively related to total helminth worm burden (Negative Binomial GLM p=0.002, Fig. 5b). In 343 addition to this inverse relationship following parasite infection, we also find that it is a 344 particularly important feature for predicting later parasite infection burden. We constructed a 345 random forest regression model considering parasite worm burden as a function of all gut 346 microbial taxa present prior to parasite exposure, and found that *Pelomonas*, specifically ASV 4, 347 shows up as one of the most important taxa for predicting parasite worm burden among a 348 feature set that includes hundreds of different microbial taxa (Supplementary Figure 2). This 349 same ASV is also strongly correlated with salicylaldehyde abundance (Spearman's Correlation, 350 p=0.62, p=0.002, Fig. 5c) and is predicted to mediate the relationship between salicylaldehyde 351 and worm burden (Average Causal Mediation Effect (ACME) FDR<0.3). Little is known about 352 the function and metabolic capacity of *Pelomonas*, but given its relationship with salicylaldehyde 353 and its strong inverse relationship with helminth worm burden we surveyed available Pelomonas 354 genomes available in the NCBI genome repository to understand if the taxonomic group 355 possesses genetic pathways associated with salicylaldehyde metabolism. Several available *Pelomonas* genomes possess salicylaldehyde dehydrogenase⁹³, an enzyme responsible for 356 metabolism of salicylaldehyde, typically as part of the naphthalene degradation pathway⁹⁴, and 357 358 it has been long demonstrated that some taxa from the Pelomonas genera are capable of metabolizing diverse polycyclic aromatic hydrocarbons (PAHs) including naphthalene⁹⁵. 359 360 Pelomonas metabolic capacity to interact with salicylaldehyde could very well explain the 361 predicted mediating role of this taxon in the relationship between salicylaldehyde and worm 362 burden.

We also found that the relationship between γ-tocopherol, which is a major form of
 vitamin E, and parasite worm burden is putatively mediated by ASVs from the *Mycobacterium* and *Pseudomonas* genera and parasite worm burden. The abundance of these ASVs was

366 positively linked to worm burden in this work (Negative Binomial GLM, FDR<0.05), and in an 367 earlier investigation the genera-level abundance of both of these taxa displayed a positive correlation with IHP burden in zebrafish⁶⁶. y-tocopherol has been shown to modulate the 368 composition of the gut microbiome^{83,96} and mitigate colitis caused by LPS-induced inflammation 369 signaling in mice⁹⁷, and reduced abundance of this metabolite leaves mouse hosts more 370 susceptible to helminth infections^{98,99}. If this compound displays similar colitis mitigating and gut 371 372 microbiome altering effects in zebrafish, reduced abundance of this metabolite, either by 373 parasite infection or through metabolism by parasite-promoting taxa, may help clarify the basis 374 through which these members of the microbiota associate with increased worm burden.

375

376 Salicylaldehyde administration completely inhibits *P. tomentosa* egg larvation

377 To determine the anthelmintic effect of salicylaldehyde, we utilized both in vitro and in 378 vivo drug exposure assays to determine how exposure to the drug impacts P. tomentosa. One 379 mechanism common to many anthelmintic compounds such as albendazole and ivermectin is inhibition of worm egg larvation¹⁰⁰. Therefore, we innovated an *in vitro* assay to evaluate how 380 381 salicylaldehyde exposure impacts P. tomentosa egg larvation. Specifically, exposed 131 P. 382 tomentosa eggs to salicylaldehyde at a dose of 2mg/L, 136 eggs at 15mg/L, and a group of 242 383 eggs that were reared without exposure to salicylaldehyde. For each group, we quantified 384 larvation rates after 5 days. In the salicylaldehyde-unexposed group, 174/242 (72%) of the eggs 385 successfully larvated. Conversely, 0 eggs from either salicylaldehyde treated groups larvated 386 (Fisher's Exact Test, p<2e-16, Fig. 5d). The complete inhibition of egg larvation demonstrates 387 notable inhibition of egg-hatching in *P. tomentosa*.

We followed up on this finding by determining if salicylaldehyde can disrupt active *P. tomentosa* infection *in vivo*. To do so, we exposed 60 fish to *P. tomentosa* parasite eggs, then split the fish equally into 30 fish which were exposed to salicylaldehyde at a concentration of 2mg/L, and 30 fish that were not exposed to salicylaldehyde, but to a DMSO control. Mortality in 392 salicylaldehyde exposed and unexposed host fish was 10 and 5 fish, respectively, which started 393 at 16dpe. All examined moribund or fresh dead fish showed infections. The experiment was 394 terminated at 24 dpe, and the intestines of all surviving fish showed 100% infection in both 395 groups. Results indicate a slight reduction in infection burden among salicylaldehyde exposed 396 fish, with an average of 15 worms/fish in salicylaldehyde treated fish versus an average of 19 397 worms/fish among untreated controls (Wilcoxon Rank-Sum Test, p=0.3; Fig. 5e). Although more 398 strikingly, we found that drug treatment interfered with worm development: 7/25 (28%) the fish 399 that were not exposed to salicylaldehyde contained gravid female worms with eggs in their guts, 400 whereas no female parasites or free eggs were recovered from the salicylaldehyde-exposed 401 treatment group (Fisher's Exact Test, p=0.01, Fig. 5e). 402 Overall, these assays indicate that salicylaldehyde represents an enticing anthelmintic

drug lead, although further work is required to clarify the mechanism by which it acts, as well as to explore specificity of IHP types it is active against. Furthermore, elucidating the potential salicylaldehyde-producing capability of *Pelomonas* or other microbes may offer a microbiome oriented route for control of parasite infection.

407

408 Discussion

409 The rise of anthelmintic resistant IHPs presents an exigent challenge to identify new 410 drugs and techniques to control IHP infection. To do so we must expand our understanding of 411 the factors that underlie infection, as this knowledge can be leveraged to design new biocontrol 412 strategies. Based on the historical discovery of novel anthelmintic compounds among bacteria¹⁹ 413 as well as accumulating evidence that the intestinal microbiome affects the colonization success 414 of IHPs^{18,69}, we reasoned that exploring the metabolic landscape of the gastrointestinal 415 microbiota in the context of infection could unlock new leads in the quest for novel anthelmintic 416 strategies. To explore this idea, we investigated the relationship between gut microbes, 417 metabolites, and IHP infection in a zebrafish model using a multi-omic approach to statistical

418 mediation. In so doing, we identified a variety of metabolites that associate with infection burden 419 in a manner that is dependent upon specific microbial taxa. These relationships are valuable to 420 resolve not only because the metabolites and taxa in question may be utilized to develop novel 421 infection control strategies (e.g., anthelmintic drugs or probiotics), but because they underscore 422 the putative mechanisms by which the microbiome influences IHP infection outcomes.

423 Experimental validation of one particular lead, salicylaldehyde, reveals that our approach 424 can uncover microbially mediated compounds that elicit anthelmintic effects. Salicylaldehyde is 425 a nematicide used in agricultural settings and in our data is among the metabolites that are most 426 strongly inversely associated with worm burden. We performed follow up in vitro and in vivo 427 tests to confirm that salicylaldehyde elicits effects against *P. tomentosa*. In particular, this 428 compound completely inhibits in vitro P. tomentosa egg development and maturation. Cessation 429 of egg production following anthelmintic treatment is a common phenomenon with 430 gastrointestinal nematodes in production animals. For example, moxidectin has been 431 demonstrated to inhibit egg production in female worms of *Cooperia* that survive treatment in the early stages of resistance¹⁰¹. We observe a similar phenomenon here, where there is a 432 433 complete absence of parasite worm eggs recovered from hosts that are exposed to 434 salicylaldehyde. Previous work has also shown that salicylaldehyde prevented hatching of the potato cyst nematode, *Globodera pallida*⁸¹, but this compound is not currently used for the 435 436 control of helminth infections in animal populations, and our experiments are the first to 437 demonstrate that this compound is also capable of inhibiting egg maturation in a parasite which 438 infects vertebrate organisms. While the precise mechanism of this action is uncertain, P. 439 tomentosa eggs have relatively delicate shells and are guite susceptible to desiccation and chemical agents¹⁰². Thus, it is possible that salicylaldehyde either damages the egg shell 440 441 directly, or possibly translocates to unlarvated worms where it may impair their larvation 442 physiology. Future work should seek to uncover the specific mechanisms of action and whether 443 salicylaldehyde can elicit broad effects across IHP species that infect other hosts. Regardless,

444 our study suggests that repurposing salicylaldehyde as an anthelmintic drug against vertebrate
445 IHPs may help control infection in the face of rising multi-drug resistant IHPs.

446 As zebrafish are not capable of producing salicylaldehyde, we used statistical mediation 447 to identify a microbe from the *Pelomonas* genus as a potential source of the compound. In 448 particular, our mediation analysis finds that the relative abundance of *Pelomonas* positively 449 correlates with the abundance of salicylaldehyde and significantly explains the variation in the 450 underlying relationship between the compound and infection burden. While a variety of 451 processes may underlie these associations, prior work supports the hypothesis that these 452 patterns result from *Pelomonas*-induced metabolism of salicylaldehyde. The *Pelomonas* genus 453 is known to possess enzymes that may aid in the metabolism of salicylaldehyde, such as salicylaldehyde dehydrogenase⁹³, and is a member of a diverse set of *Betaproteobacteria* which 454 455 are known to generate and utilize this compound during the degradation of naphthalene⁹⁴. While 456 degradation of naphthalene represents one parsimonious explanation for the origin of 457 salicylaldehyde, another important alternative hypothesis regarding the origin and synthesis of 458 salicylaldehyde begins with phenylalanine. The results of our analysis point to phenylalanine as 459 a metabolite which is inversely related to parasite worm burden and whose relationship with 460 parasite worm burden is potentially mediated by Pelomonas (Fig. 4). The conversion of phenylalanine to trans-cinnamic acid is known to be performed by bacteria^{103–105}. The following 461 462 in a phenylalanine to salicylaldehyde metabolism might first require conversion of trans-463 cinnamic acid to o-coumaric acid. The terminal conversion of o-coumaric acid to salicylaldehyde is known in tobacco plants¹⁰⁶, as well as in a species of fungus¹⁰⁷, although bacterial catalysis of 464 465 this terminal reaction is not characterized. While this might represent a parsimonious 466 explanation for the biosynthesis of salicylaldehyde, more work is warranted to establish the 467 distribution of microbial participation in these pathways, especially with respect to *Pelomonas*. 468 Collectively, future research should seek to establish the precise route by which Pelomonas

469 synthesizes salicylaldehyde to affect IHP infections and whether related mechanisms exist470 among the microbiota of other vertebrate hosts.

471 Our multi-omic analysis reveals substantial alterations in NAEs and NAE precursors 472 between parasitic infected and uninfected hosts, with a potential route of control by the gut 473 microbiome. Given that NAEs play in a broad range of physiological functions such as immune regulation as well as energy metabolism and feeding behavior^{84–86,108,109}, IHPs are capable of 474 modulating NAEs to enhance infection⁹⁰, and their alteration is associated with changes in the 475 476 gut microbiome⁸⁷, these compounds represent a potentially rich area to understand the 477 intersection of parasite infection with the gut microbiome and host immune regulation. Our 478 results demonstrate that alteration of the gut microbiome by antibiotic exposure appears to drive 479 changes in NAE abundance that are sustained in the profile of several NAE compounds several 480 weeks after initial antibiotic exposure. The abundance of these compounds is also linked to IHP 481 infection and is linearly related to IHP infection burden. The NAE axis represents one route by 482 which the intestinal microbiome drives aspects of host physiology. The functions which are 483 regulated by NAE signaling such as feeding behavior and inflammation response are likely 484 relevant in explaining some aspects of parasite infection, especially given that parasites also 485 possess enzymes involved in regulating NAEs and their associated physiological functions. The 486 synthesis of these findings is complex, but elucidating the principal effects of NAE changes on 487 host physiology and parasite infection, in addition to identifying taxa whose abundance is 488 related to NAE changes, may reveal how intestinal microbiota participate in mediating host 489 response to IHPs and could reveal drug or probiotic targets that aid in control of helminth 490 infection.

While we highlight several compounds, such as salicylaldehyde and NAEs, which help explain the relationship between the gut microbiome and parasite infection, there exists a rich unexplored repository of metabolites in this data that may display similar anthelmintic activity. To better understand the metabolomic landscape relevant to IHP infection, we modeled the

495 relationship between parasite burden and metabolite abundance and elucidated a collection of 496 compounds that may be harnessed and further investigated in efforts to control parasitic 497 colonization and success. For instance, trunkamide A, a compound that is of known bacterial 498 origin¹¹⁰, and which has been examined for its antibiotic and antitumor activity¹¹¹, shows up as 499 being inversely associated with parasite burden in our data. Given the established ability of this 500 compound to be produced by bacteria, understanding its distribution among aquatic and 501 gastrointestinally associated bacteria may offer an enticing route to the discovery of novel 502 probiotic microbes which could be supplemented and stimulated to produce trunkamide A under 503 specific parasite-related conditions. Additionally, several compounds which have been explored for anthelmintic activity, including baliospermin¹¹², and genistin¹¹³, also show up in our results as 504 505 being significantly linked to parasite burden. Some of these metabolites may be of bacterial 506 origin, or modified by members of the gut microbiota, such as genistin¹¹⁴, in a manner that 507 enhances their anthelmintic activity. Applying mediation methods to understand the possible 508 relationships between these compounds and microbes involved in parasite infection may help to 509 establish microbe-dependent routes for the control of parasite infection. Collectively, these 510 findings represent an additional set of metabolomic compounds that may be explored by mining 511 the gut microbiome for potential solutions to the urgent challenge posed by increasing 512 anthelmintic drug resistance.

513 In summary, this work unravels interactions within the zebrafish gut ecosystem, yielding 514 a deeper understanding of the dynamic relationships among microbiota, metabolites, and 515 parasitic infections. These results extend the application of mediation inference methodologies 516 to reveal specific bacterial metabolites that may serve as key mediators of host-parasite 517 interactions, and identifies novel anthelmintic drug leads. Notably, salicylaldehyde emerges as a 518 compelling anthelmintic compound, and we demonstrate its ability to inhibit parasitic egg 519 maturation in zebrafish. This work also establishes the involvement of other metabolites, like N-520 acylethanolamines, in host-parasite-microbiome dynamics emphasizing the need for further

521 research to elucidate their influence. Collectively, our findings support the hypothesis that gut

522 microbiota play a role in parasite infection, and understanding the chemical means by which

523 microbiota are involved in helminth colonization may yield tools for infection control.

524

525 Methods

526 Zebrafish Husbandry, Parasite Exposure, and Parasite scoring

527 All zebrafish research was conducted under the approval of IACUC protocol 2022-0280. 528 Tropical 170 day old 5D zebrafish were obtained from the Sinnhuber Aquatic Research 529 Laboratory (Corvallis, OR). The fish were housed in a flow-through vivarium on a 14hr:10hr 530 light:dark cycle, and fed Gemma Micro 300 once a day, except on the weekends. Water 531 temperature was recorded daily and ranged from 23-28 C. There was also weekly testing of 532 ammonia (0-0.25ppm), pH (7.6), hardness (0-25 ppm), and conductivity (90-110 uS/cm) to 533 ensure high water quality. Prior to initial antibiotic exposure or parasite exposure, fish were 534 allowed to equilibrate in their tanks for 2 weeks. Each of the 100 fish used in this protocol was 535 randomly assigned to one of four unique exposure groups, no parasite and no antibiotic 536 exposure, no parasite and antibiotic exposure, parasite exposure and no antibiotics, and both 537 parasite and antibiotic exposure. After this period of equilibration, 50 out of the 100 fish were 538 exposed to a combination of antibiotics, 10mg/L colistin and 10mg/L vancomycin. Of the 100 539 fish used in the experiment, 50 were exposed to P. tomentosa eggs at a dose of 88 eggs per 540 fish.

- 541
- 542
- 543

544 Zebrafish Gut Metabolite Mass Spectrometry

545 Fecal pellets collected from individual zebrafish were promptly lyophilized to minimize 546 leaching of metabolomic content into water and then split approximately equally for use in 547 metabolomic and 16S rRNA library preparation and sequencing analyses. Due to the small 548 sample size and high water content of the fecal pellets, precise weighing was not feasible. 549 Therefore, total ion abundance normalization was implemented to account for variation in 550 sample input. Ivermectin and two isotopically labeled amino acids were incorporated into the 551 extraction mix to monitor injection accuracy and platform performance throughout the extended 552 batch run time. Zebrafish fecal samples were prepared for untargeted metabolomic analysis 553 using a modified extraction protocol. An extraction solvent consisting of equal parts 100% 554 ethanol (Sigma 1.11727.1000) and methanol (Fisher A456-1) was prepared and chilled 555 overnight at -20°C. Three 1.4mm zirconium oxide beads (VWR 10144-554) were added to each 556 2ml screw-top bead beating tube (Fisher 02-682-558). An extraction mix was then created by 557 diluting isotope standards (Cambridge Isotope Laboratories MSK-A2.1.2; 1:20 dilution) and 558 100µM Ivermectin standard (Sigma PHR1380) 1:10 in the chilled ethanol/methanol solution. 559 Twenty-five microliters of this extraction mix were added to each tube containing a fecal sample. 560 The samples were then homogenized using a Precelly's 24 bead beater (program: 2 x 5400 rpm 561 for 45s, 5s wait interval), centrifuged at 16,000 x g for 10 minutes at 4°C, and the resulting 562 supernatant (15-25µL) was transferred to glass vials (Microsolv 9532S-3CP-RS). In cases of 563 large sample volumes, an additional centrifugation step was performed.

564 Extracts were submitted for analysis using untargeted LC-HRMS/MS-based 565 metabolomics. An AB Sciex TripleTOF 5600 mass spectrometer coupled to a Shimadzu Nexera UHPLC system was used as described previously¹¹⁵. Metabolite extracts were separated using 566 567 an Inertsil Phenyl-3 column (2.1 x 140 mm, 100 Angstrom, 5 µm; GL Sciences, Torrance, CA, 568 USA). Column was held at 50°C. We used a 50-minute binary gradient system consisting of: 569 Solvent A, water (LC-MS grade) with 0.1% v/v formic acid and solvent B, methanol (LC-MS 570 grade) with 0.1% v/v formic acid. Metabolites were eluted using the following gradient program: 571 1 min, 5% B; 11 min, 30% B; 23 min, 100% B; 35 min, 100% B; 37 min, 5% B; 37 min, 5% B 572 and 50 min, 5%B. Flow rate was 0.5 mL/min. Injection volume was 10 µL. Positive IonSpray

573 voltage was set to 5200 V, negative lonSpray voltage was set to 4200 V. Source temperature 574 was 350°C. The q-TOF mass spectrometer was operated in the data-dependent mode using the 575 following settings: period cycle time 950 ms; accumulation time 100 ms; m/z scan range 50-576 1200Da; and collision energy 40 V. Mass calibration of the TOF analyzer was performed 577 automatically after every fifth LC run. 578 LC-HRMS/MS data processing was performed with Progenesis QI software V2.0 579 (NonLinear Dynamics, United Kingdom) and ABSciex Masterview (ABSciex, USA) entailing 580 peak picking, retention time correction, peak alignment, and metabolite 581 identifications/annotations. Metabolite annotations was facilitated by Progenesis QI and 582 Masterview using an in-house spectral library base on the IROA Mass Spectrometry Metabolite 583 Library of Standards (MSMLS) containing retention times, exact mass and MS/MS information 584 of >650 metabolite standards (IROA Technologies, Bolton, MA, USA). This workflow allows 585 obtaining high confidence annotations (L1). In addition, tentative metabolite annotations were 586 obtained by searching the METLIN MS/MS library in Progenesis QI.

587

588 Microbial 16S rRNA Library Preparation and Sequencing

589 Fecal samples were collected from individual adult fish at Days 0, 3, and 32. Fish 590 mortality and parasite exposure precluded the collection of fecal pellets from every fish at all 591 time points. For samples and time points at which fecal samples could be collected, DNA was 592 isolated using the Qiagen DNeasy PowerSoil kit, in accordance with the manufacturer's directions. After a 10-minute incubation at 65°C, samples were subjected to bead beating, using 593 594 0.7mm garnet beads, for 20 minutes using the Vortex Genie 2 (Fisher, Hampton, NH, USA). 595 PCR was performed in triplicate using 1 microliter of purified DNA from the lysis solution to amplify the V4 region of the 16S rRNA gene, using the 806r and 515f primer set¹¹⁶. Amplified 596 597 DNA collections were quantified using a Qubit HS Kit (Carlsbad, CA, USA). An equal quantity of 598 DNA was selected from each of the 252 samples, for a total DNA mass of 200ng, and the

pooled collection of DNA was cleaned using the QIAGEN QIAquick PCR purification kit thendiluted to a final concentration of 10nM. The final pooled DNA collection was sequenced by the

601 Center for Quantitative Life Sciences at Oregon State University, using an Illumina MiSeq

- 602 instrument with 250-bp paired-end reads.
- 603

604 Zebrafish Gut Microbiome Community Diversity Analyses

Read quality filtering was performed using DADA2¹¹⁷ with R 4.1.2. Alpha and beta-605 606 diversity analyses were performed using a relative abundance-normalized sequence count 607 table. Generalized linear mixed effects models were used to model species richness and 608 Shannon diversity as a function of longitudinal timepoint, fish id, antibiotic exposure, parasite 609 exposure, and an interaction of antibiotic and parasite exposure. Bray-curtis dissimilarity and subsequent NMDS ordination was performed using vegan¹¹⁸. To clarify how antibiotic 610 611 administration, parasite exposure, and other host factors relate to gut community composition 612 we used permutational multivariate analysis of variance (PERMANOVA, adonis2, vegan) with 613 10,000 permutations.

614

615 Mediation analysis of gut bacteria and metabolites

616 Regression-based mediation analysis was used to investigate the hypothesis that the 617 relationship between fecal metabolites to nematode parasite burden is mediated by the 618 abundance of gut microbiota. Briefly, the standard approach for these techniques employs 619 regression modeling to analyze the association between two variables, then models the 620 possible effect of a mediating variable on the relationship between the variables in the initial 621 model. We constrained the initial feature space by selecting metabolites for which annotation 622 and research-characterized biological identity was available. Sparsity of gut bacterial data 623 challenges statistical investigation of correlation, so only taxa whose relative abundance was 624 greater than 0 in more than 30% of samples were used. Microbiome data was normalized using 625 relative abundance, and the log of metabolite MS abundance was log transformed adding 1 to 626 initial values which were equal to 0. Initial feature selection yielded 40 prominent bacterial taxa, 627 and 27 metabolite compounds which were significantly related to worm burden (NB-GLM, FDR < 0.1). We utilized the nptest package¹¹⁹ to test for partial correlation for pairwise relationships 628 629 between metabolites and bacterial taxa. We applied partial correlation for each microbe-630 metabolite pairing, and used all remaining taxa as conditioning variables to isolate direct 631 microbe-metabolite links. Pairings with an FDR-adjusted relationship <0.3 were considered. 632 Concurrently, ASV mediation of metabolite-parasite burden was tested using the mediation package¹²⁰ in R, where metabolites were coded to represent high and low metabolite 633 634 abundances, with ASVs as mediators. Average causal mediation effect (ACME), average direct 635 effect (ADE), and proportion of direct effect mediated were calculated for each model of 636 microbe-metabolite pairing. Family-wise error rates were controlled by applying Benjamini-637 Hochberg FDR correction (FDR<0.3) to partial correlation and ACME p-values for tested 638 mediating relationships. Visualizations of putative mediating interactions were visualized using applot2¹²¹. Code to recreate the mediation analysis and visualizations is available here 639 640 (https://github.com/CodingUrsus/Zebrafish Microbiome and Parasites).

641

642 Salicylaldehyde Toxicity Assay

A toxicity assessment identified the highest SA dose which did not result in significant mortality. Adult zebrafish were aqueously exposed to SA in two 48 hr periods spaced 5 days apart. The fish were monitored for any adverse health effects including mortality, and fish were evaluated to ensure they were alive and capable of active movement. Toxicity endpoints were evaluated from the initial exposure to 7 days after the last exposure. The chemicals used in this study were salicylaldehyde (SA, cas: 90-02-8) and dimethyl sulfoxide (DMSO, cas: 67-68-5). Salicylaldehyde was obtained from Tokyo Chemical Industries (lot: J052M-EQ) and DMSO was purchased from VWR (lot: 22H2456964). Dilutions were made with 100% DMSO and stored in
closed vials in a desiccator at room temperature.

Fish were aqueously exposed to 0,1, 2, 3, 5, and 10 mg/L of SA with 0.01% DMSO. The 0-2 mg/L groups had two replicate tanks containing 16 males and 16 females. Furthermore, the 3-10 mg/L groups had 1 replicate tank containing 6 males and 6 females. The 3-10 mg/L exposure groups were intended as positive controls, to ensure that null effects were not a result of no chemical exposure.

Exposure groups 0-2 mg/L SAL occurred in 9L tanks first filled with 3L of system water followed by 1mL of a concentrated SA stock solution. Following the addition of SA, the remaining 3L of fish water was added to the tank to mix the chemical. The 3-10 mg/L exposures were conducted in 2.8L tanks and followed the same chemical additional pattern. However, only a total of 2L of water was added to the tank. Solutions were refreshed every 24 hrs using the same method previously described. Lastly, each exposure tank was aerated with an air stone and the fish were not fed, to preserve water quality.

664

665 Parasite Salicylaldehyde Exposure Assays

666 **a.**

a. in vivo Salicylaldehyde Exposure

Based on our previous transmission studies^{49,102}, we experimentally infected 100 5D line 667 668 fish by placing them in a large tank from which \sim 30 infected fish were removed the day before. 669 The recipient fish were exposed in the infection tank for 5 days. P. tomentosa infection was 670 promoted within the tank by reducing the waterflow, not removing the detritus, and keeping fish 671 carcasses in the tank. Over a 5-day period, 1L of water from another infected tank was added to 672 the exposure tank to further enhance infection. After 5 days of exposure, the remaining fish 673 (~75) were randomly divided into four 9L tanks, two control tanks and two salicylaldehyde 674 exposure tanks.

675 Fish were then exposed to salicylaldehyde in the same manner as the toxicity trials in 676 their aquaria with the water turned off at 14-15 and 21-22 days post initial exposure (dpe). Using 677 the results of the toxicity trial, fish were dosed with either 2mg/L SA with 0.01% DMSO or 0.01% 678 DMSO (controls). Fish were monitored daily, and fresh dead fish were examined for the 679 presence of the worm. At 24 dpe, the infection status of the fish was evaluated using wet 680 mounts. The fish were first euthanized using a hypodermic shock. Following euthanasia, the gut 681 was dissected out of the fish and placed on a glass slide with a 60 X 24 mm coverslip with about 682 200 µL of water. The gut was compressed with a cover slip and viewed on a compound 683 microscope at 50 and 100x magnification. While viewing the guts the number of immature 684 worms, mature female eggs were counted. Each slide was read by two different readers within 685 about 20 min., and the average worm counts were used for future analyses.

686

b. Egg Larvation Assay

We tested the ability of SA to inhibit egg larvation through two separate trials in line with previously used protocols¹⁰². Briefly, *P. tomentosa* eggs were collected by placing fish in a 10L static tank for 2 days. After two days, the water was filtered through a custom 3D printed filter apparatus fitted with 105, 40, and 25 μ m nylon screens. The material retained on the 25 μ m screen was collected in 15 mL conical tubes and centrifuged at ~3,000 x g for 5 minutes. The supernatant was decanted until 1ml of water remained.

693 In a first trial, collected eggs were exposed to 0, 2 or 15 mg/L of salicylaldehyde with 694 0.01% DMSO in 15 mL conical tubes. Eggs were transferred into each exposure group by 695 pipetting 200 µL of the egg pellet formed as described above into each conical tube. The 696 solution was homogenized and transferred to a 30°C room for incubation. P. tomentosa egg 697 larvation was quantified after 5 days of SA exposure (~10 days old). A second trial was 698 conducted where eggs were placed in a container on a shaker to aid in distribution of DMSO 699 control and SA throughout the egg-hatching solution. Eggs were exposed to 0, or 2 mg/L of SA 700 with 0.01% DMSO in 15 mL conical tubes, with the shaker on speed setting 2.5 (Hoefer, San

701	Francisco CA) throughout the exposure. Larvation of eggs was quantified 3 days after SA			
702	exposure (~6 days old). In both trials, after exposure eggs were collected by centrifuging the			
703	tubes at 5,000 rpm for 5 minutes. The eggs were subsampled by taking $20\mu L$ of water from th			
704	bottom of the tube and placing them on a glass slide and covered with a glass 24x24 mm			
705	coverslip. The number of larvated and unlarvated/dead eggs were counted using a compound			
706	microscope at 50, 100 or 400x magnification.			
707				
708	Acknowledgements			
709	We would like to express our gratitude to Kristin Kasschau and Alexandra Alexiev for			
710	their valuable insights on microbial growth and metabolism requirements.			
711	This project was supported by NIH NIAID R21 to TJS (R21AI135641), NIH NIEHS R01			
712	to TJS (R01ES030226), NSF grant (2025457) to TJS, NIH grant (S10RR027878) to JFS, and			
713	Tartar fellowship to AJH.			
714				
715	Data Availability			
716	The nucleotide data underlying the findings of this study are available in the NCBI			
717	Sequence Read Archive (SRA) under BioProject ID PRJNA1132310, and annotated			
718	metabolomic data from positive and negative ion modes are available here			
719	(https://github.com/CodingUrsus/Zebrafish Microbiome and Parasites/).			
720	Poforonooo			
722	References			
723	1. Maizels, R. M., Smits, H. H. & McSorley, H. J. Modulation of Host Immunity by Helminths:			
724	The Expanding Repertoire of Parasite Effector Molecules. Immunity 49, 801-818 (2018).			
725	2. Hall, A., Hewitt, G., Tuffrey, V. & De Silva, N. A review and meta-analysis of the impact of			
726	intestinal worms on child growth and nutrition. Matern. Child. Nutr. 4, 118–236 (2008).			
727	3. Crompton, D. W. T. & Nesheim, M. C. Nutritional Impact of Intestinal Helminthiasis During			

the Human Life Cycle. *Annu. Rev. Nutr.* **22**, 35–59 (2002).

- 4. Charlier, J., Voort, M. van der, Kenyon, F., Skuce, P. & Vercruysse, J. Chasing helminths
- and their economic impact on farmed ruminants. *Trends Parasitol.* **30**, 361–367 (2014).
- 5. Agriculture | Free Full-Text | Global Change and Helminth Infections in Grazing Ruminants
- in Europe: Impacts, Trends and Sustainable Solutions. https://www.mdpi.com/2077-
- 733 0472/3/3/484.
- 6. Charlier, J. *et al.* Initial assessment of the economic burden of major parasitic helminth
- infections to the ruminant livestock industry in Europe. *Prev. Vet. Med.* **182**, 105103 (2020).
- 736 7. Charlier, J., Höglund, J., von Samson-Himmelstjerna, G., Dorny, P. & Vercruysse, J.
- 737 Gastrointestinal nematode infections in adult dairy cattle: Impact on production, diagnosis
- 738 and control. *Vet. Parasitol.* **164**, 70–79 (2009).
- 739 8. Roche, M. & Layrisse, M. The nature and causes of 'hookworm anemia'. *Am. J. Trop. Med.*740 *Hyg.* **15**, 1029–1102 (1966).
- 9. EZEAMAMA, A. E. *et al.* HELMINTH INFECTION AND COGNITIVE IMPAIRMENT AMONG
 FILIPINO CHILDREN. *Am. J. Trop. Med. Hyg.* **72**, 540–548 (2005).
- 10. Raj, E., Calvo-Urbano, B., Heffernan, C., Halder, J. & Webster, J. P. Systematic review to
- evaluate a potential association between helminth infection and physical stunting in
- 745 children. *Parasit. Vectors* **15**, 135 (2022).
- 11. Hotez, P. J. *et al.* The Global Burden of Disease Study 2010: Interpretation and Implications
 for the Neglected Tropical Diseases. *PLoS Negl. Trop. Dis.* **8**, e2865 (2014).
- 12. Echevarria, F., Borba, M. F. S., Pinheiro, A. C., Waller, P. J. & Hansen, J. W. The
- prevalence of anthelmintic resistance in nematode parasites of sheep in Southern Latin
 America: Brazil. *Vet. Parasitol.* 62, 199–206 (1996).
- 13. Van Wyk, J. A., Stenson, M. O., Van der Merwe, J. S., Vorster, R. J. & Viljoen, P. G.
- Anthelmintic resistance in South Africa: surveys indicate an extremely serious situation in
- sheep and goat farming. Onderstepoort J. Vet. Res. 66, 273–284 (1999).

- 14. Gasbarre, L. C. Anthelmintic resistance in cattle nematodes in the US. *Vet. Parasitol.* 204,
 3–11 (2014).
- 15. Geerts, S. & Gryseels, B. Anthelmintic resistance in human helminths: a review. *Trop. Med. Int. Health* 6, 915–921 (2001).
- 758 16. Fissiha, W. & Kinde, M. Z. Anthelmintic Resistance and Its Mechanism: A Review. *Infect.*759 *Drug Resist.* 14, 5403–5410 (2021).
- 17. Nielsen, M. K., Kaplan, R. M., Abbas, G. & Jabbar, A. Biological implications of long-term
 anthelmintic treatment: what else besides resistance are we selecting for? *Trends Parasitol.*39, 945–953 (2023).
- 18. Sharpton, T. J., Combrink, L., Arnold, H. K., Gaulke, C. A. & Kent, M. Harnessing the gut
- 764 microbiome in the fight against anthelminthic drug resistance. *Curr. Opin. Microbiol.* 53, 26–
 765 34 (2020).
- 19. Burg, R. W. et al. Avermectins, New Family of Potent Anthelmintic Agents: Producing
- 767 Organism and Fermentation. *Antimicrob. Agents Chemother.* **15**, 361–367 (1979).
- 20. Johansson, M. E. V. et al. Normalization of Host Intestinal Mucus Layers Requires Long-
- 769 Term Microbial Colonization. *Cell Host Microbe* **18**, 582–592 (2015).
- 21. Petersson, J. et al. Importance and regulation of the colonic mucus barrier in a mouse
- model of colitis. *Am. J. Physiol. Gastrointest. Liver Physiol.* **300**, G327-333 (2011).
- 22. Jakobsson, H. E. *et al.* The composition of the gut microbiota shapes the colon mucus
- 773 barrier. *EMBO Rep.* **16**, 164–177 (2015).
- 23. Liang, L. et al. Gut microbiota-derived butyrate regulates gut mucus barrier repair by
- activating the macrophage/WNT/ERK signaling pathway. *Clin. Sci.* **136**, 291–307 (2022).
- 24. Waclawiková, B., Codutti, A., Alim, K. & El Aidy, S. Gut microbiota-motility interregulation:
- insights from in vivo, ex vivo and in silico studies. *Gut Microbes* **14**, 1997296.
- 25. Obata, Y. *et al.* Neuronal programming by microbiota regulates intestinal physiology. *Nature*
- **578**, 284–289 (2020).

- 780 26. Kommineni, S. et al. Bacteriocin production augments niche competition by enterococci in
- 781 the mammalian GI tract. *Nature* **526**, 719–722 (2015).
- 782 27. Zipperer, A. et al. Human commensals producing a novel antibiotic impair pathogen
- 783 colonization. *Nature* **535**, 511–516 (2016).
- 28. Sassone-Corsi, M. et al. Microcins mediate competition among Enterobacteriaceae in the
- 785 inflamed gut. *Nature* **540**, 280–283 (2016).
- 29. Hayes, K. S. et al. Exploitation of the Intestinal Microflora by the Parasitic Nematode
- 787 Trichuris muris. *Science* **328**, 1391–1394 (2010).
- 30. Zheng, D., Liwinski, T. & Elinav, E. Interaction between microbiota and immunity in health
- 789 and disease. *Cell Res.* **30**, 492–506 (2020).
- 31. Gazzinelli-Guimaraes, P. H. & Nutman, T. B. Helminth parasites and immune regulation.
- 791 *F1000Research* **7**, F1000 Faculty Rev-1685 (2018).
- 32. Maizels, R. M. & McSorley, H. J. Regulation of the host immune system by helminth
 parasites. J. Allergy Clin. Immunol. 138, 666–675 (2016).
- 33. Baron, R. M. & Kenny, D. A. The moderator-mediator variable distinction in social
- psychological research: conceptual, strategic, and statistical considerations. J. Pers. Soc.
- 796 *Psychol.* **51**, 1173–1182 (1986).
- 34. Sohn, M. B. & Li, H. Compositional Mediation Analysis for Microbiome Studies. *Ann. Appl. Stat.* 13, 661–681 (2019).
- 35. Carter, K. M., Lu, M., Jiang, H. & An, L. An Information-Based Approach for Mediation
- Analysis on High-Dimensional Metagenomic Data. *Front. Genet.* **11**, 148 (2020).
- 36. Zhang, H., Chen, J., Li, Z. & Liu, L. Testing for Mediation Effect with Application to Human
 Microbiome Data. *Stat. Biosci.* 13, 313–328 (2021).
- 37. Zhang, J., Wei, Z. & Chen, J. A distance-based approach for testing the mediation effect of
 the human microbiome. *Bioinformatics* 34, 1875–1883 (2018).
- 38. Zhang, Q. et al. Genetic mapping of microbial and host traits reveals production of

- immunomodulatory lipids by Akkermansia muciniphila in the murine gut. *Nat. Microbiol.* **8**,
- 807 424–440 (2023).
- 39. Shi, H. *et al.* The gut microbiome as mediator between diet and its impact on immune
 function. *Sci. Rep.* **12**, 5149 (2022).
- 40. Maturation of the gut microbiome during the first year of life contributes to the protective
- farm effect on childhood asthma | Nature Medicine. https://www.nature.com/articles/s41591020-1095-x.
- 41. Schoemann, A. M., Boulton, A. J. & Short, S. D. Determining Power and Sample Size for
- Simple and Complex Mediation Models. Soc. Psychol. Personal. Sci. 8, 379–386 (2017).
- 42. The gut microbiota contributes to the pathogenesis of anorexia nervosa in humans and mice
- 816 | Nature Microbiology. https://www.nature.com/articles/s41564-023-01355-5.
- 43. Xia, H. et al. Zebrafish: an efficient vertebrate model for understanding role of gut
- 818 microbiota. *Mol. Med.* **28**, 161 (2022).
- 44. Phillips, J. B. & Westerfield, M. Zebrafish models in translational research: tipping the scales
 toward advancements in human health. *Dis. Model. Mech.* 7, 739–743 (2014).
- 45. Adhish, M. & Manjubala, I. Effectiveness of zebrafish models in understanding human
 diseases—A review of models. *Heliyon* 9, e14557 (2023).
- 46. Sharpton, T. J., Stagaman, K., Sieler, M. J., Arnold, H. K. & Davis, E. W. Phylogenetic
- 824 Integration Reveals the Zebrafish Core Microbiome and Its Sensitivity to Environmental
 825 Exposures. *Toxics* 9, 10 (2021).
- 47. Roeselers, G. *et al.* Evidence for a core gut microbiota in the zebrafish. *ISME J.* 5, 1595–
 1608 (2011).
- 48. Gaulke, C. et al. An Integrated Gene Catalog of the Zebrafish Gut Microbiome Reveals
- 829 Significant Homology with Mammalian Microbiomes. (2020).
- 830 doi:10.1101/2020.06.15.153924.
- 49. Kent, M. L., Gaulke, C. A., Watral, V. & Sharpton, T. J. Pseudocapillaria tomentosa in

832 laboratory zebrafish (Danio rerio): Patterns of infection and dose response. *Dis. Aquat.*

833 *Organ.* **131**, 121–131 (2018).

- 50. Nathan, J. & Kannan, R. R. Antiangiogenic molecules from marine actinomycetes and the importance of using zebrafish model in cancer research. *Heliyon* **6**, e05662 (2020).
- 51. Yang, L. *et al.* Zebrafish embryos as models for embryotoxic and teratological effects of
 chemicals. *Reprod. Toxicol.* 28, 245–253 (2009).
- 52. Jia, H.-R., Zhu, Y.-X., Duan, Q.-Y., Chen, Z. & Wu, F.-G. Nanomaterials meet zebrafish:
- Toxicity evaluation and drug delivery applications. *J. Controlled Release* 311–312, 301–318
 (2019).
- 53. Crawford, A. D. et al. Zebrafish Bioassay-Guided Natural Product Discovery: Isolation of

Angiogenesis Inhibitors from East African Medicinal Plants. *PLOS ONE* **6**, e14694 (2011).

- 54. Pitchai, A., Rajaretinam, R. K. & Freeman, J. L. Zebrafish as an Emerging Model for
- Bioassay-Guided Natural Product Drug Discovery for Neurological Disorders. *Medicines* 6,
 61 (2019).
- 55. Delgadillo-Silva, L. F. *et al.* Modelling pancreatic β-cell inflammation in zebrafish identifies
 the natural product wedelolactone for human islet protection. *Dis. Model. Mech.* 12,
 dmm036004 (2010)
- 848 dmm036004 (2019).
- 56. Kent, M. L., Harper, C. & Wolf, J. C. Documented and Potential Research Impacts of
 Subclinical Diseases in Zebrafish. *ILAR J. Natl. Res. Counc. Inst. Lab. Anim. Resour.* 53,
 126–134 (2012).
- 57. Crofton, H. D. A quantitative approach to parasitism. *Parasitology* **62**, 179–193 (1971).
- 853 58. Shaw, D. J. & Dobson, A. P. Patterns of macroparasite abundance and aggregation in
 854 wildlife populations: a quantitative review. *Parasitology* **111 Suppl**, S111-127 (1995).
- 59. Rabajante, J. F. On Spatiotemporal Overdispersion and Macroparasite Accumulation in

Hosts Leading to Aggregation: A Quantitative Framework. *Diseases* **11**, 4 (2022).

60. MacIntosh, A. J. J. *et al.* Monkeys in the Middle: Parasite Transmission through the Social

858 Network of a Wild Primate. *PLOS ONE* **7**, e51144 (2012).

- 859 61. Ezenwa, V. O. & Worsley-Tonks, K. E. L. Social living simultaneously increases infection
- risk and decreases the cost of infection. *Proc. R. Soc. B Biol. Sci.* 285, 20182142 (2018).
- 861 62. Otterstatter, M. C. & Thomson, J. D. Contact networks and transmission of an intestinal
- pathogen in bumble bee (Bombus impatiens) colonies. *Oecologia* **154**, 411–421 (2007).
- 63. Oliveira, R. F. Mind the fish: zebrafish as a model in cognitive social neuroscience. *Front.*
- 864 *Neural Circuits* **7**, 131 (2013).
- 865 64. Jones, L. J. & Norton, W. H. J. Using zebrafish to uncover the genetic and neural basis of
- aggression, a frequent comorbid symptom of psychiatric disorders. *Behav. Brain Res.* 276,
- 867 171–180 (2015).
- 868 65. Green, J. *et al.* Automated high-throughput neurophenotyping of zebrafish social behavior.
- 869 *J. Neurosci. Methods* **210**, 266–271 (2012).
- 870 66. Gaulke, C. A. et al. A longitudinal assessment of host-microbe-parasite interactions resolves
- the zebrafish gut microbiome's link to Pseudocapillaria tomentosa infection and pathology.
- 872 *Microbiome* **7**, 10 (2019).
- 873 67. Turnbaugh, P. J. *et al.* A core gut microbiome in obese and lean twins. *Nature* 457, 480–
 874 484 (2009).
- 875 68. The Gut Microbiome and Individual-Specific Responses to Diet | mSystems.
- 876 https://journals.asm.org/doi/10.1128/msystems.00665-20.
- 877 69. Zaiss, M. M. & Harris, N. L. Interactions between the intestinal microbiome and helminth
 878 parasites. *Parasite Immunol.* 38, 5–11 (2016).
- 70. Leung, J. M., Graham, A. L. & Knowles, S. C. L. Parasite-Microbiota Interactions With the
 Vertebrate Gut: Synthesis Through an Ecological Lens. *Front. Microbiol.* 9, (2018).
- 71. Pickard, J. M., Zeng, M. Y., Caruso, R. & Núñez, G. Gut Microbiota: Role in Pathogen
- 882 Colonization, Immune Responses and Inflammatory Disease. *Immunol. Rev.* 279, 70–89
- 883 (2017).

- 884 72. Browne, A. J. *et al.* Global antibiotic consumption and usage in humans, 2000–18: a spatial
 885 modelling study. *Lancet Planet. Health* 5, e893–e904 (2021).
- 886 73. Pullan, R. L. & Brooker, S. J. The global limits and population at risk of soil-transmitted
- helminth infections in 2010. *Parasit. Vectors* **5**, 81 (2012).
- 74. Wang, L. *et al.* Microbiome-Metabolomics Analysis of the Impacts of Cryptosporidium muris
 Infection in BALB/C Mice. *Microbiol. Spectr.* **11**, e02175-22.
- 890 75. Yang, W. & Cong, Y. Gut microbiota-derived metabolites in the regulation of host immune
- responses and immune-related inflammatory diseases. *Cell. Mol. Immunol.* **18**, 866–877
- 892 (2021).
- 76. da Silva, K. M. *et al.* Mass Spectrometry-Based Zebrafish Toxicometabolomics: A Review of
 Analytical and Data Quality Challenges. *Metabolites* **11**, 635 (2021).
- 895 77. Medriano, C. A. & Bae, S. Acute exposure to microplastics induces metabolic disturbances
 896 and gut dysbiosis in adult zebrafish (*Danio rerio*). *Ecotoxicol. Environ. Saf.* 245, 114125
- 897 (2022).
- 898 78. Aguilar, A. et al. Metabolomic Profiling Reveals Changes in Amino Acid and Energy
- 899 Metabolism Pathways in Liver, Intestine and Brain of Zebrafish Exposed to Different
- 900 Thermal Conditions. *Front. Mar. Sci.* 9, (2022).
- 901 79. Sun, B. *et al.* Variability in fecal metabolome depending on age, PFBS pollutant, and fecal
 902 transplantation in zebrafish: A non-invasive diagnosis of health. *J. Environ. Sci.* 127, 530–
 903 540 (2023).
- 80. Caboni, P. et al. Potent Nematicidal Activity of Phthalaldehyde, Salicylaldehyde, and
- 905 Cinnamic Aldehyde against Meloidogyne incognita. *J. Agric. Food Chem.* 61, 1794–1803
 906 (2013).
- 907 81. Danquah, W. B., Back, M. A., Grove, I. G. & Haydock, P. P. J. In vitro nematicidal activity of
- a garlic extract and salicylaldehyde on the potato cyst nematode, Globodera pallida.
- 909 *Nematology* **13**, 869–885 (2011).

- 82. Bahiri, G. & Elliott, I. Composition containing salicylaldehyde nematicides and garlic extract.(2013).
- 912 83. Choi, Y. *et al.* Vitamin E (α-tocopherol) consumption influences gut microbiota composition.
- 913 Int. J. Food Sci. Nutr. **71**, 221–225 (2020).
- 914 84. Hansen, H. S. & Diep, T. A. N-acylethanolamines, anandamide and food intake. *Biochem.*
- 915 Pharmacol. **78**, 553–560 (2009).
- 916 85. Tsuboi, K., Uyama, T., Okamoto, Y. & Ueda, N. Endocannabinoids and related N-
- 917 acylethanolamines: biological activities and metabolism. *Inflamm. Regen.* **38**, 28 (2018).
- 918 86. Mennella, I., Boudry, G. & Val-Laillet, D. Ethanolamine Produced from Oleoylethanolamide
- 919 Degradation Contributes to Acetylcholine/Dopamine Balance Modulating Eating Behavior. J.
- 920 Nutr. **149**, 362–365 (2019).
- 921 87. Fornelos, N. et al. Growth effects of N-acylethanolamines on gut bacteria reflect altered
- bacterial abundances in Inflammatory Bowel Disease. *Nat. Microbiol.* **5**, 486–497 (2020).
- 923 88. Hasan, A. U., Rahman, A. & Kobori, H. Interactions between Host PPARs and Gut
- 924 Microbiota in Health and Disease. *Int. J. Mol. Sci.* **20**, 387 (2019).
- 925 89. Oleoylethanolamide treatment affects gut microbiota composition and the expression of
- 926 intestinal cytokines in Peyer's patches of mice | Scientific Reports.
- 927 https://www.nature.com/articles/s41598-018-32925-x.
- 928 90. Host- and Helminth-Derived Endocannabinoids That Have Effects on Host Immunity Are
- 929 Generated during Infection PMC. https://www.ncbi.nlm.nih.gov/pmc/articles/PMC6204704/.
- 930 91. Janeš, D. & Kreft, S. Salicylaldehyde is a characteristic aroma component of buckwheat
- 931 groats. Food Chem. **109**, 293–298 (2008).
- 932 92. Antimicrobial Properties of Substituted Salicylaldehydes and Related Compounds.
- 933 https://www.degruyter.com/document/doi/10.1515/znc-2007-7-806/html.
- 934 93. salicylaldehyde pelomonas Protein NCBI.
- 935 https://www.ncbi.nlm.nih.gov/protein/?term=salicylaldehyde%20pelomonas.

- 936 94. Jia, B. *et al.* Evolutionary, computational, and biochemical studies of the salicylaldehyde
- 937 dehydrogenases in the naphthalene degradation pathway. *Sci. Rep.* **7**, 43489 (2017).
- 938 95. Stringfellow, W. T. & Aitken, M. D. Competitive metabolism of naphthalene,
- 939 methylnaphthalenes, and fluorene by phenanthrene-degrading pseudomonads. *Appl.*
- 940 Environ. Microbiol. **61**, 357–362 (1995).
- 941 96. Pham, V. T., Dold, S., Rehman, A., Bird, J. K. & Steinert, R. E. Vitamins, the gut microbiome
- and gastrointestinal health in humans. *Nutr. Res.* **95**, 35–53 (2021).
- 943 97. Liu, K. Y., Nakatsu, C. H., Jones-Hall, Y., Kozik, A. & Jiang, Q. Vitamin E alpha- and
- gamma-tocopherol mitigate colitis, protect intestinal barrier function and modulate the gut
- 945 microbiota in mice. *Free Radic. Biol. Med.* **163**, 180–189 (2021).
- 946 98. Smith, A. *et al.* Deficiencies in Selenium and/or Vitamin E Lower the Resistance of Mice to
 947 Heligmosomoides polygyrus Infections. *J. Nutr.* **135**, 830–836 (2005).
- 948 99. Au Yeung, K. J. *et al.* Impact of vitamin E or selenium deficiency on nematode-induced
- alterations in murine intestinal function. *Exp. Parasitol.* **109**, 201–208 (2005).
- 950 100. Sutherland, I. A., Brown, A. E. & Leathwick, D. M. The effect of anthelmintic capsules on
- 951 the egg output and larval viability of drug-resistant parasites. *Vet. Res. Commun.* 27, 149–
 952 157 (2003).
- 953 101. Yazwinski, T. A. *et al.* Control trial and fecal egg count reduction test determinations of
 954 nematocidal efficacies of moxidectin and generic ivermectin in recently weaned, naturally
 955 infected calves. *Vet. Parasitol.* **195**, 95–101 (2013).
- 956 102. Kent, M. L., Watral, V., Villegas, E. N. & Gaulke, C. A. Viability of Pseudocapillaria
- 957 tomentosa Eggs Exposed to Heat, Ultraviolet Light, Chlorine, Iodine, and Desiccation.
 958 *Zebrafish* 16, 460–468 (2019).
- 959 103. Xiang, L. & Moore, B. S. Biochemical Characterization of a Prokaryotic Phenylalanine
 960 Ammonia Lyase. *J. Bacteriol.* 187, 4286–4289 (2005).
- 961 104. Moffitt, M. C. et al. Discovery of Two Cyanobacterial Phenylalanine Ammonia

- 962 Lyases: Kinetic and Structural Characterization, *Biochemistry* **46**, 1004–1012 (2007).
- 963 105. Lovelock, S. L. & Turner, N. J. Bacterial Anabaena variabilis phenylalanine ammonia
- 964 Iyase: A biocatalyst with broad substrate specificity. *Bioorg. Med. Chem.* 22, 5555–5557
 965 (2014).
- 966 106. Malinowski, J., Krzymowska, M., Godoń, K., Hennig, J. & Podstolski, A. A new catalytic
 967 activity from tobacco converting 2-coumaric acid to salicylic aldehyde. *Physiol. Plant.* 129,
 968 461–471 (2007).
- 969 107. Sarkate, A., Saini, S. S., Kumar, P., Sharma, A. K. & Sircar, D. Salicylaldehyde synthase
- 970 activity from *Venturia inaequalis* elicitor-treated cell culture of apple. J. Plant Physiol. 221,
- 971 66–73 (2018).
- 972 108. Kurlyandchik, I., Lauche, R., Tiralongo, E., Warne, L. N. & Schloss, J. Plasma and
- 973 interstitial levels of endocannabinoids and N-acylethanolamines in patients with chronic
- 974 widespread pain and fibromyalgia: a systematic review and meta-analysis. *Pain Rep.* **7**,
- 975 e1045 (2022).
- 976 109. N-acylethanolamines, anandamide and food intake. *Biochem. Pharmacol.* 78, 553–560
 977 (2009).
- 978 110. A global assembly line for cyanobactins | Nature Chemical Biology.
- 979 https://www.nature.com/articles/nchembio.84.
- 980 111. Solution Structure of the Antitumor Candidate Trunkamide A by 2D NMR and Restrained
 981 Simulated Annealing Methods | The Journal of Organic Chemistry.
- 982 https://pubs.acs.org/doi/full/10.1021/jo026464s?casa_token=KzS8l6i1jNwAAAAA%3AQRdq
- 983 pq0aHtclmJGnqlOBO1D3g2fnCeCGjq5fm9021ybsdCxDNJ8jK5QJpP-
- 984 bvMP93gFiXqJejPdu1b8.
- 985 112. In vitro anthelmintic activity of Baliospermum montanum muell. arg roots Document -

986 Gale Academic OneFile.

987 https://go.gale.com/ps/i.do?p=AONE&u=googlescholar&id=GALE|A178741632&v=2.1&it=r&

988 sid=AONE&asid=9e18e60e.

- 989 113. Tandon, V. & Das, B. Genistein: is the multifarious botanical a natural anthelmintic too?
- 990 J. Parasit. Dis. Off. Organ Indian Soc. Parasitol. 42, 151–161 (2018).
- 991 114. Comparative metabolism of genistin by human and rat gut microflora: detection and
- identification of the end-products of metabolism: Xenobiotica: Vol 32, No 1.
- 993 https://www.tandfonline.com/doi/abs/10.1080/00498250110085809.
- 994 115. Kirkwood, J. S., Maier, C. & Stevens, J. F. Simultaneous, untargeted metabolic profiling
- 995 of polar and non-polar metabolites by LC-Q-TOF mass spectrometry. *Curr. Protoc. Toxicol.*
- 996 Editor. Board Mahin Maines Ed.--Chief Al **0 4**, Unit4.39 (2013).
- 997 116. Apprill, A., McNally, S., Parsons, R. & Weber, L. Minor revision to V4 region SSU rRNA
- 998 806R gene primer greatly increases detection of SAR11 bacterioplankton. *Aquat. Microb.*
- 999 *Ecol.* **75**, 129–137 (2015).
- 1000 117. Callahan, B. J. *et al.* DADA2: High resolution sample inference from Illumina amplicon
 1001 data. *Nat. Methods* 13, 581–583 (2016).
- 1002 118. Dixon, P. VEGAN, a package of R functions for community ecology. *J. Veg. Sci.* 14,
 1003 927–930 (2003).
- 1004 119. Helwig, N. E. Robust nonparametric tests of general linear model coefficients:
- 1005 A comparison of permutation methods and test statistics. *NeuroImage* **201**, 116030 (2019).
- 1006 120. Tingley, D., Yamamoto, T., Hirose, K., Keele, L. & Imai, K. mediation: R Package for
 1007 Causal Mediation Analysis. *J. Stat. Softw.* 59, 1–38 (2014).
- 1008 121. ggplot2 citation info. <u>https://cran.r-project.org/web/packages/ggplot2/citation.html</u>.

1010

1011	Figure 1. Schematic of zebrafish husbandry and treatment events and timeline. 1) Briefly, 100 adult fish were placed in
1012	individual tanks, 2b) half of fish were subsequently exposed to antibiotics, 3b) then fish were randomly exposed to the
1013	zebrafish parasite Pseudocapillaria tomentosa. Fecal samples were collected 2a) prior to antibiotic exposure, 3a) just
1014	prior to parasite exposure, and 4) 29 days post-parasite exposure (dpe) after which fish intestinal histopathology was
1015	assessed. Samples were split and processed for untargeted fecal metabolomic analysis as well as fecal 16S rRNA
1016	DNA amplicon sequencing.
1017	
1018	Figure 2. Principal Coordinates Analysis (PCoA) ordination of Bray-Curtis dissimilarity of microbiome communities at
1019	29 days following parasite exposure. Each point represents an individual fish. The halo intensity around points
1020	represents the number of quantified parasites in the gut at dissection. Point colors represent antibiotic exposed (blue)
1021	and unexposed (red) groups. The arrow illustrates an envfit relationship for worm burden, depicting the linear direction
1022	of association between parasite burden and Bray-Curtis dissimilarity.
1023	
1024	Figure 3. (A) The abundance of N-Acyl-Ethanolamine related (NAE) compounds significantly differs between infected and uninfected
1025	fish. (B) NAE abundance inversely associates with parasite exposure for six of eight identified compounds. "*" indicates p<0.05, "**"
1026	p<0.01, and "***" p<0.001.

1028

1029

- 1030 Figure 4. Network of microbe-metabolite interactions predicted to mediate parasite worm burden. Nodes represent fecal metabolites
- 1031 and gut bacteria. Edges represent statistically significant relationships, with colors indicating the direction of correlation (blue:
- 1032 positive, red: negative).

1033

- 1034 Figure 5. (A) Scatterplot of log salicylaldehyde abundance against worm burden among fish that are 29 dpe. (B) Scatterplot of
- 1035 Pelomonas ASV 4 relative abundance against worm burden among parasite exposed fish 29dpe. (C) Linear relationship between log
- 1036 salicylaldehyde abundance and *Pelomonas* relative abundance. (D) *P. tomentosa* eggs were exposed to salicylaldehyde at a
- 1037 concentration of 2mg/L in an *in vitro* assay. The y-axis depicts the % of eggs that are unlarvated or dead. (E) *in vivo* salicylaldehyde
- 1038 exposure assay comparing the number of mature female *P. tomentosa* worms that produced eggs.
- 1039
- 1040 Supplementary Figure 1. Distribution of mature *Pseucapillaria tomentosa* worms quantified during dissection of intestinal tissue 29
- 1041 days after initial helminth egg exposure.
- 1042
- 1043 Supplementary Figure 2. The ten most important features based on the increase in node purity for regression of helminth worm
- 1044 burden measured 29dpe on microbiota relative abundances at 0dpe, just prior to parasite egg exposure.

1046 Supplementary Table 1. Coefficients table of metabolites which are linked to IHP burden (FDR<0.1) as measured 29dpe.

- 1048 Supplementary Table 2. Coefficients table of PERMANOVA results testing the relationship between NAE abundance and microbiome
- 1049 composition prior, as well as the interaction of NAE abundance and prior antibiotic exposure at 0dpe and 29dpe.







Metabolites

L-Phenylalanine	Rheinheimera asv_53
Salicylaldehyde	Retarrateghacteria Lasy 17
L-Tyrosine	Becaproceobacceria asv_17
Diphenylamine	Pelomonas asv_4
Diisononyl phthalate	Commeta Lagy 75
N-linoleoyl taurine	Geninata asv_75
N-palmitoyl taurine	Flavobacterium asv_5
4-formyl Indole	Phizobium Lasy 23
L-Methionine S-oxide	Kill20514111 43V_23
L-phenylalanyl-L-proline	Chitinophaga asv_19
Glycerophospho-N-Oleoyl Ethanolamine	Cetobacterium Lasv 2
N-oleoyl taurine	Celobacterium asv_z
Cer(d16:1/22:1)	SM1A02 asv_29
Anandamide (22:6, n-3)	Holophagae Lasy 41
Glycerophospho-N-Palmitoyl Ethanolamine	
Guanine	Mycobacterium asv_91
γ-Tocopherol	Phreatobacter asv 39
Cer(d14:1(4E)/20:0(2OH))	
Oleoyl Ethanolamide	Sphingomonas asv_108
Sphingosine	Hyphomonadaceae asv 77
C16 Sphingosine	
PE(20:5(5Z,8Z,11Z,14Z,17Z)/20:5(5Z,8Z,11Z,14Z,17Z))	Hyphomicrobium asv_61
α-Linolenoyl Ethanolamide	Hyphomicrobium asv_36
Octopine	
Linoleoyl Ethanolamide	Pseudomonas asv_3

Taxon Inversely Associated with Worm Burden Correlation Estimate 0.8 0.4 0.0 -0.4

Taxa

