



# CD8 T cells drive anorexia, dysbiosis, and blooms of a commensal with immunosuppressive potential after viral infection

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Infections elicit immune adaptations to enable pathogen resistance and/or tolerance and are associated with compositional shifts of the intestinal microbiome. However, a comprehensive understanding of how infections with pathogens that exhibit distinct capability to spread and/or persist differentially change the microbiome, the underlying mechanisms, and the relative contribution of individual commensal species to immune cell adaptations is still lacking. Here, we discovered that mouse infection with a fast-spreading and persistent (but not a slow-spreading acute) isolate of lymphocytic choriomeningitis virus induced large-scale microbiome shifts characterized by increased Verrucomicrobia and reduced Firmicute/Bacteroidetes ratio. Remarkably, the most profound microbiome changes occurred transiently after infection with the fast-spreading persistent isolate, were uncoupled from sustained viral loads, and were instead largely caused by CD8 T cell responses and/or CD8 T cell-induced anorexia. Among the taxa enriched by infection with the fast-spreading virus, *Akkermansia muciniphila*, broadly regarded as a beneficial commensal, bloomed upon starvation and in a CD8 T cell-dependent manner. Strikingly, oral administration of *A. muciniphila* suppressed selected effector features of CD8 T cells in the context of both infections. Our findings define unique microbiome differences after chronic versus acute viral infections and identify CD8 T cell responses and downstream anorexia as driver mechanisms of microbial dysbiosis after infection with a fast-spreading virus. Our data also highlight potential context-dependent effects of probiotics and suggest a model in which changes in host behavior and downstream microbiome dysbiosis may constitute a previously unrecognized negative feedback loop that contributes to CD8 T cell adaptations after infections with fast-spreading and/or persistent pathogens.

CD8 T cell | LCMV | microbiome | *Akkermansia* | anorexia

Adaptability, the capacity to adjust or adapt to improve fitness in the face of environmental changes is a trait shared among all forms of life (1). Such adaptations occur at the single cell, organismal, and population levels and involve mechanisms with different time requirements to be implemented and exhibiting distinct degree of reversibility (1). Mammalian hosts and their immune systems often adapt to the presence of pathogens and engage different coping mechanisms depending on their virulence (2). In this regard, infections with fast-spreading and/or persistent pathogens elicit potent inflammatory responses that contribute to pathogen control, but can also undermine host survival, if unrestrained (2–6). Immune adaptations that attenuate the magnitude or amplitude of anti-pathogen responses are therefore necessary to allow pathogen clearance during acute infections, and/or partial pathogen control during chronic infections, while avoiding host death due to excessive immunopathology. Such adaptations encompass the innate and adaptive immune system, involve multiple layers of cell-intrinsic

transcriptional, epigenetic, posttranscriptional, and metabolic regulation, and are triggered in response to environmental changes (e.g., abundant pathogen-associated molecular patterns and antigens, an inflammatory milieu, and altered nutrient and oxygen levels) (3, 7). Among the most studied adaptations that attenuate immune responses, CD8 T cell exhaustion, a unique cellular state characterized by diminished effector functions and expression of inhibitory receptors, is highly conserved not only among persistent infections in mice and humans, but also in tumor settings (7).

More recently, it has become evident that the character and strength of immune responses can be regulated by the microbiome (8). In particular for chronic pathogens, the intestinal microbiome has been shown to regulate host resistance to infections caused by persistent lymphocytic choriomeningitis virus (LCMV) (9), *Plasmodium yoelii* (10), and *Mycobacterium*

## Significance

Infections are known to perturb intestinal microbiome composition, but the underlying mechanisms and the implications of specific commensal species for antiviral immunity remain largely unknown. Here, we found that infection of mice with a fast-spreading and persistent, but not slow-spreading acute, viral isolate induced profound microbial dysbiosis, including blooming of *Akkermansia muciniphila*, that was largely caused by CD8 T cells and/or CD8 T cell-induced anorexia. Notably, administration of *A. muciniphila* into infected mice attenuated selected aspects of CD8 T cell responses, supporting its immunosuppressive potential in this context. Our findings bring about a role for CD8 T cells in promoting anorexia and microbial shifts after infection, including the enrichment of a fasting-associated commensal that can attenuate CD8 T cell responses.

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The authors declare no competing interest.

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*tuberculosis* (11, 12). It has also been shown that persistent pathogens such as HIV (13), hepatitis C virus (HCV) (14), and Hepatitis B virus (HBV) (15) in humans as well as simian immunodeficiency virus (SIV) (16) in macaques and *Plasmodium* species (17, 18) in mice induce significant changes in the intestinal microbiome composition or dysbiosis. On the other hand, acute infections caused by respiratory viruses (19–21) or enteropathogenic bacteria (22, 23) can also alter the composition of the gut microbiome. Notably, some of these studies have drawn a number of correlations between specific bacterial taxa and diverse disease parameters (13–15) that suggest important roles for the microbiome changes after infections. Studies addressing the mechanisms that dictate dysbiosis and/or the functional effects of specific taxa are, however, scarce.

In the present study, we use the well-established LCMV mouse model system to compare side-by-side microbiome changes induced at different times after infection with a fast-replicating persistent vs. a slow-replicating acute isolate. We found that the most profound microbiome alterations occurred after infection with the persistent, but not acute, LCMV isolate and were mostly transient (i.e., at day 8 but not at day 20 postinfection [p.i.]) despite continuously high viral titers at the latter time point. The microbiome changes unique to the infection with the fast-replicating persistent virus involved transiently increased Verrucomicrobia and reduced Firmicutes/Bacteroidetes ratio at the phylum level as well as overrepresentation of *Akkermansia*, *Bacteroides*, and *Sutterella* among other taxa. We also detected reductions in *Lactobacillus* and *Turicibacter*, the latter of which was maintained at day 20 p.i. Intriguingly, CD8 T cells were responsible for modulating over half of the dysbiotic taxa after infection with the fast-replicating persistent LCMV isolate, thus revealing a key role for CD8 T cells in promoting intestinal dysbiosis. Coincidentally, and only early after infection with the fast-replicating persistent isolate, CD8 T cells induced a profound anorexic behavior and a significant fraction of the taxa uniquely changed after this infection were commonly altered in other fasting conditions. Among these fasting-associated taxa, we validated (at the species level) that the commensal *Akkermansia muciniphila* bloomed after infection with the fast-replicating persistent LCMV, and its abundance was remarkably increased by lack of food consumption in the absence of infection. We further observed a significant decrease in the levels of *A. muciniphila* in infected mice in which anorexia was reverted via CD8 T cell depletion. These observations supported the conclusion that anorexia induction was one of the means via which CD8 T cells caused intestinal dysbiosis after infection with persistent, fast-replicating, LCMV. On the other hand, experimental enrichment of *A. muciniphila* after LCMV infection suppressed Granzyme B (GrzB) and T-BET expression, and H3K27 trimethylation in distal virus-specific CD8 T cells. Together, these data contrast the specific microbiome changes that occur after infection with two closely related viral isolates, uncoupling dysbiosis from sustained viral loads and instead relating it to both CD8 T cell responses and downstream anorexia occurring during the early phase of infection with a fast-replicating, persistent virus. In addition, our data support a potential role for a CD8 T cell-driven, fasting-associated commensal, *A. muciniphila*, in regulating CD8 T cells and attenuating selected aspects of their effector responses.

## Results

**Infection with a Fast-Spreading Persistent LCMV Isolate Induced Profound Intestinal Dysbiosis That Was Mostly Transient and Uncoupled from Sustained Viral Loads.** To investigate side-by-side alterations in intestinal microbiome composition after infection with a fast-replicating persistent vs. a slow-replicating acute virus, we performed 16S rRNA gene amplicon sequencing of caecal and colonic contents from mice infected with two closely related LCMV isolates: Armstrong53b (ARM), which spreads more slowly and is cleared in a week, and clone13 (Cl13), which is fast-spreading and capable of persisting in

C57BL/6 mice (6, 24). Two independent repeats with uninfected, ARM- and Cl13-infected mice (10 mice/group) were performed at days 8 and 20 p.i. Sampling of caecal and colonic contents was chosen over stool pellets, as it allows detection of taxa abundant inside the large intestine, which may not necessarily be eliminated in stools (25, 26). Alpha-diversity determined by the Shannon diversity index, which combines richness and evenness (27), was selectively decreased upon Cl13 infection at day 8, but not at day 20 p.i. (Fig. 1A). We next identified specific differences in microbial composition by computing beta-diversity using the phylogenetic unweighted UniFrac metric or nonphylogenetic Jaccard and Bray–Curtis indexes followed by principal coordinates analysis (PCoA). Although ARM-infected and uninfected mice appeared to be significantly distant by permutational ANOVA (PERMANOVA) analysis with at least two of the aforementioned metrics on days 8 and 20 p.i. (SI Appendix, Fig. S1 A–C), there was no clear separation by any of the three main principal coordinates (PCs) at the two time points studied (Fig. 1B and SI Appendix, Fig. S1 D–F). On the other hand, the intestinal microbiome from day-8 Cl13-infected mice formed a prominent cluster by PC1 and/or 2 (Fig. 1B, Left and SI Appendix, Fig. S1 E and F, Left Top) which was significantly distant from both uninfected and ARM-infected mice (SI Appendix, Fig. S1 A–C). No separation was observed along PC3 (SI Appendix, Fig. S1 D–F, Left Bottom). Remarkably, despite sustained viral loads in circulation and intestinal tissues (28, 29), at day 20 p.i. the microbiome of Cl13-infected mice segregated closer (Fig. 1B and SI Appendix, Fig. S1 D–F, Right), albeit still significantly different (SI Appendix, Fig. S1 A–C), to the samples from uninfected or ARM-infected mice. Note that in all cases the PCoA clustering was consistent in different cages (SI Appendix, Fig. S1G) and could not be explained by reproducible differences in dispersion (SI Appendix, Fig. S1 A–C, PERMDISP).

Importantly, when analyzing bacterial phylum composition at day 8 p.i., we detected profound reduction of the Firmicutes-to-Bacteroidetes ratio (Fig. 1C and D), concomitant with increases in the relative abundance of phylum Verrucomicrobia over Firmicutes and Bacteroidetes in Cl13-infected vs. uninfected mice (Fig. 1C and E) that were specific for Cl13-infected mice. In contrast, alterations in the Firmicutes-to-Bacteroidetes ratio or phylum-level changes in Verrucomicrobia were not detected upon ARM infection (Fig. 1C–E) and were not maintained at day 20 after Cl13 infection (Fig. 1C–E). We next performed multinomial regression (MR) analysis with Songbird (30), with cutoffs at rank values of 1 and –1, to identify the most perturbed taxa at days 8 and 20 after the different infections. We restricted our analysis to taxa that were reproducibly perturbed in both independent experimental repeats. With these rigorous criteria, we defined biomarkers for each infection type and time point as taxa that were highly and reproducibly perturbed vs. uninfected controls processed in parallel. We identified eight biomarkers at day 8 after Cl13 infection, and two different ones at the same time point after ARM infection (Fig. 1F and Datasets S1 and S2). Dysbiosis in day-8 Cl13-infected mice was characterized by reductions in the relative abundance of *Lactobacillus* and *Turicibacter* as well as enrichment of *Bacteroides*, *Sutterella*, *Akkermansia*, and *Erysipelatoclostridium* (i.e., *Clostridium* within the *Erysipelotrichaceae* family), among others (Fig. 1F and Dataset S1). In contrast, ARM infection promoted increases of unclassified genera within the *Peptostreptococcaceae* family, while decreasing genera within the *Clostridiaceae* family (Fig. 1F and Dataset S2). By day 20 p.i., a total of five taxa were selectively perturbed by Cl13 infection while no genus was highly affected in ARM-infected mice (Fig. 1G and Datasets S3 and S4). This late dysbiosis in day-20 Cl13-infected mice included decreased relative abundance of *Turicibacter* and unclassified genera within the *Clostridiaceae* family concomitant with overrepresentation of unclassified genera within the *Erysipelotrichaceae* and *Ruminococcaceae* families, and *Clostridium* (*Clostridiaceae* family) (Fig. 1G and Dataset S3). Intriguingly, only *Turicibacter* was persistently altered in the same direction during both the early and the chronic

phase of CI13 infection (Fig. 1H). It should be noted that it is possible that the highly stringent criteria that we have chosen to identify the most reliable infection biomarkers have left out taxa that might still be biologically significant, such as *Roseburia*, which was reduced at days 8 and 20 p.i. in one experiment (rank day 8 p.i.  $-2.66$ ; rank day 20 p.i.  $-1.53$ ) (Datasets S1 and S3) but could not be validated in the second repeat, likely due to very low basal amounts of this taxon in uninfected controls from different cohorts (e.g.,  $0.29\% \pm 0.25$  in cohort 1;  $0.07\% \pm 0.12$  in cohort 2).

Overall, these data are the first defining specific intestinal microbiome perturbations occurring after infection with two closely related viral isolates that exhibit contrasting capability to spread and persist, revealing that: 1) infection with a fast-spreading persistent virus caused large-scale microbial dysbiosis that did not occur upon infection with a closely related slow-spreading acute virus; 2) the most dramatic microbiome alterations after chronic infection were uncoupled from sustained pathogen loads and, instead, occurred transiently during the early phase of the infection; 3) transient microbiome alterations early after infection with the fast-spreading persistent virus were characterized by reduced Firmicutes-to-Bacteroidetes ratios (e.g., increased *Bacteroides* as well as reduced *Lactobacillus* and *Turicibacter*) and increased Verrucomicrobia (i.e., *Akkermansia*); and 4) reductions in *Turicibacter* were sustained during the chronic phase of infection.

**CD8 T Cells Drove Great Part of the Intestinal Dysbiosis Identified after Infection with LCMV CI13.** Given that microbial dysbiosis coincided with peak CD8 T cell responses at day 8 p.i. (28), we next investigated the role of CD8 T cells in driving the microbiome changes uniquely identified after LCMV CI13 infection. For that, we performed two independent experiments shown in Fig. 2 and SI Appendix, Fig. S2, respectively, where we treated 10 CI13-infected mice per group with anti-CD8 or isotype control antibodies, followed by shotgun metagenomics sequencing of caecal and colonic contents at day 8 p.i. As expected, treatment with anti-CD8 antibody significantly reduced the number of total and virus-specific CD8 T cells (SI Appendix, Fig. S2A). Remarkably, CI13-infected mice treated with anti-CD8 depleting antibodies formed a distinct cluster via beta-diversity PCoA when compared to their isotype-treated counterparts (Fig. 2A and SI Appendix, Fig. S2B). This treatment also increased gut microbial alpha-diversity in one out of the two independent experiments (Fig. 2B and SI Appendix, Fig. S2C), which, as described above (Fig. 1A), was selectively reduced at day 8 after CI13 but not ARM infection. We also detected overrepresentation of Firmicutes upon CD8 T cell depletion (Fig. 2C and SI Appendix, Fig. S2D), which explained an elevation of the Firmicutes-to-Bacteroidetes ratio (Fig. 2D and SI Appendix, Fig. S2E) toward the value described above for uninfected and ARM-infected mice (Fig. 1D). As shown in Fig. 2E and SI Appendix, Fig. S2F, blue bars, and Dataset S5, subsequent MR analysis with Songbird and with rank cutoffs of 0.5 and  $-0.5$ , to include moderately to highly perturbed taxa, indicated that treatment with anti-CD8 antibodies reverted the changes of commensal species belonging to three of the most increased (i.e., *Bacteroides*, *Akkermansia*, and *Erysipelatoclostridium*) and two of the most decreased (i.e., *Lactobacillus* and *Turicibacter*) genera described above as biomarkers for day-8 CI13-infected mice (Fig. 1F). Overall, CD8 T cells modulated (in a moderate and/or high degree) the abundance of 63% of the biomarkers selectively altered upon CI13 infection (Figs. 1F and 2F) including *Turicibacter*, which was underrepresented at both days 8 and 20 after CI13 infection (Fig. 1H).

These data indicated that, despite their exhausted state (28, 31, 32), CD8 T cells are responsible for great part of the dysbiosis observed after infection with a fast-spreading persistent virus. Specifically, CD8 T cells were, at least partially, responsible for the transient reduction in Firmicutes-to-Bacteroidetes ratio

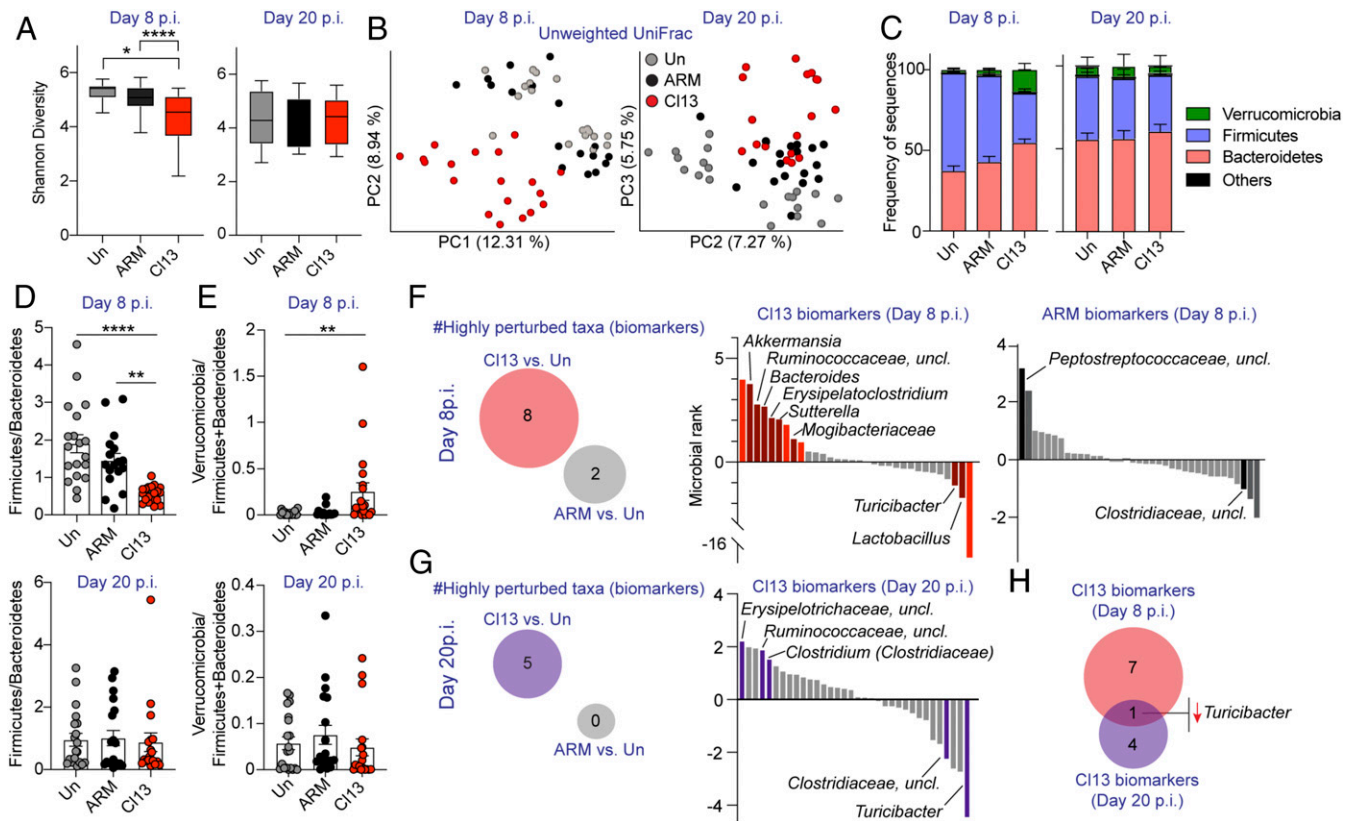
(i.e., enriching *Bacteroides* and *Erysipelatoclostridium* while reducing *Lactobacillus* and *Turicibacter*), as well as for the overrepresentation of *Akkermansia*. These findings situate CD8 T cells as key drivers of the microbial changes that take place early after infection with a virus capable of spreading quickly and/or establishing persistence.

**CD8-Driven Anorexia Is Associated with a Fasting-Related Microbiome Early after LCMV CI13 Infection.** We next sought to investigate the mechanisms via which CD8 T cells promoted transient (and profound) dysbiosis after infection with the fast-spreading persistent LCMV CI13 isolate. We considered that, among the day-8 CI13 taxa biomarkers altered in a CD8 T cell-dependent manner, the phylum Verrucomicrobia (i.e., *Akkermansia* genus), has been previously reported to increase in anorexic human patients (33) as well as in calorie-restricted rodents, some fish, and snakes (34). We, therefore, investigated potential changes in eating behavior by comparing food consumption in ARM- vs. CI13-infected mice. We observed that CI13, but not ARM infection, induced profound anorexia spanning from day 6 through 9 p.i. (Fig. 3A), that was accompanied by  $18\% \pm 3.5$  weight loss at day 9 p.i. (SI Appendix, Fig. S3A). Importantly, continuous CD8 T cell depletion completely restored food consumption (Fig. 3B) and attenuated weight loss (SI Appendix, Fig. S3B), which provided causal evidence that CD8 T cells can drive anorexic behavior. Intriguingly, efficient CD4 T cell depletion (SI Appendix, Fig. S3C) or IFN-I receptor (IFNAR) blockade did not prevent the induction of anorexia, even though IFNAR blockade (but not CD4 T cell depletion) consistently ameliorated its magnitude (SI Appendix, Fig. S3D and E) and attenuated weight loss (SI Appendix, Fig. S3F and G).

To investigate whether such anorexic behavior may explain some of the transient changes in the intestinal microbiome of CI13-infected mice, we next compared the CI13-driven microbiome to recently proposed microbiome biomarkers of colon carcinoma-bearing mice, which suffer from anorexia (35, 36). We observed that three out of the eight CI13-infection-specific biomarkers at day 8 p.i., as defined in Fig. 1F, overlapped with those from colon carcinoma, including reductions in *Lactobacillus* as well as enrichment in *Bacteroides* and *Akkermansia* (Fig. 3C red vs. blue circles). Of note, perturbation of these three taxa was reverted when anorexia was corrected, via CD8 T cell depletion, in CI13-infected mice (Figs. 2E and F and 3B). To elucidate which of these taxa biomarkers were common to anorexia, independent of inflammation, we applied Songbird MR analysis using rank cutoff values of 1 and  $-1$  on publicly available 16S rRNA gene amplicon data from uninfected mice under a caloric restricted diet (37) and compared the identified fasting biomarkers (Dataset S6) with the CI13-infection-driven microbiome. We observed that two, *Sutterella* and *Akkermansia*, of the eight microbial alterations detected during the early phase of CI13 infection were commonly perturbed, in the same direction, during calorie restriction (Fig. 3C, red vs. yellow circles) and *Akkermansia* was overrepresented in the three juxtaposed conditions (Fig. 3C).

These data indicated that infection with a fast-spreading, and potentially persistent virus induces a profound, CD8 T cell-dependent anorexic behavior. Our results also demonstrated that a significant fraction of the taxa uniquely altered during the anorexic phase, including overrepresentation of *Bacteroides* and *Akkermansia* as well as reductions in *Lactobacillus*, were commonly perturbed in noninfectious fasting conditions and were no longer altered when anorexia was reverted, via CD8 T cell depletion during infection. Thus, these findings situated anorexia as one possible mechanism via which CD8 T cell responses may induce dysbiosis after viral infection.





**Fig. 1.** LCMV CI13 infection induced intestinal dysbiosis that was mostly transient, uncoupled from viral loads, and characterized by reduced Firmicutes-to-Bacteroidetes ratio and increased Verrucomicrobia. See also *SI Appendix, Fig. S1* and *Datasets S1–S4*. C57BL/6 mice were infected with LCMV ARM, CI13, or left uninfected (Un) and 16S rRNA gene amplicon sequencing was performed on colonic and caecal contents from days 8 and 20 (p.i.). (A) Alpha-diversity by the Shannon diversity index at indicated time points. (B) Beta-diversity PCoA with unweighted UniFrac distance at indicated time points. PC1 was omitted for PCoA from the day 20 p.i. time point as it captured the basal differences of the cohorts used in the two experiments, rather than infection type. (C) Frequency of sequences at the phylum level at indicated time points. (D and E) Frequency of phylum Firmicutes divided by Bacteroidetes (D) or Verrucomicrobia divided by Firmicutes and Bacteroidetes (E) for each individual mouse at indicated time points. (F and G) Songbird MR analysis of genera in mice infected with ARM or CI13 vs. Un on day 8 p.i. (F) or day 20 p.i. (G). Taxa with microbial ranks higher than 1 or lower than -1 in two independent repeats are considered highly perturbed (i.e., biomarkers). (Left) Total number of genera highly perturbed by CI13 or ARM infections. (Right) The x axes correspond to individual taxa, taxa highly perturbed are indicated by text and colored in red (F) or violet (G) for CI13 infection and black (F) for ARM infection. (H) Venn diagram overlapping biomarkers identified in F and G for day 8 (red) and day 20 (violet) after CI13 infection. (A, C, and D) Graphs show averages plus min and max (A) or  $\pm$  SEM (C–E). (A–E) Data are represented by pooling  $n = 8$  to 10 mice/group from two independent experiments. (F–H) Data are representative of two independent experimental repeats. (A) Pairwise Kruskal–Wallis with false discovery rate (FDR) (Benjamini–Hochberg) correction. (D and E) Kruskal–Wallis with Dunn’s correction; \* $p$ -val < 0.05, \*\*<0.01, \*\*\*\*<0.0001.

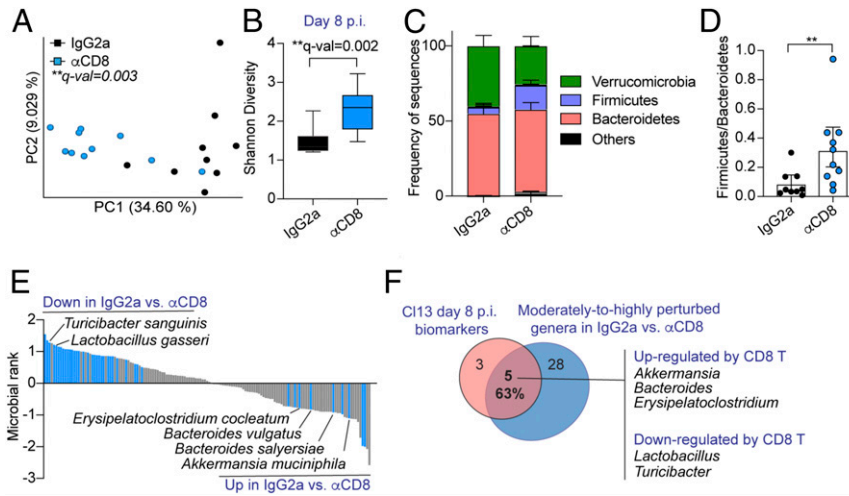
**A. muciniphila** blooms in a CD8 T Cell-Dependent Manner after LCMV CI13 Infection and Is Enriched upon Lack of Food Consumption. Because the *Akkermansia* genus emerged as a common fasting biomarker in the inflammatory and noninflammatory conditions that we compared in our analysis (Fig. 3C) we selected it for further validation and followup studies. Notably, within the genus *Akkermansia*, the commensal *A. muciniphila* is the only species that colonizes the human gut (38). We therefore evaluated whether *A. muciniphila* was uniquely increased in CI13- vs. ARM-infected mice. Quantification of *A. muciniphila* genomes by qPCR in colon and caecal contents from CI13-infected vs. both uninfected and ARM-infected mice demonstrated its selective enrichment upon CI13 infection (Fig. 3D). We next evaluated the localization of *A. muciniphila* by performing fluorescence in situ hybridization (FISH) with an *A. muciniphila*-specific probe. This analysis further supported overrepresentations of *A. muciniphila* in CI13-infected vs. ARM-infected and uninfected mice and mapped *A. muciniphila* to colon and caecal compartments (Fig. 3E and *SI Appendix, Fig. S4*).

Finally, we sought to investigate a causal link between the blooming of *A. muciniphila* and the CD8 T cell-induced anorexia

after CI13 infection. For that, we first quantified *A. muciniphila* genomes in colon and caecal contents from uninfected mice fed ad libitum or starved for 24 h. We observed that such a short interruption in food consumption alone, without viral infection, significantly increased the amount of *A. muciniphila* genomes by  $\sim 20$ -fold (Fig. 3F). Moreover, reversion of the anorexic behavior via CD8 T cell depletion in CI13-infected mice (Fig. 3B) was accompanied by a significant reduction in intestinal *A. muciniphila* genomes (Fig. 3G).

Together, these results demonstrated that an absolute increase of *A. muciniphila* is part of the profound dysbiosis that occurred downstream of CD8 T cell responses during the early phase of infection with a fast-spreading and persistent virus, and causally linked the lack of food consumption with *A. muciniphila* blooming in the intestinal compartment. Importantly, these findings further support a role for anorexia as one mechanism via which CD8 T cells may promote microbial dysbiosis, including enrichment of the *Akkermansia* genus, after viral infection.

**Oral Administration of *A. muciniphila* Attenuated Antiviral CD8 T Cell Responses after LCMV Infection.** To investigate the potential bidirectional modulation of *A. muciniphila* and CD8 T cells, we



**Fig. 2.** CD8 T cells drove great part of the intestinal dysbiosis identified after LCMV Cl13 infection. See also *SI Appendix, Fig. S2* and *Dataset S5*. C57BL/6 mice were infected with LCMV Cl13, injected i.p. with isotype control (IgG2a) or CD8-depleting antibodies ( $\alpha$ CD8) followed by shotgun metagenomics sequencing of colonic and caecal contents on day 8 p.i. (A) Beta-diversity PCoA with Jaccard distance. (B) Alpha-diversity by the Shannon diversity index. (C) Frequency of sequences at the phylum level. (D) Frequency of phylum Firmicutes over Bacteroidetes for each mouse. (E) Songbird MR analysis of species in IgG2a- vs.  $\alpha$ CD8-treated Cl13-infected mice. Taxa with rank cutoff values of  $-0.5$  and  $0.5$  that were perturbed in the same direction in two independent experimental repeats are highlighted in blue and indicated by name. (F) Overlap between Cl13-specific biomarkers at day 8 p.i. (as defined in Fig. 1F) and altered genera upon CD8 T cell depletion as defined in E. (B–D) Averages and min or max (B) or  $\pm$  SEM (C and D). (A–F) Representative data from one independent experiment with  $n = 9$  to 10 mice/group. (A) PERMANOVA with 999 permutations, (B) Kruskal–Wallis test, (D) Mann–Whitney test; \* $p$  or  $q$ -val  $< 0.05$ , \*\* $< 0.01$ .

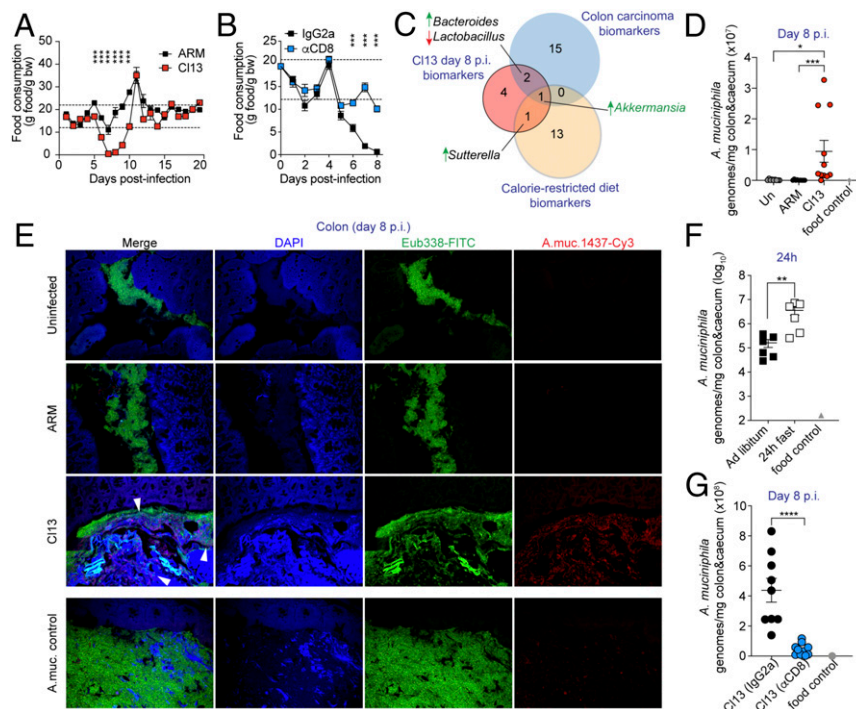
experimentally induced *A. muciniphila* enrichment in ARM-infected mice, which neither become anorexic nor exhibit intestinal blooms of this commensal (Fig. 3A, D, and E). We chose to inoculate ARM-infected mice with live *A. muciniphila* or vehicle control from days 3.5 to 7.5 p.i. to maintain comparable innate immune responses and CD8 T cell priming between the two groups. We next evaluated the impact on CD8 T cell responses within the small intestinal intraepithelial lymphocyte (IEL) compartment, which is in closest proximity to the intragastrically administered bacteria, and spleen, as a representative distal lymphoid organ. Analysis of LCMV-specific CD8 T cell responses from IEL demonstrated similar percentages and numbers (*SI Appendix, Fig. S5A*) as well as equivalent expression of the cytotoxic molecule GrzB (*SI Appendix, Fig. S5B*) and frequencies of killer cell lectin like receptor G1 (KLRG1) positive or CD103<sup>+</sup> cells (*SI Appendix, Fig. S5C*), which mark cells with effector and tissue-resident phenotypes, respectively (39–41). We also observed equivalent accumulation of splenic LCMV-specific CD8 T cell populations (*SI Appendix, Fig. S6A*) as well as their cytokine production (*SI Appendix, Fig. S6B*) and proportions of short-lived, memory precursor, and early effector cells (SLEC, MPEC, and EEC) (41–43), in both groups (*SI Appendix, Fig. S6C*). Strikingly, however, we observed a significant reduction in GrzB levels among splenic CD8 T cells specific for the immunodominant LCMV epitope GP<sub>33–41</sub> (D<sup>b</sup>/GP<sub>33–41</sub><sup>+</sup>), and to a lesser extent among CD8 T cells specific for NP<sub>396–404</sub>, in ARM-infected mice inoculated with *A. muciniphila* vs. control mice (Fig. 4A). We also found reduced levels of the transcription factor (TF) T-BET among D<sup>b</sup>/GP<sub>33–41</sub><sup>+</sup> CD8 T cells (Fig. 4B), which is known to promote GrzB expression and CD8 T cell effector fate (41, 44). Given that trimethylation of lysine 27 residue on histone 3 (H3K27me3) has been shown to reinforce effector CD8 T cell differentiation (45, 46) we next evaluated the potential effect of *A. muciniphila* on CD8 T cell H3K27me3 marks. As shown in Fig. 4C, *A. muciniphila*-inoculated mice exhibited reduced H3K27me3 in virus-specific CD8 T cells compared to control mice. Importantly, *A. muciniphila* inoculation did not increase splenic Treg accumulation (*SI Appendix, Fig. S6D*). Of note, reduced GrzB and T-BET were

also observed in splenic CD8 T cells after Cl13-infected mice were inoculated with *A. muciniphila* (Fig. 4D and E), indicating that the effects of this commensal on CD8 T cell responses were conserved in the context of functional (acute infection) or exhausted (chronic infection) CD8 T cells. Finally, although *A. muciniphila* inoculation into ARM- or Cl13-infected mice did not alter weight loss (*SI Appendix, Fig. S7A and B*), eating behavior (*SI Appendix, Fig. S7C and D*), or the amount of infectious virus in liver, lung, and/or blood (*SI Appendix, Fig. S7E–I*), it did cause a significant delay in the clearance of LCMV ARM genomes from the livers (Fig. 4F).

Together, these data indicated that *A. muciniphila* inoculation attenuated splenic, but not small intestinal, CD8 T cell responses, specifically diminishing expression of GrzB and T-BET as well as reducing H3K27me3 marks. Such CD8 T cell suppression seemed to be accompanied with a delayed clearance of the acute infection in mice receiving *A. muciniphila*. Interpretation of these results should take into consideration that, consistent with a previous report that used a similar dose of this bacterium (47), qPCR in caecal and colonic compartments did not detect significant enrichment of *A. muciniphila* after its oral administration (*SI Appendix, Fig. S8*). Such low levels of *A. muciniphila* in the experimentally treated mice raises the possibility that the phenotypes we observed after inoculation of this commensal into infected mice may represent an underestimation of the effects caused by the profound *A. muciniphila* blooming that naturally arises after Cl13 infection.

## Discussion

Host adaptations to fast spreading and/or persistent pathogen replication are often required to ensure host survival in various host species and include mechanisms such as the attenuation of both innate and adaptive arms of the immune system (2–4). Here, we found that infection with a fast-spreading persistent virus induced profound microbiome alterations, which were different from the ones induced by a closely related acute virus that spreads at a slower rate. Interestingly, most microbiome alterations induced by the fast-spreading persistent virus were



**Fig. 3.** CD8 T cell-driven anorexia is associated with a fasting-related microbiome, including natural blooming of *A. muciniphila*, early after LCMV C13 infection. See also *SI Appendix, Figs. S3 and S4* and *Dataset S6*. C57BL/6 mice were infected with LCMV ARM, C13, or left uninfected (Un) (A, D, and E) or infected with LCMV C13 and injected i.p. with isotype control (IgG2a) or CD8-depleting antibodies ( $\alpha$ CD8) (B and G). (A and B) Grams (g) of food consumed per gram of body weight (bw) over time in indicated groups. Dotted lines mark the healthy range of food consumption determined in uninfected mice as described in *SI Appendix, Materials and Methods*. (C) Taxa overlap of C13 d 8 p.i. biomarkers defined as in Fig. 1E (red), mouse colon carcinoma biomarkers defined by linear discriminant analysis effect size in ref. 80 of mice s.c. transplanted with colon cancer cells (blue), as reported in ref. 35 and caloric restriction biomarkers defined after MR analysis with Songbird of the stools of mice after 3 wk on a calorie-restricted diet, from a previous study (37) (yellow). (D, F, and G) Absolute *A. muciniphila* genomes in colonic and caecal contents were quantified by qPCR in uninfected mice or mice infected with LCMV ARM or C13 at day 8 p.i. (D), in uninfected mice fed ad libitum, or fasted for 24 h (F) and in C13-infected mice treated with CD8-depleting or isotype control antibodies (G). DNA from a food pellet was used as a negative control (food control). (E) FISH images with *Eubacteria* (Eub338, green) or *A. muciniphila* (A.muc.1437, red)-specific probes on colon sections from Un, ARM-, and C13-infected mice at day 8 p.i. One uninfected mouse was intraorally (i.o.) inoculated with  $\sim 1.2 \times 10^8$  cfu of live *A. muciniphila* 24 h prior to necropsy and used as positive control (A.muc. control). (A, B, D, F, and G) averages  $\pm$  SEM. Data are representative of one out of three (A and B), two (E and G), or pooled from two (F) or three (D) independent experiments with  $n = 3$  to 10 mice/group. (A and B) Unpaired two-tailed Student's *t* test per time point, (F and G) Mann-Whitney test, (D) one-way ANOVA with Tukey's correction; \**p*-val < 0.05, \*\*<0.01, \*\*\*<0.001, \*\*\*\*<0.0001.

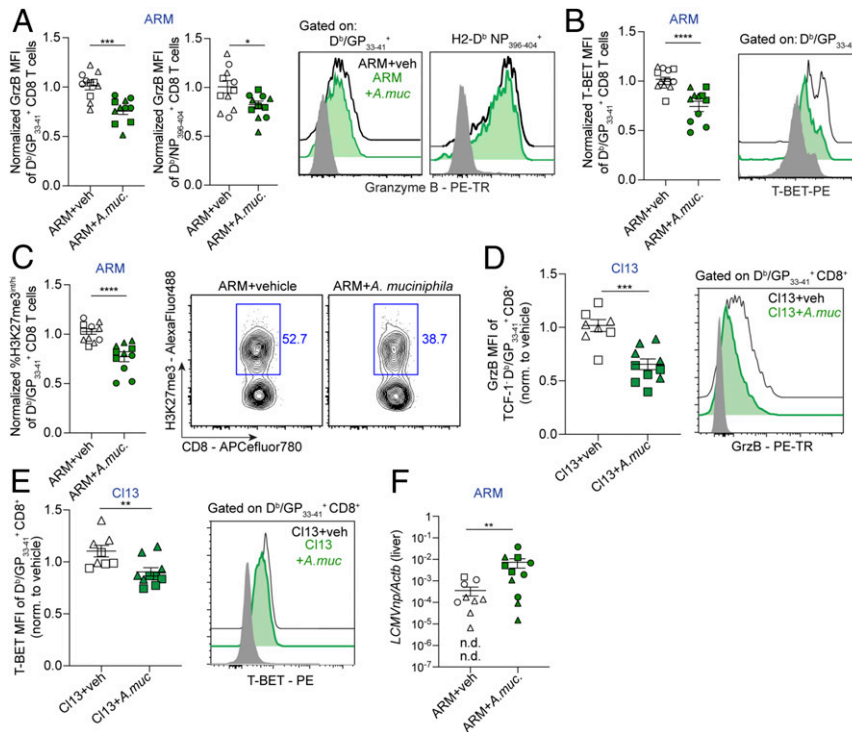
restricted to the early phase of infection and did not associate with continuous viral replication into the chronic phase. Instead, such microbiome dysbiosis was driven by CD8 T cell responses and partially associated with CD8 T cell-induced anorexia. Remarkably, among the most enriched taxa detected early after infection with the fast-spreading persistent virus, we identified the fasting-associated commensal *A. muciniphila*, which bloomed in a CD8 T cell-dependent manner and was able to suppress selected aspects of distal CD8 T cell responses. Our results demonstrate that the endogenous intestinal microbiome of an infected host differentially changes after infection with closely related viruses that exhibit distinct capacity to spread and persist and suggest that infection-induced changes in eating behavior and microbiome could act as both regulators and targets of CD8 T cell responses.

It is remarkable that the intestinal microbiome was more profoundly and transiently altered during the early vs. late phase of persistent LCMV infection, despite comparable viral replication at both time periods. Furthermore, our data demonstrated that such early dysbiosis was caused, in great part, by CD8 T cell responses. Importantly, while the intestinal microbiome has been previously shown to modulate CD8 T cell responses (48–51) a role for CD8 T cells in modulating gut microbiome composition has never been reported. In this regard, the transitory *Verrucomicrobia* and *Akkermansia* overrepresentation that we observed on day 8 (but

not day 20) p.i. and its connection to fasting across several species (34) helped us identify a profound anorexic behavior that was restricted to the early phase of LCMV C13 infection. This result is in agreement with an independent study that showed anorexia in the same LCMV model system (52). Here we validated these findings and expanded them by demonstrating that the aforementioned anorexia observed early after infection with the fast-spreading LCMV isolate is dependent on CD8 T cells. Given that anorexia has been observed at time points when strong CD8 T cell responses are detected after other chronic and acute infections (53–57), it is tempting to speculate that CD8 T cell-induced anorexia may represent a conserved response to tissue damage or excessive inflammation upon infection with pathogens that overwhelmingly replicate in vital organs and/or are still present at high titers when CD8 T cell responses peak.

Consistent with the aforementioned anorexic behavior in LCMV infection, we observed that a significant fraction of the microbiome changes were commonly detected in other inflammatory and/or noninflammatory fasting conditions. Among them, we demonstrated that the species *A. muciniphila* naturally bloomed in the cecum and colon during the early phase of infection with the LCMV C13 isolate, it was rapidly boosted in response to lack of food consumption, and was significantly reduced when anorexia was reverted by CD8 T cell depletion. Given that fiber-deprived diets promote blooms of *A. muciniphila* (58), it





**Fig. 4.** Oral administration of *A. muciniphila* into LCMV ARM- or CI13-infected mice attenuated selected CD8 T cell effector features. See also *SI Appendix, Figs. S5–S8*. C57BL/6 mice were infected with LCMV ARM (A–C and F) or LCMV CI13 (D and E) and inoculated i.o. with vehicle (veh) or  $\sim 1.2 \times 10^8$  cfu of live *A. muciniphila* (*A. muc.*) daily from days 3.5 to 7.5 p.i. All analyses were done at day 8 p.i. (A–E) Mean fluorescence intensity (MFI) for Granzyme B (GrzB) (A and D) and T-BET (B and E) among gated LCMV tetramer  $D^b/GP_{33-41}^+ CD8^+$  cells from the spleen. (C) Frequency of H3K27me3<sup>int/hi</sup> cells among  $D^b/GP_{33-41}^+$  or  $D^b/NP_{396-404}$  tetramer<sup>+</sup>  $CD8^+$  in the spleen, as indicated. (A–E) Values are normalized to the average of the vehicle control group. (A–E) Representative FACS histograms are shown for the indicated groups; gray histogram was gated on  $CD8^+$  from Un mice. (F) Liver levels of LCMVnp normalized to *Actb*. (A–F) Pooled data from three (A–C and F) or two (D and E) experiments with  $n = 3$  to 5 mice/group. Individual experiments are indicated with different shapes (i.e., circles, squares, triangles). (A–F) Averages  $\pm$  SEM. (A–F) Unpaired two-tailed Student's *t* test. Individually significant differences were detected in three out of three (B and C), two out of three (A, for  $D^b/GP_{33-41}$ ), two out of two (D) or one out of two (E) independent experiments. Even when not reaching statistical significance, individual experiments showed a consistent trend that, in all cases, reached significance after pooling data from independent repeats. For A ( $D^b/NP_{396-404}$ ) and F, differences only reached statistical significance after pooling independent experimental repeats; \**p*-val < 0.05, \*\*<0.01, \*\*\*<0.001, \*\*\*\*<0.0001.

is possible that the lack of dietary fiber intake early after LCMV CI13 infection may have provided a niche for the outgrowth of this bacterium. Regardless, our observations linked *A. muciniphila* blooming with CD8 T cell-driven anorexia and supported the conclusion that anorexia is one means via which CD8 T cells induce intestinal dysbiosis after chronic infection. It should be noted, however, that not all taxa modulated by CD8 T cells during LCMV CI13 infection were commonly altered in the noninfectious fasting conditions that we analyzed here, suggesting the existence of alternative, anorexia-independent mechanisms employed by CD8 T cells to modulate gut microbial composition. On the other hand, the phylum Verrucomicrobia is also augmented after infection with influenza virus (59), which induces anorexia with a similar kinetic as LCMV CI13 (60), suggesting that *A. muciniphila* and possibly other fasting-associated commensals may bloom, perhaps also in a CD8 T cell-dependent manner, during some acute infections.

While it was previously demonstrated that the intestinal microbiome as a whole promotes preinfection, tonic, expression of genes related to antiviral immunity in macrophages, and enhances resistance to a subsequent chronic infection (9), the potential impact of the changes in specific commensal species that are induced after a chronic infection has been initiated remained unknown. In this regard, we found that enrichment of *A. muciniphila* via oral administration into specific pathogen-free (SPF) LCMV-infected mice (that had unmanipulated microbial communities) suppressed selected effector features (i.e., GrzB,

T-BET, and/or H3K27me3) in virus-specific CD8 T cells and appeared to delay viral control in the liver. These observations were particularly unexpected, given the beneficial effects that *A. muciniphila* has been ascribed during checkpoint blockade therapy (61). We speculate that the differential microbial communities into which *A. muciniphila* is introduced may account for some of these discrepancies, as individual bacterial species are heavily influenced by the complex microbial environments surrounding them (62). Alternatively, given that different CD8 T cell subsets are present at early vs. late time points after chronic infections (63, 64) and in tumors (65, 66), it is possible that the effect of *A. muciniphila* on CD8 T cell responses may vary depending on the time of administration. Despite that, the effects we observed in virus-specific CD8 T cells upon early inoculation of *A. muciniphila*, were consistent in the context of LCMV infections with any of the two viral isolates studied, and were particularly impressive in the light of a previous report where modulation of CD8 T cell responses was only achieved after combined administration of 11 different taxa (50). Thus, our data support the possibility that the natural enrichment of *A. muciniphila* that we uncovered in the early phase after infection with a fast-spreading virus may contribute to the attenuation of the initial virus-specific CD8 T cell responses, most likely in conjunction, and possibly in a redundant fashion, with other fasting-associated commensals and with previously described T cell-inhibitory mechanisms (3, 4).

Interestingly, we observed that *A. muciniphila* attenuated distal CD8 T cells in the spleen but did not seem to have an effect on IEL CD8 T cells from the small intestine, despite their closer proximity to intestinal bacteria. Even though we cannot rule out effects in the large intestine, this is particularly unexpected since *A. muciniphila* has been recently shown to induce bacteria-specific immune responses in the small intestine (67). Given that *A. muciniphila* is known to strongly influence whole-body metabolism (47, 68, 69), it is possible that it suppresses CD8 T cell effector features by changing the nutrients available to fuel ensuing immune responses, which in turn can affect functional capacity and epigenetics in a cell-type- or tissue-specific manner (70). Indeed, nutrient requirements may vary among tissues, providing a possible explanation for the differential effects of *A. muciniphila* in spleen vs. small intestinal IEL CD8 T cells. Regardless of the mechanism underlying *A. muciniphila* effects in distal vs. local tissues, our findings describe a commensal regulating distal, virus-specific CD8 T cell responses, without causing similar phenotypes in the small intestine IEL, broadening our current understanding of microbiome-mediated immune system regulation.

In conclusion, by revealing CD8 T cell-dependent anorexia, CD8 T cell-mediated blooming of *A. muciniphila* and CD8 T cell attenuation by this commensal, our study suggests a potential way of CD8 T cell autoregulation that involves changes in host behavior and microbiome. In this context, we propose a model in which the blooming of *A. muciniphila* that we described here may be part of a whole-organism negative feedback loop initiated by CD8 T cell-driven changes in eating behavior, that can lead to microbiome alterations, which may, in turn, contribute to the attenuation of CD8 T cell responses. Suppression of CD8 T cell responses through previously described inhibitory mechanisms (3, 7) along with the contribution of the aforementioned negative feedback loop may explain the recovery from the CD8 T cell-dependent anorexic behavior alongside with the mostly transient nature of the CD8 T cell-dependent dysbiosis, as the host transitions from the acute into the chronic phase of a persistent infection. Last but not least, it is important to emphasize that there is great interest in *A. muciniphila* as a potential probiotic (71–73), that is reflected by recently finalized (68) and ongoing clinical trials (NCT02086110; NCT03547440; NCT03749291; NCT04038619; NCT04058392). Our work unveils additional effects of this potential new-generation probiotic in regard to its capacity to attenuate ensuing CD8 T cell responses. As non-FDA regulated probiotics are being consumed by 3.9 million individuals in the United States alone (74) increased understanding of context-dependent consequences of probiotic administration is needed to maximize their beneficial properties while preventing undesired side effects.

## Materials and Methods

**Mice, Infections, and Antibody Treatments.** All studies were performed with 6- to 10-wk-old female C57BL/6 mice bred at The Jackson Laboratory. For microbiome studies, purchased mice were randomly distributed in cages containing five mice each and housed in that way for 3 wk before the day of infection per guidelines of the Earth Microbiome Project (75). Mice were infected i.v. with  $2 \times 10^6$  plaque forming units (PFU) of LCMV ARM or CI13. Viral stocks were grown, identified, and quantified as reported previously in ref. 76. Viral loads were determined by standard plaque assay (76) of serum or tissue homogenates. In vivo CD8 and CD4 T cell depletion as well as IFNAR blockade studies were performed as specified in *SI Appendix*. The detailed procedure for food consumption measurements, for the establishment of a “healthy range” of daily food consumption and for acute starvation experiments can be found in *SI Appendix*. Mice were maintained in a closed breeding facility at the University of California San Diego (UCSD), where mice were housed in ventilated cages containing HEPA filters. Mouse handling conformed to the requirements of the National Institutes of Health and the Institutional Animal Care and Use Guidelines of UCSD.

**Lymphocyte Isolation from Spleen and Small Intestinal IEL.** Single-cell suspensions from the spleen and the small intestinal IEL were obtained as detailed in *SI Appendix*.

**Quantitative PCR.** To quantify *A. muciniphila* genomes, previously frozen colonic and caecal contents were thawed, weighed, and DNA was extracted with DNeasy PowerSoil Kit (Qiagen) by following the manufacturer's protocol. qPCR from samples as well as from an *A. muciniphila* standard was performed as detailed in *SI Appendix*. For quantification of transcripts in liver, tissues were processed and the expression of LCMV nucleoprotein relative to *Actb* was quantified as detailed in *SI Appendix*.

**Flow Cytometry.** For surface staining of splenocytes and IEL, cells were first stained with a fixable viability dye followed by staining with MHC-I tetramers as detailed in *SI Appendix*. For intracellular staining after ex vivo peptide restimulation, cells were fixed in 1% paraformaldehyde (PFA) and stained with antibodies in 1× perm/wash buffer (Thermo Scientific) for 30 min at 4 °C. Alternatively, for intranuclear staining, cells were fixed with the Foxp3 Transcription Factor Staining Buffer Set Kit (Thermo Scientific) per vendor's recommendation and stained with antibodies in 1× perm/wash buffer for 1 h at room temperature. Antibodies used in this study can be found in *SI Appendix*. Cells were acquired using a Digital LSR II flow cytometer (Becton Dickinson) or a ZE5 Cell Analyzer (Bio-Rad). Flow cytometric data were analyzed with FlowJo software v9.9.6 and v10.

**Ex Vivo T Cell Stimulation.** Splenocytes were cultured in the presence of Brefeldin A (1 µg/mL; Sigma) and 1 µg/mL of the MHC class-I-restricted LCMV NP<sub>396–404</sub> or GP<sub>33–41</sub> peptides (all >99% pure; Synpep) and stained with surface and intracellular antibodies, as detailed in *SI Appendix*.

**Culture and Inoculation of *A. muciniphila*.** *A. muciniphila* (ATCC BAA-835) was purchased from ATCC. A detailed procedure on how to prepare glycerol and mucin stocks as well as anaerobic brain heart infusion (BHI) media supplemented with mucin (BHI+mucin) can be found in *SI Appendix*. To initiate *A. muciniphila* cultures for oral inoculation, glycerol stocks were brought into the anaerobic chamber on dry ice, scraped with a sterile tip that was then placed in 3 to 5 mL of BHI+mucin media in 15-mL stopper cap falcon tubes and cultured at 37 °C in the anaerobic chamber for 3 to 4 d. Control tips with no *A. muciniphila* and media alone were cultured in parallel as a control for contamination and to be inoculated as vehicle control, respectively. Initially, it was determined that after 3 to 4 d of *A. muciniphila* glycerol stock culture in these conditions, the optical density at 600 nm was 0.5 to 0.6, which after plating at serial dilutions corresponded to  $5.5$  to  $6 \times 10^8$  colony forming units (cfu)/mL 200 µL of these cultures (i.e.,  $\sim 1.2 \times 10^8$  cfu) or vehicle control were inoculated per mouse at indicated time points. Note that very similar amounts of bacteria per dose have been used previously ref. 47. *A. muciniphila* cultures were routinely plated in BHI+mucin media and 1% agar to confirm the homogeneity of the culture and to rule out potential contamination.

**Bacterial FISH.** Caecal and colonic tissue samples from respective experimental groups were harvested and fixed in Carnoy's fixative (60% ethanol, 30% chloroform, 10% glacial acetic acid) and processed further as previously described in ref. 77. Tissue sections (5 µM) were deparaffinized followed by hybridization and staining, as specified in *SI Appendix*. Samples were viewed and imaged on an Olympus IX81 inverted microscope in combination with a FV1000 confocal laser scanning system.

**Library Generation and Sequencing for 16S rRNA and Shotgun Metagenomics Studies.** A detailed description of the sample collection and the DNA extraction procedures for 16S rRNA V4 amplicon sequencing and shotgun metagenomics sequencing can be found in *SI Appendix*. Sequencing was done following standard protocols from the Earth Microbiome Project (78, 79). Extracted DNA was amplified by using barcoded primers. Each sample was PCR amplified in triplicate and V4 pair-end sequencing or whole-genome sequencing using a miniaturized version of the KAPA HyperPlus kit was performed using Illumina MiSeq or HiSeq.

**16S rRNA Gene Amplicon Data Analysis.** Preprocessing and taxonomy assignment for our 16S rRNA raw data were done as detailed in *SI Appendix*. Raw 16S rRNA sequencing data from the stools of mice fed a calorie-restricted diet for 3 wk (37) was obtained from National Center for Biotechnology Information (NCBI) Short Read Archive (SRA: PRJNA480387), uploaded to Qiita, and processed as described in *SI Appendix*. We calculated alpha-diversity,



beta-diversity, principal coordinates analysis, permutational ANOVA, and differential dispersion as detailed in *SI Appendix*. To identify differentially abundant genera among groups in our 16S rRNA sequencing data as well as in caloric-restriction data (37), we used Songbird multinomial regression analysis (30), as detailed in *SI Appendix*.

**Shotgun Metagenomic Data Analysis.** Preprocessing of these data were done as detailed in *SI Appendix*. A table in .biom format with taxonomic predictions at the species level was then rarefied to a depth of 200,000 or 450,000. The detailed procedure to compute alpha-diversity, beta-diversity, principal coordinates analysis, and permutational ANOVA can be found in *SI Appendix*. To identify differentially abundant species between groups, we collapsed our rarefied .biom tables to the species level and used Songbird multinomial regression analysis, as specified in *SI Appendix*.

**Statistical Analysis.** Unpaired two-tailed Student's *t* test was used to compare two groups. If variances were not equal by *F*-test, data were tested using the nonparametric Mann-Whitney *U* test. Significant differences among more

than two groups were determined based on one-way ANOVA with Tukey's multiple comparison correction or, in the case of unequal variances, non-parametric Kruskal-Wallis test with Dunn's multiple comparison correction. Statistical tests were performed using GraphPad Prism v8.

**Data Availability.** All 16S rRNA gene amplicon and shotgun metagenomics sequencing data are publicly available on the European Nucleotide Archive (<https://www.ebi.ac.uk/ena/browser/home>, accession number ERP123227) and on Qiita (<https://qiita.ucsd.edu>, study ID 11043).

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