### UCLA UCLA Previously Published Works

### Title

Skin-penetrating nematodes exhibit life-stage-specific interactions with host-associated and environmental bacteria

**Permalink** https://escholarship.org/uc/item/3bn4d4t7

**Journal** BMC Biology, 19(1)

**ISSN** 1478-5854

### Authors

Chavez, Ivan N Brown, Taylor M Assié, Adrien <u>et al.</u>

Publication Date 2021-12-01

DOI

10.1186/s12915-021-01153-7

Peer reviewed

### **RESEARCH ARTICLE**

### **Open Access**

# Skin-penetrating nematodes exhibit lifestage-specific interactions with hostassociated and environmental bacteria



Ivan N. Chavez<sup>1+</sup>, Taylor M. Brown<sup>1,2+</sup><sup>^</sup>, Adrien Assié<sup>3,4</sup>, Astra S. Bryant<sup>1</sup>, Buck S. Samuel<sup>3,4</sup> and Elissa A. Hallem<sup>1,2\*</sup>

### Abstract

**Background:** Skin-penetrating nematodes of the genus *Strongyloides* infect over 600 million people, posing a major global health burden. Their life cycle includes both a parasitic and free-living generation. During the parasitic generation, infective third-stage larvae (iL3s) actively engage in host seeking. During the free-living generation, the nematodes develop and reproduce on host feces. At different points during their life cycle, *Strongyloides* species encounter a wide variety of host-associated and environmental bacteria. However, the microbiome associated with *Strongyloides* species, and the behavioral and physiological interactions between *Strongyloides* species and bacteria, remain unclear.

**Results:** We first investigated the microbiome of the human parasite *Strongyloides stercoralis* using 16S-based amplicon sequencing. We found that *S. stercoralis* free-living adults have an associated microbiome consisting of specific fecal bacteria. We then investigated the behavioral responses of *S. stercoralis* and the closely related rat parasite *Strongyloides ratti* to an ecologically diverse panel of bacteria. We found that *S. stercoralis* and *S. ratti* showed similar responses to bacteria. The responses of both nematodes to bacteria varied dramatically across life stages: free-living adults were strongly attracted to most of the bacteria tested, while iL3s were attracted specifically to a narrow range of environmental bacteria. The behavioral responses to bacteria were dynamic, consisting of distinct short- and long-term behaviors. Finally, a comparison of the growth and reproduction of *S. stercoralis* free-living adults on different bacteria revealed that the bacterium *Proteus mirabilis* inhibits *S. stercoralis* egg hatching, and thereby greatly decreases parasite viability.

**Conclusions:** Skin-penetrating nematodes encounter bacteria from various ecological niches throughout their life cycle. Our results demonstrate that bacteria function as key chemosensory cues for directing parasite movement in a life-stage-specific manner. Some bacterial genera may form essential associations with the nematodes, while others are detrimental and serve as a potential source of novel nematicides.

Keywords: Strongyloides, Parasitic nematode, Chemosensation, Sensory behavior, Bacteria

<sup>1</sup>Ivan N. Chavez and Taylor M. Brown contributed equally to this work. <sup>1</sup>Department of Microbiology, Immunology, and Molecular Genetics,

<sup>2</sup>Molecular Biology Institute, University of California, Los Angeles, Los

Angeles, CA 90095, USA

Full list of author information is available at the end of the article



<sup>©</sup> The Author(s). 2021 **Open Access** This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/. The Creative Commons Public Domain Dedication waiver (http://creativecommons.org/publicdomain/zero/1.0/) applies to the data made available in this article, unless otherwise stated in a credit line to the data.

<sup>\*</sup> Correspondence: ehallem@ucla.edu

<sup>&</sup>lt;sup>^</sup>Taylor M. Brown is deceased.

University of California, Los Angeles, Los Angeles, CA 90095, USA

#### Background

Human-parasitic nematodes infect over a billion people worldwide and present a pressing issue for human health [1]. In low-resource countries, parasitic nematodes are one of the most common infectious agents of humans [2]. These parasites vary in their routes of infection; some infect by skin penetration, others by passive ingestion, and still others via intermediate hosts such as insect vectors [3]. Strongyloides is a genus of soil-dwelling, skinpenetrating gastrointestinal parasitic nematodes. This genus includes the human parasite Strongyloides stercoralis as well as the closely related rat parasite Strongyloides ratti. Current estimates put the global number of humans infected with Strongyloides at over 600 million [4]. Like many other parasitic nematodes, Strongyloides species develop through a number of free-living larval stages in the environment before becoming infective third-stage larvae (iL3s) [5]. However, Strongyloides species are unusual in that their life cycle also includes a species-specific number of free-living generations [6]. For example, S. stercoralis and S. ratti can cycle through a single free-living generation outside the host (Fig. 1) [3].

*Strongyloides* iL3s navigate their environment searching for a suitable host to infect and then penetrate host skin to establish an infection [3]. Once inside the host, the iL3s migrate through the host, ultimately ending up as parasitic adults in the small intestine [3]. All individuals of the parasitic generation are females that reproduce asexually by parthenogenesis [7]. The parasitic adults lay eggs in the intestine, and eggs or larvae exit the host in feces. On the feces, the progeny develop either directly into iL3s, or into free-living males and females that reproduce sexually. The free-living females lay eggs on the feces that develop into iL3s. The iL3s then migrate off of the feces and into the environmental soil to search for a host, thus completing the life cycle (Fig. 1) [3, 6].

*S. stercoralis* is found in warm climates throughout the world and accounts for the majority of human *Strongyloides* infections [8]. While these infections can be asymptomatic in healthy individuals, heavy infections can cause a range of symptoms that include gastrointestinal and respiratory distress [8]. *S. stercoralis* is particularly pathogenic due to its unique capacity for autoinfection, whereby the progeny of the parasitic generation develop directly into iL3s within the host [6].

Left untreated, hyperinfection can occur, which is characterized by an accelerated rate of autoinfection typically in response to a change in the immune status of the host. This can then result in disseminated strongyloidiasis, in which larvae migrate out of the small intestine. During disseminated strongyloidiasis, large numbers of



**Fig. 1** *Strongyloides* species encounter bacteria at specific points of their life cycle. The life cycles of the skin-penetrating gastrointestinal nematodes *S. stercoralis* and *S. ratti* consist of both a parasitic generation and a free-living generation. Developmentally arrested infective third-stage larvae (iL3s) search the environment for a host to infect. Once infection occurs via skin penetration, they develop into 4th stage larvae (L4s) and eventually into parasitic adults within the small intestine of the host. Parasitic adults reproduce asexually and their progeny exit the host in feces. Some of the population develops on feces through the 1st–4th larval stages (L1–L4) and then into free-living adults; the free-living adults reproduce sexually and their progeny develop into iL3s. The rest of the population develops through the 1st–2nd larval stages and then directly into iL3s. *S. stercoralis* uniquely can undergo autoinfection, whereby the progeny of the parasitic adults develop directly into iL3s within the host. Icons indicate environmental and host-associated bacterial niches the parasites encounter throughout their life cycle. The free-living generation and pre-iL3 life stages encounter fecal/gut bacteria; the iL3s encounter fecal/gut bacteria, host skin bacteria, and other environmental bacteria; and the parasitic life stages that exist inside the host may encounter host gut and fecal bacteria

autoinfective larvae invade the lungs, which contributes to the pulmonary symptoms associated with strongyloidiasis. Disseminated strongyloidiasis usually occurs in immuno-suppressed individuals, such as those taking corticosteroids [9-12], and has a mortality rate approaching 100% if left untreated [12].

*S. ratti* is a close relative of *S. stercoralis* that also infects through skin penetration. It has a similar life cycle to *S. stercoralis* [3, 6, 13], but a more widespread geographic distribution [14]. *S. ratti* is distinct from *S. stercoralis* in that it naturally parasitizes brown rats (*Rattus norvegicus*) and is unable to cause autoinfection in the host [14]. *S. ratti* is a powerful comparative model for *S. stercoralis* because the two species are closely related genetically yet have distinct host ranges and geographical distributions.

Like many parasites, *Strongyloides* species encounter bacteria throughout their life cycle. The free-living life stages primarily encounter host fecal bacteria, the iL3s encounter both host-associated and environmental bacteria, and the parasitic stages primarily encounter host gut bacteria (Fig. 1). While some parasitic nematodes are known to form close associations with bacteria that are critical for parasite infectivity [15], the interactions of *Strongyloides* and other skin-penetrating nematodes with bacteria have not been examined. Whether these parasites associate with a specific microbiome, and whether they respond behaviorally and physiologically to hostassociated and environmental bacteria, was not known.

Here, we investigated the interactions of *Strongyloides* species with bacteria. We first conducted a sequencingbased analysis of microbes associated with S. stercoralis and found that the free-living adults contained a microbiome consisting primarily of Escherichia-Shigella, Bacteroides, and Lactobacillus species, suggesting that they form specific associations with the bacteria on defecated host feces. We then asked how the free-living adults and iL3s of Strongyloides species, which engage in environmental navigation, respond to a diverse panel of host-associated and environmental bacteria. We found that S. stercoralis and S. ratti showed similar behavioral responses to the bacterial panel despite their different host ranges and geographical distributions. The responses of both species differed dramatically across life stages, with free-living adults responding broadly to most tested bacteria and iL3s responding specifically to a narrower range of environmental bacteria. Moreover, the short-term behavioral responses of S. stercoralis adults to bacteria differed from their longer-term responses, suggesting that S. stercoralis chemosensory behavior exhibits complex temporal dynamics. Finally, we found that the bacterium Proteus mirabilis reduced the reproductive success of S. stercoralis by decreasing egg hatching. Together, our results provide insight into the specific associations between *Strongyloides* species and bacteria, and identify a potential source of natural compounds that interfere with parasite development and may be useful for preventing or managing infections.

#### Results

#### S. stercoralis forms specific associations with hostassociated bacteria

The free-living nematode Caenorhabditis elegans tends to harbor specific bacteria in its gut and on its cuticle [16, 17]. However, the bacteria associated with skinpenetrating nematodes, including Strongyloides species, had not been characterized. To assess this, two independent sequencing experiments were performed where S. stercoralis free-living adults (and in one case iL3s) were isolated from fecal cultures using a Baermann apparatus and 16S amplicon sequencing was used to [18] characterize the nematode-associated microbes (Fig. 2). For these experiments, we included multiple levels of microbiome sequencing controls to facilitate robust interpretation of the results, including (i) wash buffer control 1, consisting of DNA isolated from the buffer that was used to wash the nematodes prior to nematode sample DNA extraction; (ii) wash buffer control 2, consisting of DNA isolated from the buffer supernatant after washing the nematodes; and (iii) an empty well control, consisting of an empty well that was processed along with the other samples during the amplicon sequencing workflow (Fig. 2a). Using principal coordinates analysis (PCoA), we found that the free-living adult samples clustered separately from the control samples in both independent experiments (Fig. 2b, c). Similarly, we found that the free-living adult samples had distinct microbiome profiles compared to controls (Additional files 1, 2, 3, 4 and 5: Fig. S1, S2, S3, S4 and S5). Several Amplicon Sequence Variants (ASVs) were significantly enriched in free-living adults relative to controls (Fig. 2d, e), including three individual ASVs identified in both experiments that belonged to the Escherichia-Shigella (ASV-158), Lactobacillus (ASV-868), and Solibacillus (ASV-849) genera. The most highly enriched ASV from the Escherichia-Shigella genera comprised between 30 and 60% of the nematode microbiomes between experiments (Fig. 2d, e, Additional file 1: Fig. S1). These results indicate that S. stercoralis free-living adults are associated with a robust microbiome.

For one of the experiments, we also performed a similar set of microbiome sequencing analyses on *S. stercoralis* iL3s. In contrast to the taxonomic composition of the free-living adult samples, the taxonomic composition of the iL3 samples was largely similar to that of the control samples, suggesting that iL3s may not have a distinct microbiome (Fig. 2b, Additional file 1: Fig. S1). The lack of an iL3 microbiome is consistent with the fact that the iL3 stage is non-feeding, and both the pharynx and intestine are remodeled in the iL3, a process that may involve expulsion of bacteria from the intestine [19, 20].



#### (See figure on previous page.)

**Fig. 2** *S. stercoralis* free-living adults are associated with a specific microbiome. **a** Schematic of the experimental design. Gerbils were infected with *S. stercoralis* iL3s, and infested feces were harvested from the gerbils on days 14–27 post-infection. Collected feces were made into fecal-charcoal plates and incubated at either 20 °C for 2 days to obtain *S. stercoralis* free-living adults, or 23 °C for 7 days to obtain *S. stercoralis* iL3s. Nematodes were then isolated from the fecal-charcoal plates using a Baermann apparatus and washed in buffer before DNA extraction. Sequencing samples included DNA isolated from nematodes; wash buffer control 1, consisting of the buffer used to wash the nematodes prior to DNA extraction; and wash buffer control 2, consisting of the buffer supernatant after washing the nematodes. **b–e** Results from the amplicon sequencing analysis for Experiments 1 and 2. **b**, **c** Principal coordinates analysis (PCoA) of the different sample categories from Experiments 1 (**b**) and 2 (**c**). Free-living adult samples clustered separately from the other samples, suggesting a specific microbiome associated with *S. stercoralis* free-living adults. In contrast, some of the iL3 samples in Experiment 1 clustered with more than 3 samples were calculated using the ggplot2 and ellipse packages [73]. **d**, **e** Relative abundance of ASVs that showed a significant difference across sample categories in Experiments 1 (**d**) or 2 (**e**). Box plots are standard Tukey representations. ASVs with an ANCOM W score in the top 40% of all tested features were selected as significant; individual W scores are displayed below the ASV identifiers. ASV identifiers in bold are those that showed a significant enrichment in *S. stercoralis* free-living adults vs. controls in both sequencing experiments. ASVs in the genera *Escherichia-Shigella, Lactobacillus*, and *Solibacillus* were significantly enriched in the free-living adult samples relative to the other samples

However, the same *Escherichia-Shigella* ASV that was observed in the free-living adult samples, ASV-158, was also observed in the iL3 samples, which suggests the potential for a specific association during the iL3 life stage as well. Together, our results suggest that *S. stercoralis* forms specific associations with bacteria at the free-living adult stage, some of which may extend to the iL3 stage.

# Behavioral responses of *S. stercoralis* to bacteria vary across life stages

To assess the behavioral responses of S. stercoralis to bacteria, we measured the chemotactic behavior of both the free-living adult and iL3 life stages to a diverse panel of 10 different ethologically relevant bacteria (Fig. 3a). The bacterial species selected were broadly categorized into three groups depending on their typical environment: fecal/gut, skin, or environmental/other (Fig. 3a, Additional file 6: Table S1). Strongyloides species are likely to encounter bacteria from most of these environments during the course of their life cycle (Fig. 1). For example, the free-living adults encounter fecal bacteria since they reside on host feces; while the iL3s encounter fecal, environmental, and skin bacteria as they first migrate off of host feces and into the soil to host seek, and then later penetrate through host skin (Fig. 1) [21]. The two Raoultella bacterial strains used in the environmental/other category were originally isolated from rotting fruit, the type of environment containing *C. elegans* (rotting organic matter) [17]. They were tested to evaluate the response of S. stercoralis to bacteria from environments the parasites would not typically encounter. Responses to bacteria were measured using a bacterial chemotaxis assay in which nematodes were placed in the center of a plate containing a small lawn of bacteria on one side and a control consisting of the medium used for bacterial culturing on the other side, and allowed to migrate toward or away from the bacterial lawn (Additional file 7: Fig. S6a, left). Responses were quantified by calculating a chemotaxis index according to the number of worms in each region of the plate (Additional file 7: Fig. S6a, right). As expected, no behavioral preferences were observed in a series of control experiments containing only media on both sides of the plate (Additional file 7: Fig. S6b-e).

We first tested S. stercoralis free-living male and female adults and found that they were robustly attracted to most of the bacterial species tested (Fig. 3b). This includes the fecal/gut bacteria Bacteroides thetaiotaomicron (ATCC 29148), Proteus mirabilis (ATCC 29906), Escherichia fergusonii (ATCC 35469), and Escherichia coli (HB101); the skin bacterium Staphylococcus hominis (ATCC 27844); and the environmental/other bacteria Rhizobium leguminosarum (ATCC 14479), Raoultella ornithinolytica (JUb54), and a second Raoultella species (JUb38). Only two bacterial species tested, the skin bacterium Micrococcus luteus (ATCC 4698) and the environmental/other bacterium Pseudomonas fluorescens (ATCC 13525), were not significantly attractive (Fig. 3b). Thus, S. stercoralis free-living adults are broadly attracted to bacteria, including those from habitats they are unlikely to naturally encounter, such as rotting fruit.

In nature, *Strongyloides* free-living adults are thought to remain on feces and feed on fecal bacteria [8]. Given the robust attraction of the free-living adults to all three fecal/gut bacterial species tested—*E. coli, E. fergusonii,* and *P. mirabilis*—as well as the importance of fecal bacteria for the survival of the free-living generation (Fig. 1), we next asked if *S. stercoralis* adults prefer some fecal bacteria over others. We performed competition chemotaxis assays in which nematodes were allowed to choose between one of two fecal/gut bacterial species (Additional file 8: Fig. S7a). We found that *S. stercoralis* adults did not show a preference for *P. mirabilis* relative to *E. coli* or *E. fergusonii* (Additional file 8: Fig. S7b). However, they showed a slight preference for *E. coli* relative to *E. fergusonii* (Additional file 8: Fig. S7c). These



#### (See figure on previous page.)

**Fig. 3** *Strongyloides* species display life-stage-specific bacterial preferences. **a** The bacterial panel used to examine the interactions of *Strongyloides* iL3s and free-living adults with bacteria. The bacteria are categorized according to the major environmental niches where they are likely to interact with *Strongyloides* species (Additional file 6: Table S1), although we note that some of the bacteria are also found more broadly in the environment. Categories (left to right): skin, fecal/gut, environmental/other. **b** *S. stercoralis* free-living adults were robustly attracted to most bacteria tested in a bacterial chemotaxis assay. n = 20-40 trials for each condition, with 75–150 worms per trial. \*p < 0.05, \*\*\*\*p < 0.0001, ns = not significant, Kruskal-Wallis test with Dunn's post-test. **c** *S. stercoralis* iL3s did not respond to most bacteria but were attracted to one of the environmental/other bacterial species tested. n = 20-30 trials for each condition, with 300-400 worms per trial. \*\*\*p < 0.0001, Kruskal-Wallis test with Dunn's post-test. **c** *S. stercoralis* iL3s did not respond to most bacterial phenotaxis assay. n = 20-34 trials for each condition, with 300-400 worms per trial. \*\*\*p < 0.0001, Kruskal-Wallis test with Dunn's post-test. **d** *S. ratti* free-living adults were robustly attracted to two environmental/other bacterial species tested. n = 20-26 trials for each condition, with 300-400 worms per trial. \*\*p < 0.05, \*\*\*\*p < 0.001, Kruskal-Wallis test with Dunn's post-test. **c** *S. ratti* iL3s did not respond to most bacteria but were attracted to two environmental/other bacterial species tested. n = 20-26 trials for each condition, with 300-400 worms per trial. \*p < 0.05, \*\*\*\*p < 0.001, Kruskal-Wallis test with Dunn's post-test. **e** *S. ratti* iL3s did not respond to most bacteria but were attracted to two environmental/other bacterial species was compared to the LB control; only significant diff

results suggest that *S. stercoralis* free-living adults are capable of distinguishing among fecal/gut bacteria to some extent, but are generally strongly attracted to these bacteria.

Previous studies using individual odorants have shown that olfactory preferences in *Strongyloides* species can vary across life stages [22, 23]. To test whether bacterial preferences also vary across life stages, we next examined the responses of *S. stercoralis* iL3s, which are nonfeeding and developmentally arrested [21], to the same bacterial panel. We found that in contrast to the freeliving adults, the iL3s were neutral to most of the bacteria tested (Fig. 3c). The iL3s displayed significant attraction to only one bacterium tested, the environmental bacterium *P. fluorescens* (Fig. 3c). These data suggest that *S. stercoralis* shows life-stage-specific responses to bacteria. Free-living adults are robustly attracted to a broad range of bacteria, while iL3s are narrowly tuned to specific bacteria.

#### S. ratti and S. stercoralis respond similarly to bacteria

Although S. stercoralis and S. ratti are closely related genetically and share similar life cycles, they infect distinct host species. Moreover, the bacterial composition of their hosts' feces differs substantially; many of the core-OTUs found in human feces are absent or found at low abundance in rat feces [24, 25]. Thus, S. stercoralis and S. ratti are exposed to very different bacteria in their natural environments. In addition, the two species have different geographical ranges: S. stercoralis is found in warm regions throughout the world, while S. ratti is broadly distributed worldwide [14, 26]. This raises the question of whether S. stercoralis and S. ratti respond similarly to bacteria, or whether they exhibit speciesspecific responses to bacteria that reflect their unique environmental niches. To address this question, we first examined the chemotactic responses of S. ratti freeliving adults to the bacterial panel (Fig. 3d). We found that S. ratti free-living adults were robustly attracted to most of the bacteria tested (Fig. 3d). P. fluorescens was the only bacterium that was not significantly attractive to *S. ratti* free-living adults (Fig. 3d). We then examined the behavioral responses of *S. ratti* iL3s to the bacterial panel and found that the iL3s were neutral in response to most bacteria tested (Fig. 3e). The only significantly attractive bacteria in the panel were the two environmental/other bacteria, *P. fluorescens* and *R. leguminosarum* (Fig. 3e).

A comparison of S. ratti and S. stercoralis free-living adults revealed no significant differences in behavioral responses to the bacteria (Additional file 9: Fig. S8a), and a comparison of S. ratti and S. stercoralis iL3s revealed only a minor difference in the response to P. mirabilis (Additional file 9: Fig. S8b). Thus, the life-stagedependent bacterial preferences of S. ratti closely match those of S. stercoralis. Interestingly, the environmental/ other bacterium P. fluorescens was not significantly attractive to adults of either nematode species, yet it was the only bacterium significantly attractive to iL3s of both species (Fig. 3b-e). This bacterium is commonly found in association with soil, plants, and water [27, 28]. The overall similarity in the bacterial preferences of S. ratti and S. stercoralis suggests that these species do not show highly specialized behavioral responses to bacteria that reflect their species-specific fecal niches. Instead, the two species show very similar behavioral responses that may reflect their similar life cycles and/or genetic relatedness.

### *S. stercoralis* free-living adults display dynamic responses to bacteria

Population chemotaxis assays are strong indicators of overall chemosensory preferences, but do not provide insight into either the immediate responses of the nematodes to the chemosensory cues or the navigational strategies employed during chemotaxis. To address these points, we used single-worm tracking assays in which a single *S. stercoralis* free-living adult was placed in the center of a plate containing a small circle of bacteria on one side of the plate (the "experimental region") and a

small circle of an LB media control on the opposite side (the "control region") (Additional file 10: Fig. S9). An older, gravid female was assayed to control for any mate-seeking effects. The worm was then tracked with video recording over a maximum of 20 min (Additional file 10: Fig. S9). We tracked *S. stercoralis* adults as they navigated across plates containing either *E. coli*, *P. mirabilis*, or *P. fluorescens* (Fig. 4a). We compared responses to these bacteria to responses to control plates containing LB media on both sides of the plate. As expected, the trajectories of worms on the LB control plates appeared to be relatively evenly distributed across the plate (Fig. 4a).

A comparison of responses to *E. coli*, *P. mirabilis*, *P. fluorescens*, and the LB control revealed that *S. stercoralis* adults were more strongly attracted to *E. coli* than *P. mirabilis* in the short-term tracking assay (Fig. 4a). Adults spent significantly more time in the experimental region on plates containing *E. coli* than plates containing only the LB control (Fig. 4b). In contrast, the time spent in the experimental region on plates containing the other bacteria did not differ significantly from the time



**Fig. 4** *S. stercoralis* free-living adults show distinct short-term behavioral responses to bacteria. **a** Overlaid tracks of individual *S. stercoralis* free-living adults in a single-worm bacterial chemotaxis assay. Worms were tracked for 20 min or until they left the assay arena. Black crosses represent starting points. For each assay arena, the red circle (left) depicts the experimental zone containing bacteria and the black circle (right) depicts the control zone containing the media control. In the case of the LB control assay, both the experimental zone and the control zone contained LB media. **b** Worms spent more time in the experimental zone when the experimental zone contained *E. coli.* \*\**p*< 0.01, Kruskal-Wallis test with Dunn's post-test. The only significant difference is noted. **c** Worms spent more time in the control zone when the experimental zone contained *P. fluorescens* lawn. Only animals that reached a bacterial lawn were included in this analysis. **d** Worms spent more time in the control zone when the experimental zone contained *P. fluorescens*. \**p*< 0.05, Kruskal-Wallis test with Dunn's post-test. The only significant difference is noted. **c** Worms spent more time in the control zone when the experimental zone contained *P. fluorescens*. \**p*< 0.05, Kruskal-Wallis test with Dunn's post-test. The only significant difference is noted. **e** Worms displayed similar navigational patterns regardless of the bacteria present, as quantified by the distance ratio (total pathlength ÷ linear displacement from the initial point to the final point). No significant differences were detected (Kruskal-Wallis test). *n* = 24–30 worms for each condition. Graphs show medians (solid lines) and interquartile ranges (dashed lines). All statistical comparisons are relative to the LB control assay

spent in the experimental region on plates containing only the LB control (Fig. 4b). To assess how long the bacteria retained the adults after they reached it, we compared the dwell time in the bacterial lawns across conditions. Adults spent significantly more time in the E. coli lawn relative to the P. fluorescens lawn (Fig. 4c). To control for the possibility that the bacterial lawns differentially impeded worm speed, the median crawling speeds in the bacterial lawns were quantified. There were no significant differences in nematode crawling speeds on the different bacterial lawns (Additional file 11: Fig. S10). Together, these results suggest that E. coli is more attractive initially than *P. mirabilis*, even though in the longer-term population chemotaxis assays, worms eventually accumulate in both bacterial lawns in similar numbers. Additionally, our data suggest that E. coli retains the adults longer than P. fluorescens (Fig. 4c). Single-worm tracking analysis also revealed that worms on plates containing P. fluorescens spent more time in the control region than worms on plates containing only the LB control (Fig. 4d). Thus, S. stercoralis adults show an initial repulsion from P. fluorescens, even though P. fluorescens appears to be neutral in the longer-term population assay (Fig. 3b).

We then investigated the navigational strategies used during bacterial chemotaxis. We calculated the distance ratio (total path length  $\div$  displacement) to quantify the nonlinearity of the tracks, and found no significant differences in distance ratio across conditions (Fig. 4e). Together, these results suggest that *S. stercoralis* free-living adults are capable of distinguishing among different bacterial species and display distinct short-term bacterial preferences that may differ from their long-term preferences. However, similar navigational strategies appear to be employed regardless of whether the bacteria are attractive or repulsive.

# Growth on *P. mirabilis* decreases egg hatching in *S. stercoralis*

Although the free-living life stages of *S. stercoralis* can be maintained on *E. coli* in a laboratory setting, their natural habitat is host feces. This raises the question of how their lifespan and physiology is influenced by other fecal bacteria. To begin to address this question, *S. stercoralis* free-living young adult females were isolated from feces and cultured on plates containing a lawn of either *E. coli, E. fergusonii*, or *P. mirabilis* for the extent of their lifespan. The nematodes were passaged daily to fresh bacterial plates, and their progeny were counted daily (Additional file 12: Fig. S11a). We found only minor differences in the lifespans of worms cultured on the different bacterial plates, with worms cultured on *E. fergusonii* showing slightly longer lifespans than worms cultured on *P. mirabilis* (Fig. 5a). We did not find any significant differences in the number of eggs laid on the different bacteria (Fig. 5b). However, when we examined the viability of the eggs laid on the different bacteria, we found that significantly fewer eggs hatched after 24 h on *P. mirabilis* than on the other bacteria (Fig. 5c). These results suggest that *P. mirabilis* is detrimental to the reproduction of *S. stercoralis* free-living adults.

The reduced hatching of *S. stercoralis* eggs after 24 h when raised in *P. mirabilis* could reflect either reduced egg viability or delayed egg hatching, such that the eggs take longer than 24 h to hatch. To distinguish between these possibilities, we examined egg hatching after 48 h instead of 24 h to give the eggs additional time to hatch (Additional file 12: Fig. S11b). Similar to the results with the 24 h assay, we found that *P. mirabilis* significantly reduced the percentage of hatched eggs after 48 h relative to *E. coli* and *E. fergusonii* (Fig. 5d). No significant difference in egg hatching between worms cultured on *E. coli* versus *E. fergusonii* was observed (Fig. 5d). These results suggest that *P. mirabilis* primarily reduces egg viability.

The reduced egg viability of *S. stercoralis* females grown on *P. mirabilis* could be due to an effect of *P. mirabilis* on either the young adult female or the laid egg. To distinguish between these possibilities, we examined egg hatching after 48 h using older, gravid adult females instead of young adult females (Additional file 12: Fig. S11c). The older females had already mated and developed eggs in the absence of *P. mirabilis*, and thus any effect of *P. mirabilis* on *S. stercoralis* would be primarily restricted to egg laying or to the development of the eggs once laid. In this assay, no significant difference in egg hatching was observed for worms on *P. mirabilis* versus *E. coli* (Fig. 5e). Thus, *P. mirabilis* appears to inhibit egg hatching by affecting the young free-living adult female directly.

To investigate how P. mirabilis inhibits egg hatching, we asked if soluble or volatile factors produced by P. mirabilis were sufficient to inhibit S. stercoralis egg hatching. To test whether soluble factors produced by P. mirabilis can inhibit egg hatching, young adults were plated on a lawn of E. coli to which filtered bacterial supernatant from either E. coli or P. mirabilis was added. Egg hatching was then assessed over 48 h. There was no significant difference in egg hatching on plates containing E. coli vs. P. mirabilis supernatant (Additional file 13: Fig. S12a). To test whether volatile factors produced by P. mirabilis can inhibit egg hatching, young adults were plated on a lawn of E. coli, and a second plate containing a lawn of either E. coli or P. mirabilis was then affixed over the plate containing the worms. With this setup, worms were exposed to volatiles from either E. coli or P. mirabilis but encountered only E. coli as a nutrient source. We found that there was no significant



**Fig. 5** Fecal/gut bacteria influence *S. stercoralis* physiology. **a** Survival of *S. stercoralis* free-living adult females cultured on either *E. coli, E. fergusonii, or P. mirabilis*. Worms were placed on plates containing the indicated bacteria as young adults, and percent survival was monitored daily. n = 19 worms for each condition. \*\*p < 0.01, log-rank test with Bonferroni post-test comparing each condition to every other condition. The only significant difference is noted. Error bars show standard error. **b** Culturing *S. stercoralis* free-living adults on different fecal bacteria did not affect the number of eggs laid per day. No significant effect of bacteria was detected (two-way repeated measures ANOVA). n = 13-17 worms for each condition. Medians and interquartile ranges are shown. **c** Culturing *S. stercoralis* free-living adults on *P. mirabilis* resulted in fewer hatched eggs per day. Graph shows the percentage of eggs that hatched every 24 h after free-living young adult females were allowed to mate on the indicated bacteria. \*p < 0.05, \*\*p < 0.01, \*\*\*\*p < 0.0001, ns = not significant, two-way repeated measures ANOVA with Tukey's post-test. Statistical significance for each comparison is noted above the graph. n = 12-16 worms for each condition. Medians and interquartile ranges are shown. **d** *P. mirabilis* decreased egg hatching. Graph shows the percentage of hatched eggs 48 h after free-living young adult females were allowed to mate on the bacteria. \*\*\*p < 0.0001, ns = not significant, Brown-Forsythe and Welch ANOVA with Dunnett's T3 post-test comparing each condition. n = 13-14 worms for each condition. Medians (solid lines) and interquartile ranges (dashed lines) are shown. **e** There was no significant difference in the percentage of hatched eggs after 48 h when older, gravid free-living adult females were placed on *P. mirabilis* (unpaired, two-tailed Welch's *t* test). n = 12 worms for both conditions. Medians (solid lines) and interquartile ranges (dashed lines) ar

difference in egg hatching in the presence of *E. coli* vs. *P. mirabilis* volatiles (Additional file 13: Fig. S12b). These results suggest that intact bacterial cells of *P. mirabilis* are likely necessary to inhibit egg hatching.

# *P. mirabilis* interferes with *S. stercoralis* early egg development

To further characterize the deleterious effects of *P. mir-abilis* on *S. stercoralis* embryonic development, we examined the developmental stages of eggs laid on lawns of *P. mirabilis*. For this experiment, young adult males and females were placed on lawns of *P. mirabilis* for up to 48 h, and eggs and young larvae were morphologically

categorized after 24 h and 48 h (Fig. 6a) [29]. Of the unhatched eggs at the 24 h timepoint, we found a higher proportion of eggs to be undeveloped on *P. mirabilis* plates relative to *E. coli* plates (Fig. 6b). Subcategorizing the developing eggs revealed that most of the developing eggs were at the final pretzel stage of development by 24 h (Fig. 6b, left). A similar categorical distribution of developing eggs was observed on *E. coli* vs. *P. mirabilis* plates after 24 h. By 48 h, virtually all eggs left unhatched were either undeveloped or in the final pretzel stage (Fig. 6b, right). At 48 h on *E. coli* plates, the majority of the few remaining unhatched eggs were undeveloped and very few were in the pretzel stage. In contrast,



nealtry pre-infective larva, and an unhealtry pre-infective larva. Egg development was classified into the categories indicated based on the classified into the categories indicated based on the classified into such that the precentage of unhatched eggs that fell into each category of embryonic development for worms cultured on either *P. mirabilis* or *E. coli*. For each experiment, 1 female and 3 males were cultured on the bacterial lawn for 24 h, after which the worms were removed from the plate and the percentage of eggs in each category was scored. The percentage of eggs in each category was then scored again after 48 h. After 24 h, more undeveloped eggs were observed on *P. mirabilis* relative to *E. coli*, suggesting that *P. mirabilis* interferes with the earliest stages of egg development (left). \*\*p<0.01, ns = not significant, two-way ANOVA with Sidak's multiple comparisons post-test. n = 9-10 trials for each condition. After 48 h, nearly all of the eggs on the *E. coli* plates had hatched; the remaining eggs were almost all undeveloped. In contrast, approximately half of the eggs on *P. mirabilis* were at the pretzel stage of development while the other half were undeveloped, indicating that culturing on *P. mirabilis* delays or prevents egg hatching in some eggs that have initiated embryonic development (right). \*\*\*p<0.001, ns = not significant, two-way ANOVA with Sidak's multiple comparisons post-test. n = 6-10 trials for each condition. **c.** The percentage of the total progeny consisting of undeveloped eggs, developing eggs, healthy larvae, or unhealthy larvae from the experiment described in (**b**) after 24 h (left) or 48 h (right). Culturing on *P. mirabilis* resulted in an increased proportion of eggs that failed to develop and of the worms that hatched, an increased number of unhealthy larvae. Larvae that were classified as unhealthy appeared non-motile and generally remained in a curled position. \*p<0.05, \*\*\*\*p<0.0001, two-way ANOVA with Tukey's multiple comparisons sets. Comparison

of the unhatched eggs on *P. mirabilis* plates at the same timepoint, approximately half were in the undeveloped stage and half were in the pretzel stage. These results further suggest that *P. mirabilis* may prevent or delay egg hatching in a subset of eggs that initiate embryonic development. Of the larvae that did hatch on *P. mirabilis* plates by 48 h, a majority were malformed and morphologically distinct from healthy larvae; these larvae were unmoving and often appeared tightly curled in on themselves (Fig. 6a, c). These results suggest that in the presence of *P. mirabilis*, fewer *S. stercoralis* eggs initiate embryogenesis.

*P. mirabilis* could reduce the number of eggs that undergo embryogenesis either directly by interfering with egg development, or indirectly by interfering with *S. stercoralis* mating behavior, which in turn could result in the females laying more unfertilized eggs. To distinguish between these possibilities, we plated lone young adult females on P. mirabilis plates for 24 h and then determined the percentage of eggs that had hatched at 24 and 48 h. We found that hatching was decreased on P. mirabilis at both 24 h and 48 h despite the absence of males (Additional file 14: Fig. S13a). Moreover, a population of persisting developing eggs and malformed larvae on P. mirabilis plates was also seen in these conditions at 48 h (Additional file 14: Fig. S13b). These results suggest that the presence of males is not necessary to recapitulate the impaired hatching phenotype, and therefore that P. mirabilis does not exert its effect on egg viability by interfering with the mating process. Finally, we assessed egg hatching at 24 h after a shorter egg-laying period of 12 h, and found that egg hatching was similar on E. coli vs. P. mirabilis plates under these conditions (Additional file 14: Fig. S13c). Thus, the detrimental effects of P. mirabilis are specific to the later-laid eggs.

Taken together, our results suggest that *P. mirabilis* causes reduced egg viability through a detrimental effect on the process of early egg development inside the young adult female. The finding that *P. mirabilis* is detrimental for the viability of the human parasite *S. stercoralis* raises the possibility that *P. mirabilis* could be useful in the development of new compounds for nematode control.

#### Discussion

We have found that S. stercoralis free-living adults are associated with a specific microbiome (Fig. 2). The S. stercoralis microbiome appears to be relatively simple in composition: it is dominated by a single bacterium in the Escherichia-Shigella genus, but also includes at least two other bacteria in lower abundance, one in the genus Lactobacillus and the other in the genus Solibacillus (Fig. 2, Additional files 1, 2, 3, 4 and 5: Fig. S1, S2, S3, S4 and S5). In contrast, the C. elegans microbiome is enriched in specific genera such as Pseudomonas, Stenotrophomonas, Ochrobactrum, Sphingomonas, and those of the Enterobacteriaceae family [30], consistent with its different ecological niche. The bacteria we identified from S. stercoralis are likely to colonize the nematode gut given the consistency of their association in samples, but it is possible that they may adhere to the nematode cuticle; further studies will be necessary to distinguish between these possibilities.

Previous studies have identified Lactobacillus in the feces of Mongolian gerbils [31], indicating that the rodent is naturally associated with this genus. Although Lactobacillus bacteria are traditionally classified as oxygen-tolerant anaerobes, many species can grow under aerobic conditions [32-34]. Thus, it is unlikely that our experimental settings selected for Lactobacillus due to differences in oxygen concentration between the nematode and the environment. Interestingly, Solibacillus bacteria form spores, a dormant life stage that enables bacterial survival under unfavorable conditions [35-38]. Spore formation has been implicated in host-to-host transmission, since the inability of hosts to digest spores can lead to enhanced intestinal colonization [35, 39]. Thus, spore formation may be important for the ability of Solibacillus to colonize S. stercoralis. However, additional work will be needed to better understand the mechanisms that promote the association of Lactobacillus and Solibacillus with S. stercoralis.

Other intestinal parasites such as the murine whipworm *Trichuris muris* have been shown to harbor a gut microbiome that includes related *Enterobacteriaceae* and *Bacteroides* species [40]. *Lactobacillus* species in the host duodenum are also positively correlated with susceptibility to infection with some gastrointestinal nematodes, such as the passively ingested murine parasite *Heligmosomoides polygyrus* [41] and *T. muris* [42]. In addition, some *Lactobacillus* species induce hatching of *T. muris* eggs [43]. Thus, our results raise the possibility of a broader association between some microbial taxa and mammalian-parasitic nematodes.

The role of the S. stercoralis microbiome in shaping the interactions of S. stercoralis with its human hosts remains unclear. A number of gastrointestinal nematodes, including S. stercoralis, alter the bacterial composition of their host's microbiome [44-49]. This effect is generally thought to result from the immune response to the parasitic infection rather than from bacteria transported into the host from the parasite [44, 45, 48]. In the case of T. muris, which infects when its eggs are ingested, the eggs are sterile and the microbiome associated with subsequent life stages of T. muris is acquired from the host intestine [15, 40]. In contrast, the ruminant parasite H. contortus, which infects when third-stage larvae are ingested, is associated with bacterial endosymbionts that are not found in the host abomasum or feces [50]. These endosymbionts are associated with H. contortus across life stages and vertically transmitted [50]. Thus, at least some parasitic nematodes are capable of transporting bacteria into their hosts during infection. Our results suggest that S. stercoralis iL3s may be associated with a bacterium in the genus Escherichia-Shigella (Fig. 2, Additional files 1, 2 and 3: Fig. S1, S2 and S3), raising the possibility that some iL3s transport bacteria into the host. However, it is also possible that the host microbiome changes associated with S. stercoralis infection result from the immune response to infection rather than from colonization with bacteria introduced by the iL3s.

At the behavioral level, both S. stercoralis and S. ratti showed life-stage-specific responses to bacteria: the freeliving adults were robustly attracted to most bacteria tested, whereas iL3s were only attracted to specific bacteria commonly found in extra-host environments (Fig. 3). The robust attraction displayed by the free-living adults likely represents a drive toward nutrients, since the adults feed on host fecal bacteria [8]. Interestingly, we found that the free-living adults were attracted not only to fecal/gut bacteria, but also to those in the skin and environmental/other categories (Fig. 3, Additional file 6: Table S1). Thus, the free-living adults are broadly attracted to many bacteria, including bacteria they would not normally encounter in nature. Attraction to bacteria may be a relatively non-specific response employed by adults that serves to retain them on feces, which is a bacteria-rich food source. Notably, free-living adults were not robustly attracted to P. fluorescens and R. leguminosarum, which are commonly found in soil environments. S. stercoralis free-living adults were not attracted to *P. fluorescens* and were only moderately attracted to R. leguminosarum (Fig. 3b), while S. ratti free-living

adults were not attracted to *P. fluorescens* but were attracted to *R. leguminosarum* (Fig. 3d). The reduced attraction to these bacteria exhibited by both species may be another mechanism that contributes to the tendency of adults to remain on feces rather than migrate into the surrounding soil environment.

In contrast to the free-living adults, the developmentally arrested iL3s migrate off feces and into the soil to search for hosts to infect. This change in behavior is reflected in a corresponding change in bacterial preferences. The iL3s of both species are neutral in response to most bacteria but are specifically attracted to either one (in the case of S. stercoralis) or two (in the case of S. ratti) of the tested bacteria that may be found in the surrounding soil environment (Fig. 3c, e). Thus, the behavioral responses of Strongyloides species to bacteria differ dramatically across life stages. Our results are consistent with previous studies showing that S. stercoralis and S. ratti adults are attracted to host fecal odor, while iL3s are neutral [22, 23]. The lack of attraction of iL3s to fecal/gut bacteria, combined with their attraction to environmental bacteria, may facilitate the movement of iL3s off of host feces and into the surrounding soil, where they then engage in host seeking.

Overall, S. stercoralis and S. ratti showed similar responses to bacteria at both the free-living adult and iL3 life stages (Additional file 9: Fig. S8) despite their differences in host range. These results suggest that the responses to the bacteria tested are not likely to be important drivers of species-specific parasite-host interactions. However, we note that the S. stercoralis freeliving adults and iL3s tested here were cultured in the lab on gerbil feces rather than human feces; future studies will be necessary to examine the bacterial preferences of wild isolates of S. stercoralis cultured on human feces. While S. stercoralis and S. ratti appear to respond similarly to bacteria, they respond very differently to a diverse array of host-emitted odorants [22, 23]. Moreover, a comparison of iL3 olfactory preferences across species revealed that the olfactory responses of iL3s were more similar for nematode species that infect the same host species [22, 23]. These results suggest that olfaction contributes to the ability of different iL3s to target distinct host species. It is possible that the similar responses of S. stercoralis and S. ratti to the tested bacteria serve the more general role of maintaining the free-living life stages on bacterial food sources and promoting migration into the soil at the iL3 stage. However, S. stercoralis and S. ratti may respond in a species-specific manner to host-specific bacteria that have not been tested.

*S. stercoralis* iL3s are attracted to human sweat and serum, while *S. ratti* iL3s are attracted to mammalian serum [51, 52]. Moreover, *S. stercoralis* iL3s are attracted to skin-enriched odorants [22, 23]. Despite this, we

observed no attraction to the human skin bacteria tested (Fig. 3c, e). It is possible that other as-yet-untested microbes found on mammalian skin are attractive to iL3s. However, it is also possible that a complex host skin microbiome consisting of multiple bacterial species is necessary to attract iL3s to host skin. Future studies examining the responses to a larger panel of skin bacteria or co-cultures of bacteria would shed light on this question.

The results of the single-worm tracking assays suggest that behavioral responses to bacteria can be temporally dynamic. While P. fluorescens was neutral for S. stercoralis free-living adults in the long-term assay, short-term tracking revealed it to be initially repulsive (Fig. 4a, d). It is possible that adults initially sense P. fluorescens as noxious or unfavorable, but over time, they acclimate to it if it is the only potential food source available. Moreover, P. mirabilis was not as strongly attractive in the short-term tracking assay as it was in the long-term population assay (Figs. 3b and 4a, b), highlighting the importance of exposure time and nutrient availability in driving these responses. Thus, while S. stercoralis freeliving adults show broad, relatively non-specific attraction to bacteria (Fig. 3b), our results from short-term tracking assays (Fig. 4) and bacterial competition assays (Additional file 8: Fig. S7) suggest that they are able to discriminate between different bacterial species and respond in slightly different ways. The distance ratio did not differ significantly regardless of the bacterial species (Fig. 4e), suggesting that generally similar navigational strategies may be employed in both attractive and repulsive behavioral responses to bacteria.

Given the bacteria-rich environments of the human gut and feces, where S. stercoralis reproduces, humanassociated bacteria are likely to play an important role in regulating parasite propagation. In the case of the mouse parasite Strongyloides venezuelensis, administration of the probiotic Bifidobacterium animalis to infected mice significantly reduces egg output [53]. Similarly, altering the bacterial culture conditions of S. ratti results in changes in egg laying and hatching [54]. Our results demonstrate that culturing S. stercoralis free-living young adults on P. mirabilis results in a dramatically reduced rate of egg hatching (Fig. 5c, d). The bacterium exerts its effect on the nematodes by interfering with early egg development, since eggs from older, gravid females are unaffected by the bacterium (Fig. 5e). Moreover, young adult females exposed to the bacterium lay eggs that are less likely to initiate embryogenesis (Fig. 6). P. mirabilis also reduces the brood size of C. elegans [55], but whether the mechanisms underlying these effects in S. stercoralis and C. elegans are similar remains unclear. In future studies, it will be interesting to extend these studies to S. stercoralis parasitic adults, since the

free-living versus parasitic life stages of *S. stercoralis* may interact differently with host-associated bacteria.

Interestingly, *S. stercoralis* adults are robustly attracted to *P. mirabilis* despite its negative effect on reproduction (Fig. 3b). In the case of *C. elegans*, some pathogenic bacteria that reduce egg hatching also act as repellents [56, 57]. However, *C. elegans* also displays naïve attraction followed by learned avoidance to some pathogenic bacteria, illustrating that pathogenic bacteria do not always elicit a chemorepulsive response [58]. The *S. stercoralis* adults we tested were likely to have previously encountered *P. mirabilis* in host feces and yet were still attracted to it. Thus, whether *S. stercoralis* exhibits learned avoidance to pathogenic bacteria remains unclear.

Our results demonstrate an important role for hostassociated and environmental bacteria in the *Strongyloides* life cycle. The robust effects of bacteria on *S. stercoralis* behavior and physiology raise the possibility that bacteria may be an important source of novel nematicidal compounds. In particular, future studies investigating metabolites and other compounds produced by *P. mirabilis* could lead to the identification of natural products with potent nematicidal activity. In addition, understanding the neural and molecular mechanisms that mediate the interactions of parasitic nematodes with bacteria may identify potential targets for disruption and facilitate the development of new strategies for nematode control.

#### Conclusions

Our results reveal how Strongyloides parasitic nematodes navigate and interact with their microbial environment. We show that the human parasite Strongyloides stercoralis is associated with a specific microbiome during its free-living adult life stage. We also show that Strongyloides species show dynamic, life-stage-specific behavioral responses to bacteria, suggesting that bacteria represent important chemosensory cues for these parasites. They display robust attraction to many bacteria during their free-living life stage but more specific attraction to certain environmental bacteria during their infective larval stage. Finally, we show that the bacterium *Proteus mirabilis* reduces the parasite's reproductive capacity, implicating P. mirabilis as a possible source of nematicides. Elucidating these microbial interactions informs the development of effective treatment strategies.

#### Methods

#### Strongyloides culture and collection

All protocols and procedures involving vertebrate animals were approved by the UCLA Office of Animal Research Oversight (Protocol 2011-060-31), which adheres to the standards of the AAALAC and the Guide for the Care and Use of Laboratory Animals. S. stercoralis strain UPD (originally provided by Dr. James Lok, University of Pennsylvania) was maintained by serial passage in male and female Mongolian gerbils (Charles River Laboratories) as previously described [22, 59]. Briefly, gerbils were anesthetized with isoflurane and inoculated with ~ 2000–2250 iL3s in 200  $\mu$ L sterile 1x PBS by subcutaneous infection. Between days 14 and 45 postinfection, feces were collected by placing the infected gerbils overnight on wire cage bottoms with wet cardboard underneath. Fecal pellets were mixed with autoclaved charcoal granules (bone char from Ebonex Corp., Cat # EBO.58 BC.04), and stored in Petri dishes lined with dH<sub>2</sub>O-moistened filter paper. S. ratti strain ED321 (originally provided by Dr. James Lok, University of Pennsylvania) was maintained by serial passage in female Sprague Dawley rats (Envigo) as previously described [22, 59]. Briefly, rats were inoculated with  $\sim 800$  iL3s in 300 µL sterile 1x PBS by subcutaneous injection. Between days 7 and 23 post-infection, feces were collected as described above. Fecal-charcoal cultures were maintained at 25 °C for 1 day to obtain adults, or at 20 °C for 2 days and then at 23 °C for 6-9 days to obtain iL3s. Worms were then isolated using a Baermann apparatus [18]. For all assays, worms were obtained from at least two sets of host animals and tested across multiple days to account for any day-to-day and batch-to-batch variability.

S. stercoralis DNA extraction for 16S amplicon sequencing Isolated worms and wash buffer controls were all processed similarly for DNA extraction. S. stercoralis young adults or iL3s were isolated from fecal-charcoal plates. For each independent infection experiment (Experiments 1 and 2), gerbil feces were collected close to the peak of infection (days 14-27). In Experiment 1, freeliving adults and iL3s were collected from the pooled feces of three different sets of gerbils; worms were collected from the feces of each set of gerbils only once. In Experiment 2, free-living adults were collected from the pooled feces of four different sets of gerbils; worms were collected from the feces of each set of gerbils twice, on two different days. To obtain free-living adults, fecalcharcoal plates were incubated at 20 °C for 2 days; to obtain iL3s, fecal-charcoal plates were incubated at 23 °C for 7 days. Worms were isolated using a Baermann apparatus [18], and then collected from the Baermann funnel in 45 mL of water.

To isolate worms for DNA extraction, 4.5 mL of 100 mM levamisole was added to the 45 mL worm suspension to paralyze the worms. An aliquot containing > 200 worms (Experiment 1) or ~ 25-50 worms (Experiment 2) was removed and centrifuged at 1931 rpm for 2 min to pellet the worms, and all but 100  $\mu$ L of supernatant was

discarded. The worms were then washed 3x in wash buffer consisting of 4 mL of 100 mM levamisole, 4 µL of Triton X-100, and 35.9 mL BU saline [60]. A separate 50 µL aliquot of wash buffer was set aside as a sequencing control ("wash buffer control 1"). After the wash steps, a 50 µL aliquot of supernatant was also set aside as a sequencing control ("wash buffer control 2"). Fifty microliters of worm pellet was transferred to a new tube ("nematode sample"). Two hundred microliters of wash buffer was then added to all samples. Samples were incubated at room temperature for 10 min, and then washed again 3x in wash buffer. After the third wash, samples were spun down and all but 100 µL of sample was discarded. Samples were subjected to bead-beating by vortexing for 5 min with 10-15 sterile garnet particles. The particles were then removed, and DNA was extracted using either the QIAamp DNA Stool Kit (Qiagen; Experiment 1) or a DNA extraction protocol developed for C. elegans (Experiment 2) [61].

# Amplicon library construction, sequencing, and data analysis

Barcoded amplicon preparation and sequencing was then performed as previously described [62, 63]. Briefly, supernatants from lysates were transferred to a clean 96well PCR plate and used as DNA templates. We amplified the V4 region of the 16S rRNA gene using the 515f (GTGYCAGCMGCCGCGGTAA) and 806r (GGACTA CNVGGGTWTCTAAT) PCR primers with barcodes added to the 806r primer. Amplicons for each library were normalized based on the PCR product quantified by the image processing package in Fiji [64, 65], then pooled into a single tube. Amplicon products were quantified (Qubit) and then sequenced by the Center for Metagenomics and Microbiome Research, Houston, TX, USA, on an Illumina MiSeq System.

Sequencing datasets were prepared for subsequent statistical analysis using the QIIME2 platform [66]. Samples with fewer than 500 reads were discarded from the analysis. The data was processed with the QIIME2 workflow using the build-in demultiplexing algorithm and Deblur to identify the different Amplicon Sequence Variants (ASVs) present in the datasets. Further statistical analysis was then performed in R using the tidyverse [67], vegan [68], and ANCOM [69] packages. ASVs with a W score in the top 40% of all tested features were selected as significant. The detailed scripts are available at https://bitbucket.org/the-samuel-lab/chavez-2021. Raw reads from the amplicon datasets are available on NCBI at PRJNA678007 (https://identifiers.org/bioproject: PRJNA678007). The following raw data is provided in Additional file 15: Dataset S1: the BIOM file generated by QIIME2 summarizing the ASV distribution per sample for Experiment 1, the BIOM file generated by QIIM E2 summarizing the ASV distribution per sample for Experiment 2, the metadata for all sequenced samples, the ASV taxonomies predicted by the QIIME2 pipeline, and the taxonomy summaries at the family level that are depicted in Additional file 1: Fig. S1.

#### Bacterial strains, culturing, and maintenance

The bacterial species used were Proteus mirabilis (ATCC 29906), Escherichia fergusonii (ATCC 35469), Escherichia coli HB101 (Caenorhabditis Genetics Center), Pseudomonas fluorescens (ATCC 13525), Micrococcus luteus (ATCC 4698), Staphylococcus hominis (ATCC 27844), Rhizobium leguminosarum (ATCC 14479), Raoultella ornithinolytica JUb54 and Raoultella sp. JUb38 (obtained from Samuel lab, Baylor College of Medicine), and Bacteroides thetaiotaomicron (ATCC 29148, obtained from Hsiao lab, UCLA). E. coli, E. fergusonii, P. mirabilis, P. fluorescens, JUb38, and JUb54 were maintained on Luria broth (LB) plates, grown in LB, and diluted in LB. S. hominis and M. luteus were maintained on tryptic soy plates, grown in tryptic soy media, and diluted in tryptic soy media. R. leguminosarum was maintained on Rhizobium X plates, grown in Rhizobium X media, and diluted in Rhizobium X media. B. thetaiotaomicron was cultured anaerobically in brain-heart infusion supplemented media (BHIS) as previously described [70], and diluted in BHIS. Growth temperatures were 37 °C for all strains except for the *Raoultella* strains, *P*. fluorescens, and R. leguminosarum (28 °C); and M. luteus (30 °C). Each species was diluted to  $1 \times 10^8 - 1 \times 10^9$ CFU/mL as measured by a Thermo Scientific<sup>™</sup> Nano-Drop<sup>™</sup> One spectrophotometer before use.

#### Bacterial chemotaxis assays

For standard bacterial chemotaxis assays, 50 µL of bacteria culture, diluted as described above, was plated onto 10 cm 2% Nematode Growth Media (NGM) plates [71] in one of two scoring regions (2 cm diameter circles) on either side of the plate. Fifty microliters of the speciesspecific media was plated in the other scoring region of the plate as a control (Additional file 7: Fig. S6a). For media control assays (Additional file 7: Fig. S6b-e), a single media type was plated onto both scoring regions. For bacterial competition assays (Additional file 8: Fig. S7), different bacteria were plated onto each scoring region. The plates were then incubated at 37 °C for 30 min. For assays with young adults, worms were collected from a Baermann apparatus and washed twice with BU saline [60] and then twice with dH<sub>2</sub>O in a watch glass before being plated onto the NGM plates. ~75-150 worms (or  $\sim 200-250$  worms for media control assays) were plated longitudinally down the center of the plate (Additional file 7: Fig. S6a). For assays with iL3s, the iL3s were collected from a Baermann apparatus and then washed by

centrifugation in the solutions described above for 1.5 min at 4400 rpm; ~ 300-400 iL3s were then plated. For S. ratti iL3 assays as well as S. stercoralis young adult assays with *B. thetaiotaomicron* and the media controls, a glass spreader was used to spread the worms down the center of the plate to reduce clumping. In all cases, the chemotaxis assays were started 2 h after the bacteria were plated and lasted for either 1 h (young adult assays) or 30 min (iL3 assays). Assays were performed at room temperature. For each assay plate, a chemotaxis index (CI) was calculated based on the number of worms in each scoring region: (# worms in bacteria - # worms in control) ÷ (# worms in bacteria + # worms in control). To account for directional bias during the assays, pairs of identical assays were always performed simultaneously with the bacteria placed in scoring regions on opposite sides of the plate. All assays where the absolute difference in CI for the two plates was  $\geq 0.9$  were discarded. Assay pairs were also discarded if < 7 total worms moved into the scoring regions on one or both of the paired plates.

#### Single-worm tracking assay

Fifty microliters of bacteria culture was plated on a 10 cm 2% NGM plate in 1 of 2 zones (2 cm diameter circles) on either side of the tracking arena, with 3 cm between zones. 50  $\mu$ L of LB was plated in the other zone as a control. The tracking arena was the 5 cm diameter circle in the center of the 10 cm plate (Additional file 10: Fig. S9). The plates were then incubated at 37 °C for 30 min. After collection from a Baermann apparatus, a small number of S. stercoralis free-living adults were removed and placed in a small watch glass with BU. From there a single older, gravid adult female was selected and transferred to dH<sub>2</sub>O. The worm was swirled to wash and then pipetted onto the center of the tracking arena plate in  $1-2\,\mu$ L of dH<sub>2</sub>O. Single-worm tracking was then performed as previously described [23]. The tracking plate was placed above two light diffusers arranged orthogonally on a raised plexiglass surface. The plate surface was bottom-illuminated with a white LED covered with a red-light filter. Tracking was performed in an opaque enclosure to reduce ambient light. Image recording began when the worm left the water droplet. Worm movements were captured using a 5 mega-pixel CMOS camera (BTE-B050-U, Mightex Systems) suspended above the assay plate. Images were saved using the Mightex Cam Demo software (v1.2.1) placed in trigger mode. TTL triggers were provided to the camera at a rate of 0.5 frames/second by a USB DAQ device (U3-LV, LabJack Corp) that was controlled by custom MATLAB (MathWorks) code [59] that was run using MATLAB vR2015b. Images were collected for 20 min or until the worm left the tracking arena.

For post hoc analysis, images were processed into image stacks using a custom FIJI [64] script [59], and worm coordinates on individual images were measured using the Manual Tracking and Cell Counter plugins. The centroids of the experimental (bacteria) and control (LB) zones were measured using FIJI's Measure command. Worm and zone coordinates (in pixels) and a pixels-to-cm conversion factor were used as inputs to custom MATLAB analysis code [23], selecting the Bacterial Assay Type, that was run using MATLAB v2019b. For individual worms, trajectories were automatically rotated and resized so that the centroids of the experimental and control zones were aligned along the X-axis, with an inter-patch distance of 3 cm. To account for directional bias, the location of the bacteria was alternated between left and right zones for each assay. For presentation purposes, tracks in which the bacterial stimulus was placed in the right zone were flipped horizontally to show the bacterial stimulus in the same location in all assays. For LB vs. LB control assays, one zone was randomly assigned as the experimental zone and the other as the control zone. For each experimental condition, individual worm trajectories within the 5 cm diameter assay region were overlaid onto a single plot, along with circles representing the locations of 2 cm diameter zones surrounding the median centroid coordinates of the bacterial (red) and LB (black) stimuli. In addition, the following values were calculated: time spent within the experimental and control zones, median speed, and distance ratio (total track length ÷ maximum displacement). All scripts are available at https://github.com/ HallemLab/Chavez\_et\_al\_2021.

#### Life span, brood size, and egg hatching assays

To determine survival, brood size, and rates of egg hatching for S. stercoralis free-living young adults cultivated on fecal bacteria (Additional file 12: Fig. S11a), assays were performed on 6 cm 2% NGM plates freshly seeded with 50 µL of bacteria, diluted as described above and allowed to dry for at least 30 min. Worms were collected from a Baermann apparatus and washed 3x with BU saline. The worms were then transferred to an unseeded NGM plate and allowed to crawl on the plate for 45 min to remove adhering bacteria. One young adult female containing 0-5 eggs and 3 males were then placed on the bacteria plates. Every 24 h at room temperature, whether the female was alive was determined by examining movement or responsiveness to a gentle prod with a worm pick. The number of eggs and hatched larvae on the plate were also counted. Hatched larvae were defined as those that had at least partially exited the egg case. Living females were then transferred to fresh bacteria plates. Eggs and larvae were counted on days 1-4; progeny counts were only scored for females that were still alive on day 4. Survival was scored on days 1–7, since nearly all worms were dead by day 7.

To compare the rates of egg hatching after 48 h in young versus older adults, bacterial plates were prepared as described above. For assays with young adult females (Additional file 12: Fig. S11b), 1 female containing 0-5 eggs and 3 males were placed onto each bacterial plate. After 24 h at room temperature, the adult worms were removed from the plate, and the number of eggs and larvae were counted to determine the total progeny on the plate. The number of eggs and larvae were counted again at 48 h, and the percentage of hatched eggs was calculated as [(# larvae at 48 h)/(# eggs + # larvae at 24 h)] x 100. For assays with older adults (Additional file 12: Fig. S11c), 4 older, gravid females were placed onto each bacterial plate. The females were then removed after 1.5 h or after at least 20 eggs were laid. The number of eggs was then counted (day 0). After 48 h, the number of larvae on the plate was counted (day 2). The percentage of hatched eggs was then calculated as [(# larvae on day 2)/(# eggs on day 0)] x 100.

To determine whether a soluble factor from P. mirabilis inhibits S. stercoralis egg hatching, P. mirabilis and E. coli were grown and diluted as described above. 500 µL of bacterial culture was then spun at 14,800 rpm for 1 min to pellet the bacterial cells, and the supernatant was removed. The supernatants were filter-sterilized using a 0.22 µm syringe-top filter, and 100 µL of E. coli or P. mirabilis supernatant was then added to 100 µL of E. coli liquid culture. Fifty microliters of the bacterial culture was then plated as described above. A young adult 48 h hatching assay was then conducted as described above. To determine whether a volatile factor from P. mirabilis inhibits S. stercoralis egg hatching, bacterial plates were prepared as described above. A second plate seeded with either E. coli or P. mirabilis was inverted and placed above the plate with the worms, secured with Parafilm. A young adult 48 h hatching assay was then conducted as described above.

To assess the effects of *P. mirabilis* on egg development, young adult 48 h hatching assays were carried out as outlined above (Additional file 12: Fig. S11b). Plates were scored at 24 h and 48 h, and all plate progeny were categorized according to apparent morphological development. Eggs without distinct morphology (anything prior to the "bean" stage) were classified as "undeveloped," whereas eggs that developed past this stage were categorized as "developing." The "developing" group was subcategorized into "bean," "comma," "tadpole," "plum," and "pretzel" stages; any eggs past the "plum" stage were categorized as "pretzel" (Fig. 6a). Hatched larvae were categorized as healthy or unhealthy. At least 5 eggs needed to be laid by 24 h for the assay to be counted. The images shown in Fig. 6a were taken on a Leica M165 FC fluorescent microscope with an attached Nikon D600 camera.

To determine whether *P. mirabilis* prevents egg hatching indirectly by interfering with mating behavior (Additional file 14: Fig. S13a-b), bacterial plates were prepared as described above. A single young adult female containing 1-5 eggs was placed onto the bacterial plate. A young adult 48 h hatching assay and progeny categorization were conducted as described above and the percentage of eggs that hatched at 24 h and 48 h was quantified. For related 12 h egg lay assays (Additional file 14: Fig. S13c), a similar procedure was used, except that the lone adult female was removed from the plate after 12 h and the percentage of eggs that hatched was calculated at 24 h as [(# larvae at 24 h)/(# eggs + # larvae at 12 h)] × 100.

#### Data analysis

Statistical analysis was performed using GraphPad Prism v8.4.2. Violin plots were generated using medium smoothing. Custom MATLAB code was used to analyze and generate single-worm tracks, as described above. For all data sets, the D'Agostino-Pearson omnibus normality test was used to determine if values came from a Gaussian distribution. For data sets that were normally distributed, parametric tests were used. For non-normal distributions, non-parametric tests were used. Statistical tests used and significance thresholds are indicated in figure legends.

#### Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12915-021-01153-7.

Additional file 1: Fig. S1. Microbial community profiles for *S. stercoralis* and controls. Stacked bar plots showing the bacterial families that were identified by 16S amplicon sequencing. Sequencing samples included DNA isolated from wash buffer control 1, consisting of the buffer that was used to wash the nematodes; wash buffer control 2, consisting of the buffer supernatant after washing the nematodes; *S. stercoralis* free-living adults; and *S. stercoralis* (Fig. 2a). Non-significant amplicon sequence variants (ASVs) with < 0.2% abundance across samples were collapsed into the "Other" group. Striped colors indicate genera that are significantly different between categories (ANCOM W > 60% of tested features). Those ASVs are further identified with an asterisk in the legend. The Campylobacteria are a reclassification of the Epsilonproteobacteria and a sister phyla of the Proteobacteria [72].

Additional file 2: Fig. S2. Heatmap summary of the genera abundance across samples for Experiment 1. Average relative abundance of different genera found in the different sample categories for Experiment 1. Sequencing samples were as described for Additional file 1: Fig. S1, in addition to an empty well negative control that was processed along with the other samples. ASVs were filtered to display only samples with an average relative abundance > 0.5%. Small columns within each category represent replicate samples.

Additional file 3: Fig. S3. Heatmap summary of order abundance across samples for Experiment 1. Average relative abundance of different

orders found in the different sample categories for Experiment 1, indicating the large abundance of *Escherichia-Shigella*, *Lactobacillus*, and *Solibacillus* ASVs in *S. stercoralis* free-living adults. Sequencing samples were as described for Additional file 1: Fig. S1, in addition to an empty well negative control that was processed along with the other samples. ASVs were filtered to display only samples with an average relative abundance > 0.5%. ASV identifiers in red are those that showed a significant enrichment in *S. stercoralis* free-living adults vs. controls in both sequencing experiments. Small columns within each category represent replicate samples.

Additional file 4: Fig. S4. Heatmap summary of the genera abundance across samples for Experiment 2. Average relative abundance of different genera found in the different sample categories for Experiment 2. Sequencing samples were as described for Additional file 1: Fig. S1, except that *S. stercoralis* iL3s were not included in this experiment. ASVs were filtered to display only samples with an average relative abundance > 0.5%. Small columns within each category represent replicate samples.

Additional file 5: Fig. S5. Heatmap summary of order abundance across samples for Experiment 2. Average relative abundance of different orders found in the different sample categories for Experiment 2, indicating the large abundance of *Escherichia-Shigella*, *Lactobacillus*, and *Solibacillus* ASVs in *S. stercoralis* free-living adults. Sequencing samples were as described for Additional file 1: Fig. S1, except that *S. stercoralis* iL3s were not included in this experiment. ASVs were filtered to display only samples with an average relative abundance > 0.5%. ASV identifiers in red are those that showed a significant enrichment in *S. stercoralis* free-living adults vs. controls in both sequencing experiments. Small columns within each category represent replicate samples.

**Additional file 6: Table S1.** The bacterial panel selected. The table lists each bacterial species tested, its environment-type designation, the rationale for selecting it, and supporting references.

Additional file 7: Fig. S6. Bacteria chemotaxis assay design. a. Diagram of the bacterial chemotaxis assay. Following plating of bacteria and unseeded media on either side of the plate, a population of nematodes was placed along the center of a 10 cm 2% NGM plate and allowed to migrate for the duration of the assay. A chemotaxis index (CI) was then calculated after counting the number of nematodes in each region as: CI = (# worms in bacteria - # worms in control) / (# worms in bacteria + # worms in control). A positive CI indicates attraction to the bacteria, a negative CI indicates repulsion, and a CI near zero indicates a neutral response. b-e. Control chemotaxis assays with unseeded media on both sides of the plate. Each point in the graphs shows the CI of a single trial; medians (solid lines) and interquartile ranges (dashed lines) are also shown. LB = Luria broth; TS = tryptic soy media; RhiX = Rhizobium X media; BHIS = brain-heart infusion supplemented media. For each graph, no significant differences were detected comparing each condition to all other conditions. Kruskal-Wallis test with Dunn's post-test (b and e) or Brown-Forsythe and Welch ANOVA with Dunnett's T3 post-test (c-d). n =20-32 trials per condition.

Additional file 8: Fig. S7. S. stercoralis free-living adults do not display strong preferences among fecal/gut bacteria. a. Diagram of the bacterial chemotaxis assay. For bacterial competition chemotaxis assays, different bacteria were plated on each side of the plate. A chemotaxis index (CI) was calculated after counting the number of nematodes in each region as: CI = (# worms in bacteria 1 region - # worms in bacteria 2 region) / (# worms in bacteria 1 region + # worms in bacteria 2 region). b. S. stercoralis free-living adults did not prefer E. coli or E. fergusonii over P. mirabilis. No significant differences were detected (Brown-Forsythe and Welch ANOVA). c. S. stercoralis free-living adults showed a slight preference for E. coli over E. fergusonii. \*\*p< 0.01, Brown-Forsythe and Welch ANOVA with Dunnett's T3 post-test. Only the significant difference is noted. For b-c, each condition was compared to the control condition where the same bacterial species was plated on both sides of the plate. The same data are represented in b and c. n = 24-38 trials per condition, with 75-150 worms per trial. Each point in the graphs shows the chemotaxis index of a single trial; medians (solid lines) and interquartile ranges (dashed lines) are also shown. For each condition, the bacteria listed at the top and bottom of the graph indicate the two bacteria being tested in the competition assay.

Additional file 9.: Fig. S8. S. ratti and S. stercoralis respond similarly to the bacterial species tested. a. S. ratti free-living adults and S. stercoralis free-living adults displayed similar chemotaxis responses to the bacterial panel. No significant differences were detected (two-way ANOVA with Sidak's post-test). n = 20-40 trials per condition, with 75-150 worms per trial. b. S. ratti i13s and S. stercoralis iL3s displayed similar chemotaxis responses to the bacterial panel, with only a minor difference in the response to *P. mirabilis*. \*p < 0.05, two-way ANOVA with Sidak's post-test. Only the significant difference is noted. n = 20-30 trials per condition, with 300-400 worms per trial. Each point in the graphs shows the chemotaxis index of a single trial; medians (solid lines) and interquartile ranges (dashed lines) are also show. Data are from Fig. 3.

Additional file 10: Fig. S9. Single-worm tracking assay design. Bacteria and unseeded LB media were plated on either side of a 5 cm diameter tracking arena (bolded inner circle) centered on a 10 cm 2% NGM plate (left). A single, older *S. stercoralis* free-living adult female was placed in the center of the arena and recorded for 20 min or until it left the tracking arena. Video analysis software and custom MATLAB code (see Materials and Methods) were used to produce and compile movement tracks (right). Pink and grey shaded circles indicate the location of the bacteria and LB media, respectively; red and grey circle outlines indicate the experimental region and the control region, respectively.

Additional file 11: Fig. S10. *S. stercoralis* free-living adults move through different bacteria at similar speeds. Median crawling speeds only through the bacterial lawns were analyzed from single-worm tracking data. No significant differences were detected comparing each condition to every other condition (Kruskal-Wallis test with Dunn's post-test). n = 5-16 worms per condition. Graph shows medians (solid lines) and interquartile ranges (dashed lines).

Additional file 12: Fig. S11. Life span, brood size, and egg hatching assay design. a. To measure life span, brood size, and egg hatching after 24 hours, three free-living adult S. stercoralis males and one free-living young adult female were placed on a plate containing either E. coli, E. fergusonii, or P. mirabilis (day 0). On days 1-7, survival of the female was scored every 24 h, and if the female was still alive, it was transferred to a fresh bacterial plate. On days 1-4, after transferring the female to a fresh plate, the numbers of eggs and larvae present on the plate the female was transferred off of were recorded. On days 5-7, only survival was monitored. Brood size and egg hatching were calculated only for females that were still alive on day 4. b. To measure the rate of egg hatching after 48 h with young adult females, three free-living adult S. stercoralis males and one free-living young adult female were placed on a bacteria plate. All adults were removed after 24 h. The number of eggs and larvae present on the plate were recorded at 24 h and 48 h to determine the percentage of eggs that had hatched after 48 h. c. To measure the rate of egg hatching after 48 h with older females, four older free-living adult S. stercoralis females were placed on bacteria plates. All adults were removed after 1.5 h or after 20 eggs were laid (0 h time point). Eggs were recorded at 0 h and larvae at 48 h to determine the rate of egg hatching after 48 h.

Additional file 13: Fig. S12. Neither soluble nor volatile *P. mirabilis* factors are sufficient to decrease *S. stercoralis* egg hatching. a. No significant differences in the rates of egg hatching after 48 h were observed when *S. stercoralis* young adult females were cultured on either *E. coli* supplemented with *E. coli* supplemented with *E. coli* supplemented with *E. coli* supplemented with *e. mirabilis* supernatant (unpaired two-tailed Welch's t test). n = 9 trials per condition. Graph shows medians (solid lines) and interquartile ranges (dashed lines). b. No significant differences in the rates of egg hatching after 48 h were observed when *S. stercoralis* young adult females were cultured on *E. coli* either in the presence of *E. coli* volatiles or in the presence of *P. mirabilis* volatiles (two-tailed Mann-Whitney test). n = 5-6 trials per condition. Graph shows medians (solid lines) and interquartile ranges (dashed lines). Each assay consisted of 3 *S. stercoralis* males and 1 young adult female; adults were removed after 24 h, and the percentage of eggs that had hatched was determined at 48 h.

**Additional file 14: Fig. S13.** The effect of *P. mirabilis* on *S. stercoralis* egg hatching is due to a direct effect on embryonic development rather than an indirect effect on mating behavior. a. Culturing individual *S. stercoralis* young adult females on *P. mirabilis* in the absence of males resulted in reduced egg hatching after 24 h (left) and 48 h (right). For

these experiments, lone young adult females containing 1-5 eggs in their gonad were cultured on a lawn of either P. mirabilis or E. coli in the absence of males for 24 h, and the frequency of egg hatching was then scored at 24 and 48 h. \*\*\*p< 0.001, \*p< 0.05, Mann Whitney test (left) or Welch's t-test (right). n = 8 trials per condition. b. Culturing individual S. stercoralis young adult females on P. mirabilis in the absence of males resulted in decreased frequencies of healthy larvae. For these experiments, lone young adult females containing 1-5 eggs in their gonad were cultured as described above, and eggs and larvae were scored at 24 and 48 h as described in Fig. 6. \*p< 0.05, \*\*p< 0.01, \*\*\*\*p< 0.0001, two-way ANOVA with Tukey's multiple comparisons test. Comparisons are between the same category and time point; only significant differences are shown. n = 8-7 trials per condition. Median percentages are represented, and bars represent interquartile ranges. Data in a and b are from the same experiments. c. Culturing individual S. stercoralis young adult females on P. mirabilis for only 12 h in the absence of males did not result in a decrease in egg hatching, suggesting that *P. mirabilis* impedes egg development specifically in later-laid eggs by interfering with early egg development. ns = not significant (p=0.2687), Welch's t test. n = 6-20 trials per condition.

Additional file 15: Dataset S1. Microbiome Sequencing Dataset. This dataset contains the BIOM file generated by QIIME2 summarizing the ASV distribution per sample for Experiment 1 (tab 1), the BIOM file generated by QIIME2 summarizing the ASV distribution per sample for Experiment 2 (tab 2), the relevant sample metadata (tab 3), the ASV taxonomies predicted by the QIIME2 pipeline (tab 4), and the taxonomy summaries at the family level that are depicted in Additional file 1: Fig. S1 (tab 5).

#### Acknowledgements

We thank Dr. Thomas Fung (Elaine Hsiao lab, UCLA) for providing cultured *B. thetaiotaomicron* and BHIS media.

#### Authors' contributions

I.N.C., T.M.B., A.A., B.S.S., and E.A.H. designed the research. I.N.C. and T.M.B. cultured worms and bacteria, performed population chemotaxis assays, and performed single-worm tracking assays. I.N.C., T.M.B., and E.A.H. analyzed chemotaxis assay data and single-worm tracking data. T.M.B. performed life span and egg laying assays. T.M.B. and I.N.C. performed egg hatching assays; I.N.C., T.M.B., and E.A.H. analyzed this data. T.M.B. and A.A. extracted DNA for 16S-based amplicon sequencing. A.A. performed 16S-based amplicon sequencing data. A.S.B. wrote the code for single-worm tracking. I.N.C., A.A., B.S.S., and E.A.H. wrote the paper. All authors read and approved the final manuscript.

#### Funding

This work was supported by NIH MARC T34 GM008563 (I.N.C.); NIH T32 GM007185 and an HHMI Gilliam Fellowship (T.M.B.); an A.P. Giannini Postdoctoral Fellowship (A.S.B.); NIH DP2 DK116645 (B.S.S.); and a Burroughs-Wellcome Fund Investigators in the Pathogenesis of Disease Award, HHMI Faculty Scholar Award, and NIH R01 DC017959 (E.A.H.).

#### Availability of data and materials

All data from this study are included in this published article and its additional files. All code used for data analysis in this study is publicly available through the Hallem lab GitHub site (https://github.com/HallemLab/Chavez\_et\_al\_2021) or the Samuel lab Bitbucket site (https://bitbucket.org/the-samuel-lab/chavez-2021). Raw reads from the amplicon datasets are available on NCBI at PRJNA678007 (https://identifiers.org/bioproject:PRJNA678007).

#### Declarations

#### Ethics approval and consent to participate

All protocols and procedures involving vertebrate animals were approved by the UCLA Office of Animal Research Oversight (Protocol 2011-060-31), which adheres to the standards of the AAALAC and the Guide for the Care and Use of Laboratory Animals.

#### Consent for publication

Not applicable.

#### **Competing interests**

The authors declare that they have no competing interests.

#### Author details

<sup>1</sup>Department of Microbiology, Immunology, and Molecular Genetics, University of California, Los Angeles, Los Angeles, CA 90095, USA. <sup>2</sup>Molecular Biology Institute, University of California, Los Angeles, Los Angeles, CA 90095, USA. <sup>3</sup>Alkek Center for Metagenomics and Microbiome Research, Baylor College of Medicine, Houston, TX 77030, USA. <sup>4</sup>Department of Molecular Virology and Microbiology, Baylor College of Medicine, Houston, TX 77030, USA.

#### Received: 22 January 2021 Accepted: 14 September 2021 Published online: 07 October 2021

#### References

- Boatin BA, Basanez MG, Prichard RK, Awadzi K, Barakat RM, Garcia HH, et al. A research agenda for helminth diseases of humans: towards control and elimination. PLoS Negl Trop Dis. 2012;6(4):e1547. https://doi.org/10.1371/ journal.pntd.0001547.
- Lustigman S, Prichard RK, Gazzinelli A, Grant WN, Boatin BA, McCarthy JS, et al. A research agenda for helminth diseases of humans: the problem of helminthiases. PLoS Negl Trop Dis. 2012;6(4):e1582. https://doi.org/10.1371/ journal.pntd.0001582.
- Gang SS, Hallem EA. Mechanisms of host seeking by parasitic nematodes. Mol Biochem Parasitol. 2016;208(1):23–32. https://doi.org/10.1016/j.molbiopa ra.2016.05.007.
- Buonfrate D, Bisanzio D, Giorli G, Odermatt P, Furst T, Greenaway C, et al. The global prevalence of *Strongyloides stercoralis* infection. Pathogens. 2020; 9(6):468. https://doi.org/10.3390/pathogens9060468.
- Blaxter M, Koutsovoulos G. The evolution of parasitism in Nematoda. Parasitol. 2015;142(Suppl 1):S26–39. https://doi.org/10.1017/S0031182014 000791.
- Viney ME, Lok JB. The biology of Strongyloides spp. In: WormBook; 2015. p. 1–17. www.wormbook.org.
- Harvey SC, Viney ME. Sex determination in the parasitic nematode Strongyloides ratti. Genetics. 2001;158(4):1527–33. https://doi.org/10.1093/ genetics/158.4.1527.
- Page W, Judd JA, Bradbury RS. The unique life cycle of *Strongyloides* stercoralis and implications for public health action. Trop Med Infect Dis. 2018;3(2):53. https://doi.org/10.3390/tropicalmed3020053.
- Siddiqui AA, Berk SL. Diagnosis of *Strongyloides stercoralis* infection. Clin Infect Dis. 2001;33(7):1040–7. https://doi.org/10.1086/322707.
- Olsen A, van Lieshout L, Marti H, Polderman T, Polman K, Steinmann P, et al. Strongyloidiasis--the most neglected of the neglected tropical diseases? Trans R Soc Trop Med Hyg. 2009;103(10):967–72. https://doi.org/10.1016/j. trstmh.2009.02.013.
- Keiser PB, Nutman TB. Strongyloides stercoralis in the immunocompromised population. Clin Microbiol Rev. 2004;17(1):208–17. https://doi.org/10.1128/ CMR.17.1.208-217.2004.
- Mejia R, Nutman TB. Screening, prevention, and treatment for hyperinfection syndrome and disseminated infections caused by *Strongyloides stercoralis*. Curr Opin Infect Dis. 2012;25(4):458–63. https://doi. org/10.1097/QCO.0b013e3283551dbd.
- 13. Viney ME. Exploiting the life cycle of *Strongyloides ratti*. Parasitol Today. 1999;15(6):231–5. https://doi.org/10.1016/S0169-4758(99)01452-0.
- Viney M, Kikuchi T. Strongyloides ratti and S. venezuelensis rodent models of Strongyloides infection. Parasitology. 2017;144(3):285–94. https://doi.org/10.1 017/S0031182016000020.
- Jenkins TP, Brindley PJ, Gasser RB, Cantacessi C. Helminth microbiomes a hidden treasure trove? Trends Parasitol. 2018;35(1):13–22. https://doi.org/1 0.1016/j.pt.2018.10.007.
- Zhang F, Berg M, Dierking K, Felix M-A, Shapira M, Samuel BS, et al. *Caenorhabditis elegans* as a model for microbiome research. Front Microbiol. 2017;8:1–10. https://doi.org/10.3389/fmicb.2017.00485.
- Samuel BS, Rowedder H, Braendle C, Felix MA, Ruvkun G. Caenorhabditis elegans responses to bacteria from its natural habitats. Proc Natl Acad Sci USA. 2016;113(27):E3941–9. https://doi.org/10.1073/pnas.1607183113.
- Lok JB. Strongyloides stercoralis: a model for translational research on parasitic nematode biology. In: WormBook; 2007. p. 1–18. www. wormbook.org.

- Schad GA. Morphology and life history of *Strongyloides stercoralis*. In: Grove DI, editor. Strongyloidiasis: a Major Roundworm Infection of Man. Philadelphia: Taylor & Francis, Inc.; 1989. p. 85–104.
- Castelletto ML, Massey HC Jr, Lok JB. Morphogenesis of Strongyloides stercoralis infective larvae requires the DAF-16 ortholog FKTF-1. PLoS Pathog. 2009;5(4):e1000370. https://doi.org/10.1371/journal.ppat.1000370.
- Bryant AS, Hallem EA. Terror in the dirt: sensory determinants of host seeking in soil-transmitted mammalian-parasitic nematodes. Int J Parasitol Drugs Drug Resist. 2018;8(3):496–510. https://doi.org/10.1016/j.ijpddr.2018.10.008.
- Castelletto ML, Gang SS, Okubo RP, Tselikova AA, Nolan TJ, Platzer EG, et al. Diverse host-seeking behaviors of skin-penetrating nematodes. PLoS Pathog. 2014;10(8):e1004305. https://doi.org/10.1371/journal.ppat.1 004305.
- Gang SS, Castelletto ML, Yang E, Ruiz F, Brown TM, Bryant AS, et al. Chemosensory mechanisms of host seeking and infectivity in skinpenetrating nematodes. Proc Natl Acad Sci USA. 2020;117(30):17913–23. https://doi.org/10.1073/pnas.1909710117.
- Flemer B, Gaci N, Borrel G, Sanderson IR, Chaudhary PP, Tottey W, et al. Fecal microbiota variation across the lifespan of the healthy laboratory rat. Gut Microbes. 2017;8(5):428–39. https://doi.org/10.1080/19490976.2017.1334033.
- Manichanh C, Reeder J, Gibert P, Varela E, Llopis M, Antolin M, et al. Reshaping the gut microbiome with bacterial transplantation and antibiotic intake. Genome Res. 2010;20(10):1411–9. https://doi.org/10.1101/gr.1 07987.110.
- Montes M, Sawhney C, Barros N. Strongyloides stercoralis: there but not seen. Curr Opin Infect Dis. 2010;23(5):500–4. https://doi.org/10.1097/QCO.0b013 e32833df718.
- Dantas Lopes LD, Davis EW, Pereira e Silva MC, Weisberg AJ, Bresciani L, Chang JH, et al. Tropical soils are a reservoir for fluorescent *Pseudomonas* spp. biodiversity. Environ Microbiol. 2018;20(1):62–74. https://doi.org/1 0.1111/1462-2920.13957.
- Mauchline TH, Malone JG. Life in earth -- the root microbiome to the rescue? Curr Opin Microbiol. 2017;37:23–8. https://doi.org/10.1016/j.mib.201 7.03.005.
- 29. Hall DH, Herndon LA, Altun Z. Introduction to *C. elegans* embryo anatomy. In: WormAtlas; 2021. www.wormatlas.org.
- Dirksen P, Marsh SA, Braker I, Heitland N, Wagner S, Nakad R, et al. The native microbiome of the nematode *Caenorhabditis elegans*: gateway to a new host-microbiome model. BMC Biol. 2016;14(1):38. https://doi.org/10.11 86/s12915-016-0258-1.
- Worthington JM, Fulghum RS. Cecal and fecal bacterial flora of the Mongolian gerbil and the chinchilla. Appl Environ Microbiol. 1988;54(5): 1210–5. https://doi.org/10.1128/aem.54.5.1210-1215.1988.
- Zotta T, Parente E, Ricciardi A. Aerobic metabolism in the genus Lactobacillus: impact on stress response and potential applications in the food industry. J Appl Microbiol. 2017;122(4):857–69. https://doi.org/10.1111/ jam.13399.
- Borch E, Molin G. The aerobic growth and product formation of *Lactobacillus*, *Leuconostoc, Brochothrix*, and *Carnobacterium* in batch cultures. Appl Microbiol. 1989;30(1):81–8. https://doi.org/10.1007/BF00256001.
- Zotta T, Ricciardi A, Ianniello RG, Parente E, Reale A, Rossi F, et al. Assessment of aerobic and respiratory growth in the *Lactobacillus casei* group. PLoS ONE. 2014;9(6):e99189. https://doi.org/10.1371/journal.pone. 0099189.
- 35. Tetz G, Tetz V. Introducing the sporobiota and sporobiome. Gut Pathog. 2017;9(1):38. https://doi.org/10.1186/s13099-017-0187-8.
- Kennedy V, Van Laar TA, Aleru O, Thomas M, Ganci M, Rawat M. Genome sequences of three spore-forming bacteria isolated from the feces of organically raised chickens. Genome Announc. 2016;4(5):e00880–16. https:// doi.org/10.1128/genomeA.00880-16.
- Mual P, Singh NK, Verma A, Schumann P, Krishnamurthi S, Dastager S, et al. Reclassification of *Bacillus isronensis*<sup>Shivaji et al. 2009</sup> as *Solibacillus isronensis* comb. nov. and emended description of genus *Solibacillus Krishnamurthi et al.* 2009. Int J Syst Evol Microbiol. 2016;66(5):2113–20.
- Seuylemezian A, Singh NK, Vaishampayan P, Venkateswaran K. Draft genome sequence of *Solibacillus kalamii*, isolated from an air filter aboard the International Space Station. Genome Announc. 2017;5(35):e00696–17. https://doi.org/10.1128/genomeA.00696-17.
- Swick MC, Koehler TM, Driks A. Surviving between hosts: sporulation and transmission. Microbiol Spectr. 2016;4(4):4.4.26.

- White EC, Houlden A, Bancroft AJ, Hayes KS, Goldrick M, Grencis RK, et al. Manipulation of host and parasite microbiotas: survival strategies during chronic nematode infection. Sci Adv. 2018;4(3):eaap7399.
- Reynolds LA, Smith KA, Filbey KJ, Harcus Y, Hewitson JP, Redpath SA, et al. Commensal-pathogen interactions in the intestinal tract: *Lactobacilli* promote infection with, and are promoted by, helminth parasites. Gut Microbes. 2014;5(4):522–32. https://doi.org/10.4161/gmic.32155.
- Holm JB, Sorobetea D, Kiilerich P, Ramayo-Caldas Y, Estelle J, Ma T, et al. Chronic *Trichuris muris* infection decreases diversity of the intestinal microbiota and concomitantly increases the abundance of *Lactobacilli*. PLoS ONE. 2015;10(5):e0125495. https://doi.org/10.1371/journal.pone.0125495.
- Vejzagic N, Adelfio R, Keiser J, Kringel H, Thamsborg SM, Kapel CM. Bacteriainduced egg hatching differs for *Trichuris muris* and *Trichuris suis*. Parasit Vectors. 2015;8(1):371. https://doi.org/10.1186/s13071-015-0986-z.
- Afrin T, Murase K, Kounosu A, Hunt VL, Bligh M, Maeda Y, et al. Sequential changes in the host gut microbiota during infection with the intestinal parasitic nematode *Strongyloides venezuelensis*. Front Cell Infect Microbiol. 2019;9:217. https://doi.org/10.3389/fcimb.2019.00217.
- Gause WC, Maizels RM. Macrobiota helminths as active participants and partners of the microbiota in host intestinal homeostasis. Curr Opin Microbiol. 2016;32:14–8. https://doi.org/10.1016/j.mib.2016.04.004.
- Jenkins TP, Rathnayaka Y, Perera PK, Peachey LE, Nolan MJ, Krause L, et al. Infections by human gastrointestinal helminths are associated with changes in faecal microbiota diversity and composition. PLoS ONE. 2017;12(9): e0184719. https://doi.org/10.1371/journal.pone.0184719.
- Rosa BA, Supali T, Gankpala L, Djuardi Y, Sartono E, Zhou Y, et al. Differential human gut microbiome assemblages during soil-transmitted helminth infections in Indonesia and Liberia. Microbiome. 2018;6(1):33. https://doi. org/10.1186/s40168-018-0416-5.
- Zaiss MM, Harris NL. Interactions between the intestinal microbiome and helminth parasites. Parasite Immunol. 2016;38(1):5–11. https://doi.org/1 0.1111/pim.12274.
- Jenkins TP, Formenti F, Castro C, Piubelli C, Perandin F, Buonfrate D, et al. A comprehensive analysis of the faecal microbiome and metabolome of *Strongyloides stercoralis* infected volunteers from a non-endemic area. Sci Rep. 2018;8(1):15651. https://doi.org/10.1038/s41598-018-33937-3.
- Sinnathamby G, Henderson G, Umair S, Janssen P, Bland R, Simpson H. The bacterial community associated with the sheep gastrointestinal nematode parasite *Haemonchus contortus*. PLoS ONE. 2018;13(2):e0192164. https://doi. org/10.1371/journal.pone.0192164.
- Koga M, Nuamtanong S, Dekumyoy P, Yoonuan T, Maipanich W, Rojekittikhun W, et al. Host-finding behavior of *Strongyloides stercoralis* infective larvae to sodium cation, human serum, and sweat. Southeast Asian J Trop Med Public Health. 2005;36:93–8.
- Koga M, Tada I. Strongyloides ratti: chemotactic responses of third-stage larvae to selected serum proteins and albumins. J Helminthol. 2000;74(3): 247–52. https://doi.org/10.1017/S0022149X00000354.
- Oliveira-Sequeira TC, David EB, Ribeiro C, Guimaraes S, Masseno AP, Katagiri S, et al. Effect of *Bifidobacterium animalis* on mice infected with *Strongyloides venezuelensis*. Rev Inst Med Trop Sao Paulo. 2014;56(2):105–9. https://doi.org/10.1590/S0036-46652014000200003.
- Dulovic A, Puller V, Streit A. Optimizing culture conditions for free-living stages of the nematode parasite *Strongyloides ratti*. Exp Parasitol. 2016;168: 25–30. https://doi.org/10.1016/j.exppara.2016.06.005.
- JebaMercy G, Vigneshwari L, Balamurugan K. A MAP Kinase pathway in *Caenorhabditis elegans* is required for defense against infection by opportunistic *Proteus species*. Microbes Infect / Institut Pasteur. 2013;15:e568. https://doi.org/10.1016/j.micinf.2013.03.009.
- Nandi M, Selin C, Brassinga AK, Belmonte MF, Fernando WG, Loewen PC, et al. Pyrrolnitrin and hydrogen cyanide production by *Pseudomonas chlororaphis* strain PA23 exhibits nematicidal and repellent activity against *Caenorhabditis elegans*. PLoS ONE. 2015;10(4):e0123184. https://doi.org/10.13 71/journal.pone.0123184.
- Lee J-H, Lee Y-G, Kim M, Kim E, Choi H, Kim Y, et al. Indole-associated predator–prey interactions between the nematode *Caenorhabditis elegans* and bacteria. Environ Microbiol. 2017;19(5):1776–90. https://doi.org/1 0.1111/1462-2920.13649.
- Rengarajan S, Hallem EA. Olfactory circuits and behaviors of nematodes. Curr Opin Neurobiol. 2016;41:136–48. https://doi.org/10.1016/j.conb.2016. 09.002.

- Bryant AS, Ruiz F, Gang SS, Castelletto ML, Lopez JB, Hallem EA. A critical role for thermosensation in host seeking by skin-penetrating nematodes. Curr Biol. 2018;28(14):2338–47. https://doi.org/10.1016/j.cub.2018.05.063.
- Hawdon JM, Schad GA. Long-term storage of hookworm infective larvae in buffered saline solution maintains larval responsiveness to host signals. J Helm Soc Wash. 1991;58:140–2.
- Zhang F, Weckhorst JL, Assie A, Khodakova AS, Loeza-Cabrera M, Vidal D, et al. High-throughput assessment of changes in the *Caenorhabditis elegans* gut microbiome. Methods Mol Biol. 2020;2144:131–44. https://doi.org/10.1 007/978-1-0716-0592-9\_12.
- Caporaso JG, Lauber CL, Walters WA, Berg-Lyons D, Huntley J, Fierer N, et al. Ultra-high-throughput microbial community analysis on the Illumina HiSeq and MiSeq platforms. ISME J. 2012;6(8):1621–4. https://doi.org/10.1038/ ismej.2012.8.
- Ul-Hasan S, Bowers RM, Figueroa-Montiel A, Licea-Navarro AF, Beman JM, Woyke T, et al. Community ecology across bacteria, archaea and microbial eukaryotes in the sediment and seawater of coastal Puerto Nuevo, Baja California. PLoS ONE. 2019;14(2):e0212355. https://doi.org/10.1371/journal. pone.0212355.
- Schindelin J, Arganda-Carreras I, Frise E, Kaynig V, Longair M, Pietzsch T, et al. Fiji: an open-source platform for biological-image analysis. Nat Methods. 2012;9(7):676–82. https://doi.org/10.1038/nmeth.2019.
- Rueden CT, Schindelin J, Hiner MC, DeZonia BE, Walter AE, Arena ET, et al. ImageJ2: ImageJ for the next generation of scientific image data. BMC Bioinformatics. 2017;18(1):529. https://doi.org/10.1186/s12859-017-1934-z.
- Bolyen E, Rideout JR, Dillon MR, Bokulich NA, Abnet CC, Al-Ghalith GA, et al. Reproducible, interactive, scalable and extensible microbiome data science using QIIME 2. Nat Biotechnol. 2019;37(8):852–7. https://doi.org/10.1038/s41 587-019-0209-9.
- Wickham H, Averick M, Bryan J, Chang W, McGowan LD, François R, et al. Welcome to the Tidyverse. J Open Source Softw. 2019;4(43):1686. https:// doi.org/10.21105/joss.01686.
- Oksanen J, Blanchet FG, Friendly M, Kindt R, Legendre P, McGlinn D, et al. vegan: Community ecology package. In: R package version 25-6; 2019.
- Mandal S, Van Treuren W, White RA, Eggesbo M, Knight R, Peddada SD. Analysis of composition of microbiomes: a novel method for studying microbial composition. Microb Ecol Health Dis. 2015;26(0):27663. https://doi. org/10.3402/mehd.v26.27663.
- Fung TC, Vuong HE, Luna CDG, Pronovost GN, Aleksandrova AA, Riley NG, et al. Intestinal serotonin and fluoxetine exposure modulate bacterial colonization in the gut. Nat Microbiol. 2019;4(12):2064–73. https://doi.org/1 0.1038/s41564-019-0540-4.
- Stiernagle T. Maintenance of C. elegans. In: WormBook; 2006. p. 1–11. www. wormbook.org.
- Waite DW, Chuvochina MS, Hugenholtz P. Road Map of the Phylum Campylobacterota. In Bergey's Manual of Systematics of Archaea and Bacteria (eds Trujillo ME, Dedysh S, DeVos P, Hedlund B, Kämpfer P, Rainey FA, Whitman WB). 2019. https://doi.org/10.1002/9781118960608.bm00040.
- Wickham H. ggplot2: Elegant Graphics for Data Analysis. New York: Springer-Verlag; 2016. https://doi.org/10.1007/978-3-319-24277-4.

#### **Publisher's Note**

Springer Nature remains neutral with regard to jurisdictional claims in published maps and institutional affiliations.

#### Ready to submit your research? Choose BMC and benefit from:

- fast, convenient online submission
- thorough peer review by experienced researchers in your field
- rapid publication on acceptance
- support for research data, including large and complex data types
- gold Open Access which fosters wider collaboration and increased citations
- maximum visibility for your research: over 100M website views per year

#### At BMC, research is always in progress.

Learn more biomedcentral.com/submissions

