Modeling the Role of Peroxisome Proliferator-Activated Receptor $\gamma$ and MicroRNA-146 in Mucosal Immune Responses to Clostridium difficile

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Abstract

Clostridium difficile is an anaerobic bacterium that has re-emerged as a facultative pathogen and can cause nosocomial diarrhea, colitis or even death. Peroxisome proliferator-activated receptor (PPAR) $\gamma$ has been implicated in the prevention of inflammation in autoimmune and infectious diseases; however, its role in the immunoregulatory mechanisms modulating host responses to C. difficile and its toxins remains largely unknown. To characterize the role of PPAR$\gamma$ in C. difficile-associated disease (CDAD), immunity and gut pathology, we used a mouse model of C. difficile infection in wild-type and T cell-specific PPAR$\gamma$ null mice. The loss of PPAR$\gamma$ in T cells increased disease activity and colonic inflammatory lesions following C. difficile infection. Colonic expression of IL-17 was upregulated and IL-10 downregulated in colons of T cell-specific PPAR$\gamma$ null mice. Also, both the loss of PPAR$\gamma$ in T cells and C. difficile infection favored Th17 responses in spleen and colonic lamina propria of mice with CDAD. MicroRNA (miRNA)-sequencing analysis and RT-PCR validation indicated that miR-146b was significantly overexpressed and nuclear receptor co-activator 4 (NCOA4) suppressed in colons of C. difficile-infected mice. We next developed a computational model that predicts the upregulation of miR-146b, downregulation of the PPAR$\gamma$ co-activator NCOA4, and PPAR$\gamma$ leading to upregulation of IL-17. Oral treatment of C. difficile-infected mice with the PPAR$\gamma$ agonist pioglitazone ameliorated colitis and suppressed pro-inflammatory gene expression. In conclusion, our data indicates that miRNA-146b and PPAR$\gamma$ activation may be implicated in the regulation of Th17 responses and colitis in C. difficile-infected mice.

Introduction

Clostridium difficile typically is a harmless environmental spore-forming gram-positive anaerobic bacterium [1,2], but it has recently re-emerged as a significant enteric pathogen implicated in nosocomial diarrhea, colitis and even death, particularly after antibiotic treatment. C. difficile grows in the intestine of individuals with altered commensal microflora [3,4] due to treatment with antimicrobials, immunosuppressants, cytostatic agents or proton pump inhibitors [5]. An increase in both incidence and severity of C. difficile-associated disease (CDAD) has been reported over the last years [6-8]. Previously, CDAD was a concern in older or severely ill patients, but the emergence of new hypervirulent strains such as NAP1/BI/027 has resulted in increased morbidity and mortality for other age groups in the United States, Canada and Europe [9-11]. The increased virulence of C. difficile is attributed to greater sporulation and production of binary toxins [12,13] or to higher level of fluoroquinolone resistance [14]. Persistent or severe CDAD is currently being treated with discontinuation of the antibiotic therapy that led to the disease, and vancomycin therapy [15]. Nevertheless, these therapeutic approaches do not restore the normal microflora and are not effective in clostridial clearance, but further prolong C. difficile shedding and destroy beneficial gut anaerobic bacteria [15,16]. In contrast to targeting the bacterium and its toxins directly, the better understanding of the cellular and molecular basis underlying the host response will enable the rational development of host-targeted therapeutics for CDAD.

Peroxisome proliferator-activated receptor $\gamma$ (PPAR$\gamma$) is a nuclear receptor and ligand-activated transcription factor involved in glucose homeostasis and lipid metabolism. PPAR$\gamma$ antagonizes the activity of NF-$\kappa$B (NF-$\kappa$B)/STAT and AP-1. Specifically, it suppresses NF-$\kappa$B [17] by stabilizing the inhibitory $\kappa$B (I$\kappa$B)/NF-$\kappa$B [18], thereby blocking pro-inflammatory gene transcrip-
tion. More importantly, activation of PPARγ modulates mucosal immune responses and is involved in the prevention of inflammatory bowel disease (IBD) in mice [17,19], pigs [20], and humans [21,22]. Moreover, mice with a targeted deletion of PPARγ in epithelial cells, macrophages or T cells display increased pro-inflammatory gene expression and susceptibility to colitis [23–25]. PPARγ also suppresses Th1 responses [19] and blocks the differentiation of CD4+ T cells into a Th17 phenotype, thus potentiating a regulatory T (Treg) cell response [26]. However, no studies are available investigating the role of PPARγ in the pathogenesis and treatment of CDAD.

Another mechanism by which colonic gene expression can be tightly regulated is microRNA (miRNA)-driven RNA interference. MiRNAs are small (~22–24-nucleotide), non-coding, single-stranded RNA molecules that are processed from longer primary-miRNA transcripts. In the last decade, miRNAs have emerged as new potent genome regulators [27] and therapeutic targets [28]. MiRNAs are broadly found in plants, animals, viruses, and algae [29] and contribute to regulating gene expression. These molecules lead to translation inhibition of specific mRNAs depending on the type of base-pairing between the miRNA and its mRNA target [30]. In mammals, miRNA mostly affect the miRNA translation process, but miRNA target degradation also occurs. The role of miRNA has been explored in IBD and other immune-mediated diseases as a promising avenue for the discovery of novel mechanisms of pathogenesis, diagnostics, and therapeutics. Distinct miRNA expression profiles have been found in Crohn’s disease and ulcerative colitis [31]. There is also mounting evidence that miRNAs contribute to orchestrate immune regulation and host responses to pathogen infections. For example, miR-146a and miR-155 are involved in the regulation of T- and B-cell development [32], their differentiation and function [33]. Mice lacking miR-155 fail to control Helicobacter pylori infection as a result of impaired Th1 and Th17 responses [34]. Therefore, understanding the role of miRNAs in antibacterial immune and inflammatory responses holds promise of new molecular diagnostic markers as well as novel gene therapy strategies for treating hypervirulent bacterial infections and associated immunopathologies.

This study investigates the mechanisms underlying PPARγ modulation of mucosal immune responses to *C. difficile*, including a possible relationship between nuclear receptors and miRNAs. Specifically, we applied mathematical and computational modeling approaches in combination with mouse challenge studies to study the mechanisms underlying the interactions between PPARγ activity and miRNA-146b to regulate colitis during *C. difficile* infection. Next, we investigated how either T cell-specific deletion or pharmacological activation of PPARγ modulate colonic inflammatory cytokines and effector Th17 responses to *C. difficile* infection in mice. Our data indicate that T cell PPARγ prevents colitis and down-modulates effector T cell responses in mice with CDAD and suggest a potential crosstalk between miRNAs and the PPARγ pathway.

**Materials and Methods**

**Ethics Statement**

All experimental procedures were approved by the Institutional Animal Care and Use Committee (IACUC) of Virginia Tech and met or exceeded requirements of the Public Health Service/National Institutes of Health and the Animal Welfare Act. The IACUC approval ID for the study was 10-087-VBL.

**Animal procedures**

C57BL/6J wild type mice were bred in our laboratory animal facilities. Tissue-specific PPARγ null mice were generated as described previously [17,35,36]. The tail and colonic genotypes of mice were determined by PCR analysis as described previously [17,37]. Specifically, we used CD4-Cre+ mice lacking PPARγ in T cells [38] and MMTV-Cre+ mice with a deletion in epithelial and hematopoietic cells [17]. Mice were maintained at the experimental facilities at Virginia Tech.

**Antibiotic pretreatment prior to the bacterial challenge**

Previous studies have demonstrated that three days of pre-treatment with a mixture of antibiotics in the drinking water is sufficient to disrupt the intestinal microflora and allows *C. difficile* infection [39]. The antibiotic mixture consisted of colistin 850 U/mL (which corresponds to 4.2 mg/kg), gentamicin 0.035 mg/mL (which corresponds to 3.5 mg/kg), metronidazole 0.215 mg/mL (which corresponds to 21.3 mg/kg) and vancomycin 0.045 mg/mL (which corresponds to 4.5 mg/kg). The mixture was prepared and added to the drinking water for a 3-day pre-treatment period. A control group that received no antibiotics was also included. Following the treatment all mice were given regular autoclaved water for 2 days and all mice including the control group received a single dose of clindamycin (32 mg/kg) intraperitonally 1 day before *C. difficile* challenge.

**Clostridium difficile mouse challenge studies**

On day 5 of the study mice were challenged intragastrically with *Clostridium difficile* strain VPI 10463 (ATCC 43255). To optimize the infection dose for further studies, we conducted a dose-response experiment using the following *C. difficile* infectious doses: 105, 106 and 107 cfu/mouse. The highest dose was used for the following challenges. In some experiments mice received pioglitazone at 70 mg/kg by oral gavage once daily starting 3 days before the infection date and until the necropsy day. Mice were weighed and scored daily to assess mortality and the presence of diarrhea and other general disease symptoms (e.g., piloerection, hunchback position).

**Histopathology**

Segments of colon (3 cm of the anatomic middle of the colon) were fixed in 10% buffered neutral formalin. Samples were embedded in paraffin, sectioned (6 μm), and then stained with hematoxylin and cosin for histological examination. Tissue slides were examined with an Olympus microscope (Olympus America). Images were captured using the FlashBus FBG software (Integral Technologies) and processed in Adobe Photoshop Elements 2.0 (Adobe Systems). The different tissue segments were graded with a compounded histological score, including the extent of: 1) crypt damage and regeneration; 2) metaplasia/hyperplasia; 3) lamina propria vascular changes; 4) submucosal changes; and 5) presence of inflammatory infiltrates. The sections were graded with a range from 0 to 4 for each of the previous categories and data were analyzed as a normalized compounded score.

**Analyses of miRNA-seq**

Next-generation sequencing allows the sequencing of miRNA molecules and simultaneous quantification of their expression levels. We used Illumina deep sequencing to survey miRNA profiles of colons from uninfected and *C. difficile*-infected mice with most distinct phenotypes. All reads were mapped against the mouse reference genome. To determine putative gene targets of miRNA, the EMBL-EBI Microcosm v5 database was used.
Additionally, precursor and mature sequences were retrieved from MirBase v16 [40] and entered into miRBase [41]. Following characterization of miRNA expression profiles with Partek Genomics Suite, pair-wise analyses between infected and uninfected colonic samples were conducted to identify the most differentially expressed miRNA. Data was submitted to NCBI's GEO database (Accession Number GSE39235).

Functional correlation between the expression of miR-146b and some of its potential targets

Potential targets for miR-146b and the regulatory pathways that are expected to be regulated were identified in the literature [42]. The list of candidates miRNA targets was retrieved from the MicroCosm Targets database Version 5 (http://www.ebi.ac.uk/ enright-srv/microcosm/), formerly known as mirBase::Targets [40], that uses the mirRanda algorithm [43] to identify potential binding sites for a given miRNA in gene sequences. Among these findings, we focused on miRNAs we expected to be involved in the pathogenesis of C. difficile by regulating genes at acute stages of the disease. Knowing that miRNA can induce a significant degradation of the target and assuming that evolution progressively selected inverse regulation of expression of miRNAs and their specific miRNAs, we selected nuclear receptor coactivator 4 (NCOA4), a miR-146b target for differential expression testing using qRT-PCR between mice uninfected or mice infected with 107 cfu of C. difficile. NCOA4 was selected for further analyses since it is a well-known activator of PPARγ.

Quantitative real-time RT-PCR

Total RNA was isolated from mouse colons using a Qiagen RNA Isolation Mini kit according to the manufacturer’s instructions. Total RNA (1 μg) was used to generate a cDNA template using an iScript cDNA Synthesis kit (Bio-Rad). The total reaction volume was 20 μL, with the reaction incubated as follows in an MJ MiniCycler: 5 min at 25°C, 30 min at 52°C, 5 min at 85°C, and hold at 4°C. PCR was performed on the cDNA using Taq DNA polymerase (Invitrogen) under previously described conditions [44]. Each gene amplicon was purified with the MiniElute PCR Purification kit (Qiagen) and quantified both on an agarose gel by using a DNA mass ladder (Promega) and with a nanodrop. These purified amplicons were used to optimize real-time PCR conditions and to generate standard curves in the real-time PCR assay. Primers were designed using Oligo 6 software. Primer concentrations and annealing temperatures were optimized for the iCycler iQ system (Bio-Rad) for each set of primers using the system’s gradient protocol. PCR efficiencies were maintained between 92 and 105% and correlation coefficients of 0.96 or higher for each primer set during optimization and also during the real-time PCR of sample RNA. cDNA concentrations for genes of interest were examined by real-time qPCR using an iCycler IQ System and the SYBR green supermix (Bio-Rad). A standard curve was generated for each gene using 10-fold dilutions of purified amplicons starting at 5 pg of cDNA and used later to calculate the starting amount of target cDNA in the unknown samples. SYBR green I is a general double-stranded DNA intercalating dye and may therefore detect nonspecific products and primer/dimers in addition to the amplicon of interest. To determine the number of products synthesized during the real-time PCR, a melting curve analysis was performed on each product. Real-time PCR was used to measure the starting amount of nucleic acid of each unknown sample of cDNA on the same 96-well plate.

Mmu-miR-146b* expression was analyzed with quantitative RT-PCR using TaqMan MicroRNA Assays from Applied Biosystems. Two small nucleolar RNAs, snoRNA202 and snoRNA234, were used as endogenous normalizers for target miR-146b*. A total of 100 ng/sample of RNA was used for cDNA synthesis using the ABI TaqMan MicroRNA Reverse Transcription Kit and the manufacturer protocol. To test for genomic DNA and reaction contamination, two types of negative controls were used for PCR: reverse transcriptase-omitted products and blanks (DEPC-treated water). No amplification was observed in any of the negative controls. TaqMan Universal Master Mix II, the ABI StepOnePlus RT-PCR System and the instrument default cycling conditions were used for PCR. There were 6–8 biological replicates per group, with each RNA sample assayed twice in separate RT reactions. The threshold cycle (Ct) ratios between the target miRNA and the average endogenous control were calculated, arcsin-transformed, and one-way repeated measures ANOVA in R (v. 2.14.0) was used to test differences between treatments and PCR replicates.

Immunophenotyping

Colon samples were processed for lamina propria lymphocyte (LPL) isolation. Specifically, cells (6×105 cells/well) were seeded into 96 well-plates, centrifuged at 4°C at 2000 rpm for 3 minutes, and washed with PBS containing 5% serum and 0.09% sodium azide (FACS buffer). Cells were then incubated for 30 min at 4°C with fluorescein-conjugated primary antibodies to T cell markers. Cells were first incubated with AF700-labeled anti mouse CD45, PECy5-labeled anti mouse CD3 and PECy7-labeled anti mouse CD4. Cells were then fixed and permeabilized with Cytofix-Cytoperm solution (Pharmingen) and incubated with PerCP Cy5.5-labeled anti mouse IL-17 and PE-labeled anti mouse RORγt. Cells were resuspended in 0.2 mL of FACS buffer. Data acquisition was computed with a BD LSR II flow cytometer and analysis performed with FACS Diva software (BD Pharmingen).

In silico simulations of the involvement of miRNA-146b and PPARγ in modulating colonic host responses to C. difficile infection

Based on the results obtained in the mouse challenge studies, an ordinary differential equation-based computational model was developed describing the molecular dynamics of some key cytokines and transcription factors involved in C. difficile infection. Although modeling approaches cannot replace traditional experimentation, the construction of such computational model synthesized, organized and integrated all the concepts and mechanisms studied, facilitating a more systematic hypothesis-generation process. Overall, our modeling process involved: 1) creation of a structural network using Cell Designer; 2) parameter estimation based on published or newly generated experimental data using Complex Pathway Simulator (COPASI); and 3) in silico experimentation. We constructed a network model with five dynamic variables representing miR-146b, NCOA4, PPARγ, interleukin 17 (IL-17) and IL-10, plus an external input: the infectious dose of C. difficile. The network model was constructed by using CellDesigner [45], a software package that enables users to describe molecular interactions using a well-defined and consistent graphical notation. Modeling was performed using COPASI (http://www.modelingimmunity.org/) [46]. Both COPASI and CellDesigner are Systems Biology Markup Language (SBML) compliant, thus, machine and human readable. The CellDesigner-generated network was imported into COPASI where rate laws were adjusted to create the ordinary differential equations (Figure 1). The results of the parameter estimation using Particle Swarm showed a good fitting between the experimental data and predicted values computationally estimated by COPASI.
These values were then implemented in the reactions and rate laws to adjust the dynamics of the model. COPASI was then used to run sensitivity analysis and in silico time-course studies.

### Statistical analyses

We performed Analysis of Variance (ANOVA) to determine the significance of the model by using the general linear model procedure of SAS (SAS Institute) as previously described [17]. Specifically, we examined the main effect of genotype, treatment, and their interaction when necessary. Differences of \( P \leq 0.05 \) were considered significant. Data were expressed as the means ± SE of the mean.

### Results

Increasing doses of C. difficile infection correlate with increasing CDAD and colonic inflammatory lesions

We first performed a dose-response study to identify the optimal infectious dose that results in greater inflammatory responses in wild type mice and found that clinical signs of disease appeared as early as 24 hours post-infection following challenge with C. difficile strain VPI10463. Increasing infectious doses of C. difficile from \( 10^5 \) to \( 10^7 \) cfu corresponded with greater disease severity and colonic inflammatory lesions. Colon, cecum, spleen and MLN were scored for inflammation-related gross pathology lesions during the necropsy. All C. difficile-infected mice presented gross pathological changes.

### Table 1. Model fitting performed by using COPASI’s global parameter estimation.

| Fitted Value     | Objective Value | Root Mean Square | Error Mean | Error Mean Std. Deviation |
|------------------|-----------------|-----------------|-----------|--------------------------|
| miR-146b         | 1.41E-23        | 2.65E-12        | 6.73E-13  | 2.56E-12                 |
| NCOA4_ratio      | 1.19E-19        | 2.44E-10        | -2.42E-10 | 2.96E-11                 |
| PPARγ_ratio      | 2.95E-20        | 1.21E-10        | -1.17E-10 | 3.37E-11                 |
| IL-10_ratio      | 7.05E-11        | 5.94E-06        | -6.36E-08 | 5.94E-06                 |
| IL-17_ratio      | 0.431748        | 0.464623        | 0.328534  | 0.328542                 |

A species is fitted computationally using experimental data and simulation algorithms. The objective value is the value that the modeling software targets based on the experimental data and the computational simulation.

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lesions in all the examined tissues when compared to uninfected mice (Figure S1). Colonic histopathological analyses showed increased epithelial erosion, leukocytic infiltration and mucosal thickness, with more severe inflammatory lesions corresponding to increasing infectious doses of *C. difficile*. In addition, microscopic examination revealed extensive areas of necrosis of the mucosa and submucosal edema (Figure S2).

**C. difficile** upregulates colonic pro-inflammatory cytokine expression

RNA was extracted from colon and real time RT-PCR was performed to examine the effect of *C. difficile* infection on colonic gene expression. Mice challenged with $10^7$ cfu of *C. difficile* had a significant increase in monocyte chemoattractant protein 1 (MCP-1), IL-6, IL-17 and IL-1β when compared to all the other groups, indicating that the bacterial challenge induced a strong pro-inflammatory response in the gut (Figure 2). Although mice infected with $10^5$ and $10^6$ cfu had a higher disease activity score than the control mice, no increase in the colonic expression of such cytokines was seen in these groups, possibly due to a counterbalance mediated by a parallel regulatory response at lower doses of infection.

**Infected mice overexpress miR-146b**

miRNA profiles of *C. difficile*-infected and uninfected mice were determined by Illumina sequencing. Specifically, a total of 454 miRNA types were detected among 8,902,783 Illumina reads from the six samples (3 non-infected and 3 infected with 107 cfu) multiplexed within two lanes. Three miRNAs were significantly overexpressed within infection: miR-146b, miR-1940, and miR-1298 (FDR $P<0.05$) (Figure S3). The sequencing results were validated by real-time RT-PCR. Our data showed an upregulation of miR-146b correlating with the dose of *C. difficile* infection. NCOA4 was computationally predicted as a target of miRNA-146b based on thermodynamics. In order to begin to validate such prediction, co-expression of miRNA-146b and NCOA4 within the colon and differential expression of NCOA4 with increasing doses of infection was assessed by RT-PCR. Interestingly, a significant decrease in the expression of colonic NCOA4 was found with increasing *C. difficile* infectious doses. NCOA4 is a coactivator molecule that interacts with the PPARγ complex and facilitates its activation. Therefore, the decrease in NCOA4 expression results in a reduction of PPARγ activation. In line with the suppression of NCOA4 expression we found that PPARγ target genes CD36 and GLUT4 were significantly downregulated in colons of *C. difficile*-infected mice (Figure 3), indicating that colonic PPARγ activity is suppressed in mice infected with *C. difficile*.

**Computational modeling of host responses to *C. difficile* infection**

To further integrate and characterize the potential interactions occurring between *C. difficile*, miR-146b and PPARγ, we developed a computational and mathematical model of the colonic gene expression changes occurring in the colon following *C. difficile* infection. This network was constructed based on our experimental findings and literature information (Figure 4A). By using this model, we explored *in silico* the mechanisms by which *C. difficile* modulates the expression of effector and inflammatory cytokines. Our computational simulation predicts an upregulation of miR-
146b, and IL-17 and a down-regulation of NCOA4 and PPARγ in colons of mice after infection with *C. difficile* (Figure 4B).

The loss of PPARγ in T cells significantly increased CDAD and colitis following *C. difficile* infection

Since our data indicates that the PPARγ pathway is down-regulated at the colonic mucosa during *C. difficile* infection, we assessed the impact of the loss of PPARγ in epithelial and hematopoietic cells on *C. difficile* infection-associated weight loss. Our results show a more dramatic weight loss and more accentuated inflammatory lesions in tissue-specific PPARγ null mice following infection with *C. difficile* (data not shown). In a follow-up study we determined the impact of T cell-specific PPARγ deletion in the inflammatory response and disease caused by this facultative anaerobic bacterium. T cell-specific PPARγ null (i.e., CD4cre+) mice had higher disease activity scores than wild type mice did. They also showed a 20% body weight loss by day 4 post-infection which resulted in 30% of mortality (Figure S4). Moreover, infected CD4cre+ mice had more severe colonic inflammatory lesions (Figure 5), suggesting that PPARγ expression in T cells plays and important role in ameliorating CDAD in mice. Uninfected CD4cre+ mice did not show any difference when compared to the uninfected WT group (data not shown). On the other hand, mice treated with the PPARγ agonist pioglitazone (70 mg/kg) had reduced inflammatory lesions, colonic histopathology (Figure 4), and had lower levels of colonic inflammatory mediators when compared to untreated mice infected with *C. difficile* (Figure S5). Also, uninfected WT mice treated with pioglitazone did not differ from uninfected and untreated group.

The loss of T cell PPARγ causes upregulation of colonic MCP-1 and IL-17 and downregulation of IL-10 in *C. difficile*-infected mice

Colonic IL-10 expression was upregulated in colonic wild type mice when compared to those of T cell-specific PPARγ null (CD4cre+) mice, indicating that the deficiency of PPARγ in T cells abrogated the ability of *C. difficile* infection to induce IL-10 expression. In addition, the deficiency of PPARγ in T cells caused an upregulation of colonic MCP-1, IL-17 and tumor necrosis factor α (TNF-α) mRNA expression (Figure 6). Flow cytometric analyses of immune cell populations indicates an increased percentages of IL-17+ and RORγt+ CD4+ T cells following the infection as well as increased percentages of Th17 cells in spleens of T cell-specific PPARγ null mice (Figure 7).

**Discussion**

*Clostridium difficile* is the most common cause of nosocomial infectious diarrhea in the U.S. An increase in the severity and incidence of *C. difficile* infections has been reported in the last few years [47]. Moreover, the increased report of cases in healthy people without traditional risk factors is alarming since it suggests a greater pathogenicity of circulating strains [48,49]. Hence, elucidating the cellular and molecular basis controlling the host-*C. difficile* interactions is important to discover new broad-based, host-
targets therapeutic approaches to control the disease. This report presents fully integrated in vivo and computational approaches for studying the mechanisms involved in the regulation of host responses to C. difficile. We constructed a network model with five dynamical variables representing miR-146b, NCOA4, PPARγ, IL-17 and IL-10, plus an external input: the infectious dose of C. difficile. The computational simulations predicted an overexpression of miR-146b following C. difficile infection, resulting in decreased concentrations of NCOA4, which in turn failed to activate PPARγ. In addition, colonic gene expression analyses demonstrated an upregulation of IL-6 and IL-17 in C. difficile-infected mice, suggesting either enhanced Th17 responses or IL-17 production by other mucosal cell types such as paneth cells or γδ T cells. Th17 responses are implicated in immune-mediated diseases and immune responses to some extracellular pathogens. Flow cytometric analyses of immune cell populations indicated increased percentages of IL-17+ and RORγt+ CD4+ T cells in spleens of infected mice, suggesting that C. difficile infection enhanced Th17 responses.

PPARγ plays a crucial role during CD4+ T cell differentiation by down-modulating effector and enhancing regulatory responses [19,30], and thereby contributing to the maintenance of tissue homeostasis. Furthermore, PPARγ agonists have proven therapeutic and prophylactic efficacy in IBD [17,19,20]. To determine whether the loss of the PPARγ gene in T cells worsened CDAD, we challenged wild-type and T cell-specific PPARγ null mice with C. difficile. The bacterial infection induced a colonic mucosal IL-10-driven anti-inflammatory response as well as an effector response characterized by the production of IL-17 and MCP-1 in wild-type mice. However, the loss of PPARγ in T cells abrogated the ability of C. difficile to induce IL-10 expression in the colon, without affecting the overproduction of IL-17, which has been implicated in immune-mediated diseases such as IBD. Flow cytometry analysis confirmed that both C. difficile infection and the loss of PPARγ favor Th17 responses. The therapeutic value of PPARγ activation in CDAD was further demonstrated by the significant amelioration of CDAD and suppression of colitis in mice treated with pioglitazone, a full PPARγ agonist.

Pharmacological manipulation of miRNA has been postulated as a novel and viable therapeutic approach to modulate the host inflammatory response to minimize pathology without negatively affecting pathogen clearance or the ability to mount a protective immune response. Mature miRNAs are incorporated into the

Figure 4. Computational modeling of mucosal immune responses to Clostridium difficile infection. CellDesigner-based illustration of the Complex Pathway Simulator model of the model for Clostridium difficile immune response (A). The model represents the interaction between C. difficile, miRNA-146, nuclear receptor coactivator 4 (NCOA4), peroxisome proliferator-activated receptor γ (PPAR γ), interleukin 10 (IL-10) and interleukin 17 (IL-17) in Systems Biology Markup Language format. Inhibition is represented in red and activation in green. COPASI steady state scan showing the variation on the species concentrations with increasing computational concentration of C. difficile (B). In silico simulations show how increasing concentrations of C. difficile increase miRNA-146b levels, thus decreasing NCOA4 and PPAR γ. In line with the experimental data, IL-17 expression also increases with the infection. doi:10.1371/journal.pone.0047525.g004

Figure 5. Impact of the loss of PPARγ in T cells and pharmacological activation of PPARγ colonic inflammatory lesions in Clostridium difficile-infected mice. Representative photomicrographs of colons of uninfected (A and E), infected wild type mice (B and F), infected CD4cre+ mice (C and G) and infected wild-type mice treated orally with pioglitazone (70 mg/kg) (D and H) (n = 8). Original magnification at 40× (top panel) and 100× (bottom panel). doi:10.1371/journal.pone.0047525.g005
Figure 6. The loss of PPARγ in T cells regulates colonic cytokine expression of mice infected with *Clostridium difficile*. Colonic expression of interleukin 10 (IL-10) (A), interleukin 17 (IL-17) (B), monocyte chemoattractant protein 1 (MCP-1) (C) and tumor necrosis factor (TNF-α) (D) were assessed by real-time quantitative RT-PCR in wild type and T cell PPARγ null mice infected with *C. difficile* (n = 8). Data are represented as mean ± standard error. Points with an asterisk are significantly different when compared to the wild type control group (P<0.05).
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Figure 7. The loss of PPARγ in T cells and *Clostridium difficile* infection enhances Th17 responses in spleen and lamina propria of mice. Splenocytes and lamina propria lymphocytes from wild type and T cell PPARγ null mice infected with *C. difficile* (n = 6) were immunophenotyped to identify immune cell subsets by flow cytometry. Data are represented as mean ± standard error. Points with an asterisk are significantly different when compared to the control group (P<0.05).
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RNA-induced silencing complex where they typically recognize and bind to sequences in the 3′ untranslated regions, leading to suppression of translation and/or degradation of miRNA. There is accumulating evidence that miRNA play a critical role in immunity and inflammation [31–33]. For instance, distinct miRNA expression profiles have been found in Crohn’s disease and ulcerative colitis [31]. By comparing miRNA profiles from C. difficile-infected and uninfected mice, we found that miR-146b, miR-1940, and miR-1298 were overexpressed in colons of C. difficile-infected mice. We focused our efforts on the miRNA-146 family (miRNA-146a/b) in this study since we validated its upregulation in the colon of C. difficile-infected mice by RT-PCR. In addition, miRNA-146 is expressed in leukocytes and its function is clearly linked to innate immunity and inflammation [50,51]. miRNA-146 regulatory circuit improves TLR4 and cytokine signaling in response to microbial components and proinflammatory cytokines [52,53]. Moreover, it is involved in the regulation of T- and B-cell development [32,33], differentiation and function [33]. To further understand the role of miRNA-146b during C. difficile infection, a list of miRNA potential targets for such miRNA was retrieved from miRBase [40]. Notably, one of the co-activators facilitating the transcriptional activities of the ligand-activated PPARγ, NCOA4, was a predicted target of miRNA-146b. Indeed, gene expression analyses using qRT-PCR demonstrated co-expression of miRNA-146b and NCOA4 in colons of C. difficile-infected mice and a negative correlation between expression of miR-146b and its target NCOA4 along with increasing doses of C. difficile, suggesting a potential inhibition of NCOA4 by miR-146b resulting in suppressed PPARγ activity, as measured by suppressed expression of PPAR-γ-responsive genes (i.e., CD36 and Glut4) in C. difficile-infected mice. Thus, miRNAs become promising therapeutic targets once the functional consequences of miRNAs alteration are completely elucidated. Also, future studies should examine more direct therapeutic approaches to prevent overexpression of miRNA-146 during CDAD.

In conclusion, we have used loss-of-function approaches in combination with pharmacological activation of PPARγ and computational modeling to investigate the critical role of PPARγ in regulating immune responses and disease severity following C. difficile infection. Our data suggests that overexpression of miRNA-146b in the colon might exacerbate inflammatory responses by suppressing PPARγ activity through a mechanism possibly involving suppression of NCOA4, a co-activator molecule required for activation of PPARγ.

**Supporting Information**

**Figure S1** Effect of infection with Clostridium difficile strain VPI 10463 on macroscopic inflammation-related lesions in C57BL/6j wild-type mice. Colon (A), cecum (B), spleen (C) and mesenteric lymph nodes (MLN) (D) were macroscopically scored for inflammation during the necropsy (n = 10). Data are represented as mean ± standard error. Points with an asterisk are significantly different when compared to the control group (P<0.05).

**Figure S2** Effect of infection with Clostridium difficile strain VPI 10463 on microscopic lesions observed following a 4-day challenge. Representative photomicrographs of colons of uninfected (A and D), infected with 106 colony-forming units (cfu) of C. difficile (B and E) and infected with 102 cfu of C. difficile (C and F) (n = 10). Original magnification at 40× (top panel) and 100× (bottom panel).

**Figure S3** Effect of infection with Clostridium difficile strain VPI 10463 on miRNA differential expression in C57BL/6j wild-type mice. miRNA-seq heatmap illustrating the clustering results of C. difficile-infected (T) and uninfected control (C) mice (n = 9).

**Figure S4** Effect of the genotype and treatment on the body weight loss, disease activity index and histologic lesions in the colons of mice infected with Clostridium difficile strain VPI 10463. Mice were weighed (A) and scored (B) daily for mortality and morbidity and the presence of diarrhea and other symptoms (n = 8). All colonic specimens underwent blinded histological examination and were scored 0–4 on mucosal wall thickening (C&E) and leukocyte infiltration (D&F). Data are represented as mean ± standard error. Points with an asterisk are significantly different when compared to the control group (P<0.05).

**Figure S5** Effect of the oral pioglitazone administration on the colon gene expression of mice infected with Clostridium difficile strain VPI 10463. Colonic expression of interleukin 1β (IL-1β) (A), monocyte chemoattractant protein 1 (MCP-1) (B) and interleukin 17 (IL-17) (C) were assessed by real-time quantitative RT-PCR in C. difficile infected wild type mice treated with pioglitazone (n = 8). Data are represented as mean ± standard error. Points with an asterisk are significantly different when compared to the control group (P<0.05).

**Author Contributions**

Conceived and designed the experiments: JBR RH MV. Performed the experiments: MV AC MP SH PM KM. Analyzed the data: MV. Contributed reagents/materials/analysis tools: RLG JKR CAW. Wrote the paper: MV RH JBR. Designed the software used for modeling: SH.

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