

## ORIGINAL ARTICLE

# An *in vitro* culture model to study the dynamics of colonic microbiota in Syrian golden hamsters and their susceptibility to infection with *Clostridium difficile*

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***Clostridium difficile* infections (CDI) are caused by colonization and growth of toxigenic strains of *C. difficile* in individuals whose intestinal microbiota has been perturbed, in most cases following antimicrobial therapy. Determination of the protective commensal gut community members could inform the development of treatments for CDI. Here, we utilized the lethal enterocolitis model in Syrian golden hamsters to analyze the microbiota disruption and recovery along a 20-day period following a single dose of clindamycin on day 0, inducing *in vivo* susceptibility to *C. difficile* infection. To determine susceptibility *in vitro*, spores of strain VPI 10463 were cultured with and without soluble hamster fecal filtrates and growth was quantified by quantitative PCR and toxin immunoassay. Fecal microbial population changes over time were tracked by 16S ribosomal RNA gene analysis via V4 sequencing and the PhyloChip assay. *C. difficile* culture growth and toxin production were inhibited by the presence of fecal extracts from untreated hamsters but not extracts collected 5 days post-administration of clindamycin. *In vitro* inhibition was re-established by day 15, which correlated with resistance of animals to lethal challenge. A substantial fecal microbiota shift in hamsters treated with antibiotics was observed, marked by significant changes across multiple phyla including *Bacteroidetes* and *Proteobacteria*. An incomplete return towards the baseline microbiome occurred by day 15 correlating with the inhibition of *C. difficile* growth *in vitro* and *in vivo*. These data suggest that soluble factors produced by the gut microbiota may be responsible for the suppression of *C. difficile* growth and toxin production.**

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## Introduction

*Clostridium difficile* is a gram-positive spore-forming anaerobic bacterium commonly responsible for antibiotic-associated diarrhea in patients, mostly in hospitals or long-term care facilities. *C. difficile* infections (CDI) generally are the result of a disruption of the normal gastrointestinal microbiota by antimicrobial therapies, followed by exposure to

spores of the bacterium, colonization and growth. Toxigenic strains of *C. difficile* produce two toxins which are responsible for a spectrum of clinical disease ranging from diarrhea to severe pseudomembranous colitis, toxic megacolon and ultimately death. *C. difficile* affects about 500 000 Americans each year, accounting for 15 000–20 000 deaths (Rupnik *et al.*, 2009) with similar incidence reported in both Canada and Europe (Poutanen & Simor, 2004).

Current mainstream therapies for CDI are mostly empiric and range from discontinuation of the offending antibiotic to controlled courses of narrow-spectrum antibiotics (metronidazole, vancomycin—individually or in various combinations). As these therapies have no effect on the latent spores in the gastrointestinal and the surrounding environment, nor improve the health of the colonic microbiota (if not lead to further dysregulation), the

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rate of disease recurrence is high. A clear indication that the gastrointestinal microbiota is central to the control of CDI is supported by the results of a recent double-blind randomized clinical trial where the rate of cure of recurrent CDI was increased from 31–81% in subjects given fecal transplant compared with those on vancomycin therapy (van Nood *et al.*, 2013). A better understanding of the protective role of the commensal gastrointestinal microbiota could therefore provide critical information about how current and future antimicrobial treatments affect CDI risks as well as lead to the development of potential new therapies. Identification of the protective components that are contained in these fecal emulsions could also lead to the development of biomarkers associated with disease risk.

Previous efforts to understand the protection afforded by the commensal microbiota have demonstrated that fecal emulsions from healthy human adults retain their ability to inhibit growth and toxin production of *C. difficile in vitro* (Borriello and Barclay, 1986). To examine both the *in vitro* and *in vivo* interactions between the commensal microbiota and *C. difficile*, we used the lethal *enterocolitis* model in Syrian golden hamsters (*Mesocricetus auratus*). This model is a useful experimental tool that has been widely used to evaluate the protective potential of various prophylactic and therapeutic interventions against CDI, as well as to compare the virulence of various *C. difficile* strains (Sambol *et al.*, 2001).

To establish whether a correlation between the composition of the commensal microbiota and susceptibility to infection exist in this model, we generated soluble extracts from feces collected from hamsters both before and after antibiotic administration and evaluated their effect on *C. difficile* growth *in vitro*. In parallel we challenged vaccinated hamsters with a lethal dose of a prototypic *C. difficile* strain (VPI 10463) and compared the course of disease in these animals with the growth kinetics of *C. difficile in vitro*. Finally, we examined the bacterial composition of the gut microbiota at various times post clindamycin treatment to determine the impact of antibiotic treatment on normal microbiota and shed light on the role of these gut residents on susceptibility to CDI.

## Materials and methods

### *C. difficile* strains and spore preparation

Spores were prepared from strain VPI 10463, (American Type Culture Collection, Manassas, VA, ATCC #43255) using established methods (Long Sterling and Williams, 1958; Sorg and Sonenshein, 2008). Spores were aliquoted in water and stored frozen at  $-70^{\circ}\text{C}$  for up to 1 year. Spores were thawed prior to challenge and diluted in phosphate-buffered saline (PBS) to a final concentration of  $1000\text{ CFU ml}^{-1}$ . Each animal received 1 ml of *C. difficile* spore preparation. *C. difficile* selective agar plates (CDSA) (Becton Dickinson, Franklin

Lakes, NJ, USA) supplemented with sodium taurocholate (Pfaltz & Bauer Inc, Waterbury, CT, USA) added at a concentration of 0.1% w/v (CDSA-T) were used for agar plate culture *in vitro*. Brain Heart Infusion broth (Teknova Inc, Hollister, CA, USA) containing 0.1% w/v taurocholate was used for liquid culture.

### Fecal extract preparation

Hamster feces were collected daily pre and post treatment of animals with various doses (30, 10 or  $1\text{ mg kg}^{-1}$ ) of clindamycin (Cleocin, Pfizer, New York, NY, USA). All fecal samples were frozen at  $-70^{\circ}\text{C}$  before the soluble fraction was extracted for use in experiments to determine their growth inhibition properties. Sterile extracts were prepared by dissolving the feces 1:10 w/v in PBS, followed by centrifugation at 4000 g for 10 min at  $4^{\circ}\text{C}$  to pellet the insoluble components and the supernatants were then decanted and filter sterilized using a syringe filter ( $0.22\text{ }\mu\text{m}$ ) (Thermo Fisher Scientific, Rochester, NY, USA). Fecal extracts were added at a ratio of one part fecal extract to 99 parts medium. After spore addition, cultures were incubated in an anaerobic culture chamber conditioned using an anaerobic gas generating system (Thermo Fisher Scientific, Lenexa, KS, USA) at  $37^{\circ}\text{C}$  for 72 h.

### *C. difficile* toxin enzyme immunoassay

To measure the total concentration of *C. difficile* toxin A and toxin B, fecal extract culture supernatants were analyzed using a *C. DIFFICILE* TOX A/B II Kit (TechLab, Blacksburg, VA, USA). Briefly, fecal extract culture supernatants were precipitated with 60% ammonium sulfate ( $\text{NH}_4\text{SO}_4$ ) added from a saturated solution at  $4^{\circ}\text{C}$ . The precipitated samples were then resuspended in kit diluent and analyzed according to the manufacturer's instructions. This kit has documented toxin A and toxin B detection levels of  $\geq 0.8\text{ ng ml}^{-1}$  and  $\geq 2.5\text{ ng ml}^{-1}$ , respectively.

### Quantitative PCR (qPCR)

A qPCR assay was used to determine the number of *C. difficile* genome copies present in either fecal emulsions from *C. difficile*-challenged hamsters or from fecal extract supplemented broth cultures. Samples were stored at  $-20^{\circ}\text{C}$  until analysis by qPCR. Samples were thawed on the benchtop at room temperature and diluted 1:10 v/v with PBS prior to DNA purification. Twenty-five microliters of proteinase K ( $20\text{ mg ml}^{-1}$ ) (Qiagen, Valencia, CA, USA) was added to  $400\text{ }\mu\text{l}$  of the suspension. Samples were mixed briefly using a vortex and placed in a water bath at  $74^{\circ}\text{C}$  for 10 min for enzymatic digestion. Samples were then transferred to an automated DNA purification robot (QiaSymphony SP, Qiagen) and purified using a QiaSymphony DNA Mini Kit (Qiagen). Samples were eluted in  $200\text{ }\mu\text{l}$  of elution buffer and held at  $4^{\circ}\text{C}$  until use. QPCR primers and probes for the

detection of *C. difficile* were based on the intergenic region of 16S ribosomal RNA (rRNA) sequences and used as previously described (Penders *et al.*, 2005).

Amplification was carried out on a FAST enabled 7900SDS (ABI, Carlsbad, CA, USA) thermocycler in a total volume of 20  $\mu$ l with 750 nM of both primers, 166 nM 6-carboxyfluorescein/tetramethylrhodamine probe, 2  $\times$  universal FAST Taq PCR mix (ABI) and 2  $\mu$ l template DNA. The following cycle parameters were used: 95 °C hold for 20 s followed by 50 cycles of 95 °C for 30 s and 60 °C for 30 s. DNA was diluted to fit within a standard range ( $10^1$ – $10^6$  copies per  $\mu$ l) prior to amplification in Tris-EDTA buffer and values were back-calculated according to the dilution factor. Standards used were based on a plasmid containing the *C. difficile* 16S rRNA intergenic region from strain 630 and run in 10-fold serial dilutions. Quantities were interpolated from the plasmid standard curve.

#### Animal husbandry and handling

Male Syrian golden hamsters, *M. auratus*, (90–120 gm) (Charles River Laboratories, Stonebridge, NY, USA) were housed individually in sterilized boxes with micro isolator lids. Food, water and bedding were autoclaved prior to clindamycin treatment of animals. The cages were changed daily following *C. difficile* spore challenge. All animal experiments were approved by the Institutional Animal Care and Use Committee at Merck Research Laboratories (West Point, PA, USA).

#### Toxoid vaccine preparation

Vaccine for immunization of animals was prepared in the following way: lyophilized *C. difficile* toxins A and B (List Biological Laboratories, Campbell, CA, USA) were separately reconstituted and then dialyzed into 20 mM MOPS-HCl pH 7.4, 150 mM NaCl, at concentrations of  $\sim 0.6$  mg toxin per ml. Formaldehyde was added to a concentration of 0.42%, and lysine was added to a concentration of 4.3 mg ml $^{-1}$ . After an 18-day incubation at 2–8 °C, the toxoids were combined with amorphous aluminum hydroxyphosphate sulfate (Merck, West Point, PA, USA) and ISCOMATRIX adjuvant (CSL Biotherapies, Inc, King of Prussia, PA, USA) in 20 mM HEPES, 100 mM sodium chloride, pH 7.5 buffer to produce a vaccine with final concentrations of 10  $\mu$ g ml $^{-1}$  toxoid A, 10  $\mu$ g ml $^{-1}$  toxoid B, 450  $\mu$ g aluminum per ml, 100 IU ml $^{-1}$  ISCOMATRIX adjuvant and a residual formaldehyde concentration of 0.015%. The injection volume in hamsters was 0.2 ml per dose.

#### Toxoid vaccine immunization

The animals were immunized four times at 0, 21, 42 and 63 days with toxoid A and toxoid B using the intra-muscular route in the quadriceps femoris muscle. Animals were bled at each time point as well as on day 77 (2 days prior to challenge with *C. difficile*).

#### Challenge

Hamsters were treated by oro-gavage with a single dose of 1, 10 or 30 mg kg $^{-1}$  clindamycin 5 days before the administration of spores. *C. difficile* spores were administered to the animals by oro-gavage and the animals were monitored for symptoms (wet tail and weight loss) or death twice daily for 2 weeks.

#### Anti-toxin A/B ELISA assays

An ELISA assay was used to measure the serum immunoglobulin G titer of immunized animals for toxin A and B. Thermo Reacti-Bind (Thermo Lab Systems, Waltham, MA, USA) 96-well plates were coated with *C. difficile* toxin A or toxin B (both from List Biological Laboratories) at 50 ng per well and 25 ng per well, respectively, in PBS and incubated overnight at 4 °C. Wells were washed with 300  $\mu$ l of PBS containing 0.05% v/v Tween 20 (PBS-T) three times, and unbound sites blocked with 100  $\mu$ l of blocking/dilution solution (PBS containing 1% bovine serum albumin (Sigma, St Louis, MO, USA)) by incubation for 1.5 h at room temperature. Hamster sera were serially diluted (fivefold steps) on the plates and incubated at room temperature for 1.5 h. Plates were washed with 300  $\mu$ l of PBS-T three times and incubated with goat anti-hamster immunoglobulin G horse-radish peroxidase conjugated antibody (Abcam, Cambridge, MA, USA) for 1 h at room temperature. Following an additional wash with 300  $\mu$ l of PBS-T, 50  $\mu$ l of 3,3',5,5'-tetramethylbenzidine substrate (Thermo Labsystems, Milford, MA, USA) was added and after 15 min, the reaction was stopped by the addition of 50  $\mu$ l of 0.4 N sulfuric acid (Fisher Scientific, Pittsburg, PA, USA) and absorbance was measured at 450 nm.

#### Microbial flora profiling

Microbiota from fecal specimens were profiled using Second Genome's Microbiome Signature Discovery service (San Bruno, CA, USA), which included both PhyloChip and Illumina sequencing assays to track microbial population dynamics across the specimens as detailed in the Supplementary Methods. Briefly, for PhyloChip G3 assay profiling, the V1 through the V9 regions of the 16S rRNA genes were amplified, and  $\sim 3.0 \times 10^{10}$  molecules (500 ng) from each sample were hybridized to the microarray displaying 1016064 oligonucleotide probes complementing all known bacterial and archaeal taxa as described in previous work (Hazen *et al.*, 2010). A total of 934 empirical operational taxonomic units (OTU) were found in one or more samples and were taxonomically annotated against Greengenes (DeSantis *et al.*, 2006; McDonald *et al.*, 2012). A hybridization score was calculated for each sample from the mean ranked fluorescent intensities among the multiple probes assigned to each empirical OTU.

For V4 sequencing assay profiling, the V4 region of the 16S rRNA genes was amplified using fusion primers as previously described (Caporaso *et al.*, 2011),



and then pooled for sequencing using the MiSeq (Illumina, San Diego, CA, USA) instrument. Using the software QIIME (Kuczynski *et al.*, 2011), UCLUST (Edgar, 2010) and MOTHUR (Schloss *et al.*, 2009), sequences were clustered into 3913 reference OTUs and assigned taxonomic classification from the Greengenes database. To normalize the sequence counts per specimen, 18 946 sequences were randomly drawn without replacement from each sample, equivalent to  $7.0 \times 10^{-6}$  ng of the PCR product. The count of 18 946 was determined by the sample with the least number of sequences retained after clustering to reference OTUs.

All OTU abundance profiles were compared with Weighted UniFrac (Lozupone *et al.*, 2006) and significant changes in OTU abundance patterns across hamster groups and time points were determined with the Welch or analysis of variance tests for PhyloChip or V4 sequencing, respectively. The resulting *P*-values were corrected to *q*-values with the Benjamini–Hochberg procedure.

To identify the putatively protective OTUs (PPOs) associated with *C. difficile* resistance, OTU abundance trajectories from both methods were filtered to those that decreased significantly after the 30 mg kg<sup>-1</sup> clindamycin dose but then increased significantly by day 15 (method details in Supplementary Table S3). A significance level of  $q < 0.05$  for PhyloChip data was chosen. Because no V4 OTUs passed all four criteria with that stringency, the V4 significance level of  $P < 0.05$  was chosen. PPOs were compared with data from the Human Microbiome Project Consortium (HMP, 2012) to determine their clinical relevance.

## Results

### *Effect of clindamycin treatment on fecal extracts in vitro culture*

We first examined the ability of fecal extracts obtained from clindamycin-treated hamsters to modulate the growth of *C. difficile* strain VPI 10463 on CDSA-T plates. Extracts were prepared from hamster feces collected before and after treatment of animals with 30 mg kg<sup>-1</sup> clindamycin. As expected, in the absence of any fecal extract, spores germinated and grew on the selective agar medium. In contrast, the addition of fecal extracts from animals that had not been clindamycin treated (naïve group) yielded a mean value of 0.75 CFUs per plate (s.d. = 1.5 CFUs) compared with the control which produced a mean of 97.5 CFUs per plate (s.d. = 18.82 CFUs). However, the plates containing fecal extracts made from feces collected 5 days post antibiotic treatment of animals showed no inhibition of *C. difficile* growth as demonstrated by colonies that were similar to the control in both number and size. Heat treatment or ultrafiltration (cutoff ~3000 Da) of extracts from naïve animals completely abrogated their inhibitory effects

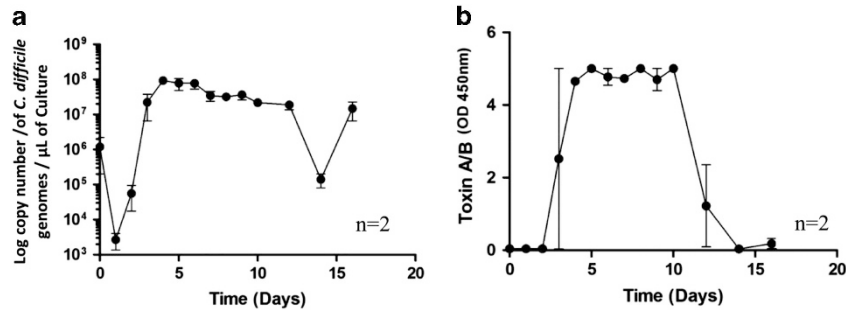
suggesting that the compound(s) responsible for inhibition was most likely a heat-sensitive protein.

Next, a study of the kinetics of microbiota disruption by antibiotic administration was conducted during which fecal extracts were collected daily following the treatment of hamsters with clindamycin and these extracts were added to liquid cultures containing *C. difficile* spores. Following incubation, bacterial growth and toxin production were evaluated by quantitative 16S ribosomal DNA qPCR and an enzyme immunoassay, respectively. Early time points, utilizing extracts collected from animals shortly after clindamycin treatment, were inhibitory for *C. difficile* growth, either due to residual clindamycin in the animals' feces, or due to incomplete disruption of the microbiota of animals. However, beginning at ~3 days following antibiotic treatment, extracts from treated animals were no longer capable of inhibiting the growth of *C. difficile* in culture and this lack of activity persisted until about day 12. These data demonstrated that administration of a single clindamycin dose to animals resulted in an ~10-day long period of time during which fecal extracts were not inhibitory for *C. difficile* growth and subsequent toxin production. After this 10-day period the inhibitory activity of fecal extracts was restored, suggesting replenishment of the microbiota (Figure 1).

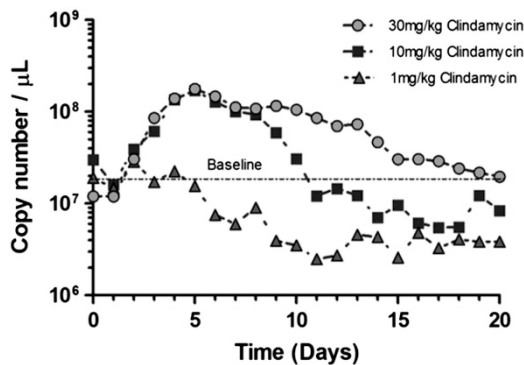
To investigate whether the magnitude of the disruption was dependent upon the dose of antibiotic, reduced doses of clindamycin were administered to hamsters (1 or 10 mg kg<sup>-1</sup>) and fecal extracts were prepared from these animals and compared with fecal extracts from animals treated with 30 mg kg<sup>-1</sup> clindamycin. Lowering the dose of clindamycin appeared to modify the kinetics of disruption in the fecal extract assay (Figure 2) and resulted in shorter time periods during which *C. difficile* growth and concurrent toxin production were enabled in liquid cultures.

### *Effect of clindamycin treatment on susceptibility of hamsters to C. difficile challenge*

Syrian hamsters are exquisitely sensitive to challenge with *C. difficile* and usually die within a few days post infection, making an *in vivo* evaluation of fecal microbiota difficult. However, toxoid-immunized animals have been shown to be resistant to challenge and therefore allowed us to follow animals for a full 14-day observation period to analyze changes in their microbiota utilizing various methods. Therefore, a cohort of animals were immunized with toxoids A and B (four doses, intramuscular) and were bled on day 77 and anti-toxin titers to the two large clostridial toxins were determined by ELISA (Figure 3) to confirm seroconversion of the animals. As expected, the animals immunized with the toxoid vaccine had significantly higher titers to toxin A and B than the animals in the adjuvant control group.



**Figure 1** Culture and toxin production kinetics of *C. difficile* *in vitro* in the presence of fecal extracts. (a) 16S ribosomal DNA qPCR of *in vitro* culture containing fecal extracts from various time points post antibiotic disruption. (b) Toxin enzyme immunoassay assay measurements from the same culture as the qPCR data showing production of toxin when *C. difficile* growth occurs *in vitro*; error bars shows range.



**Figure 2** *In vitro* culture of *C. difficile* strain VPI 10463 measured by 16S ribosomal DNA qPCR. The length of time associated with high *C. difficile* growth correlates with the dose of antibiotic used to generate the disruptions of the microbial flora. The *in vitro* culture grown in the presence of fecal extracts from the 30 (circle), 10 (square) and 1 mg kg<sup>-1</sup> (triangle) of clindamycin-treated hamsters generated a 15, 10 and a 3 day permissive window in the gut microbiota, respectively. Baseline mark is geometric mean of the untreated hamster copy number per µL ( $N = 5$  hamsters per group).

Hamsters that had been treated with either 10 or 30 mg kg<sup>-1</sup> clindamycin following immunization with adjuvant alone were highly susceptible to *C. difficile* challenge with the majority of animals succumbing to the infection within the 14-day observation period. However, animals that were immunized with the toxoid vaccine were protected against *C. difficile* challenge following disruption with the same doses of antibiotic ( $P < 0.0001$ ) (Figure 4a). In contrast, treatment of hamsters with a 1 mg kg<sup>-1</sup> dose of clindamycin did not generate animals that were sensitive to *C. difficile* infection as the majority of hamsters in both the adjuvant and vaccine immunized groups survived challenge.

We also monitored the body weight changes following challenge of animals, which provided an indirect method of monitoring the progression of CDI in these animals. Weights of individual immunized animals were normalized to initial body weights to allow for comparison between animals (Figure 4b). A recovery point in this model was identified by locating the time point at which the hamsters began to either gain or stabilize their weight and maintain gains over several days. This

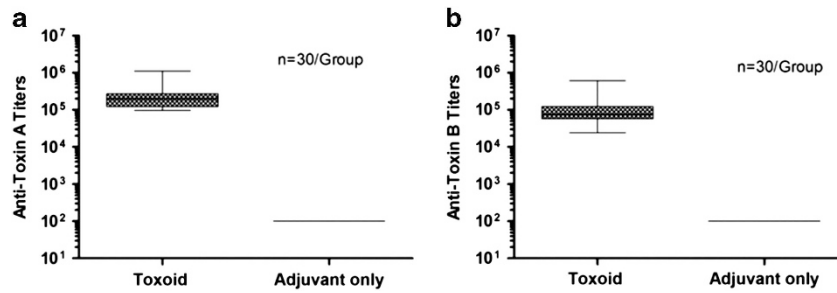
time point varied depending on the dose of antibiotic given and occurred on or before day 5 for the 1 mg kg<sup>-1</sup> dose and post day 11 and 15 for the 10 and 30 mg kg<sup>-1</sup> doses, respectively.

The impact of timing of spore introduction post antibiotic administration on animal health and survival was also investigated to assess the time period during which hamsters were susceptible to challenge. Naïve hamsters were challenged with VPI 10463 spores at 5, 9, 15 or 20 days post treatment with clindamycin (30 mg kg<sup>-1</sup> dose). The time between antibiotic disruption and the introduction of *C. difficile* spores into the gut correlated with the survival of hamsters and longer intervals led to increased survival. QPCR of stool pellet emulsions also revealed that feces obtained from animals with a longer time interval between disruption and challenge had a lower overall burden of *C. difficile* bacteria (Figure 5).

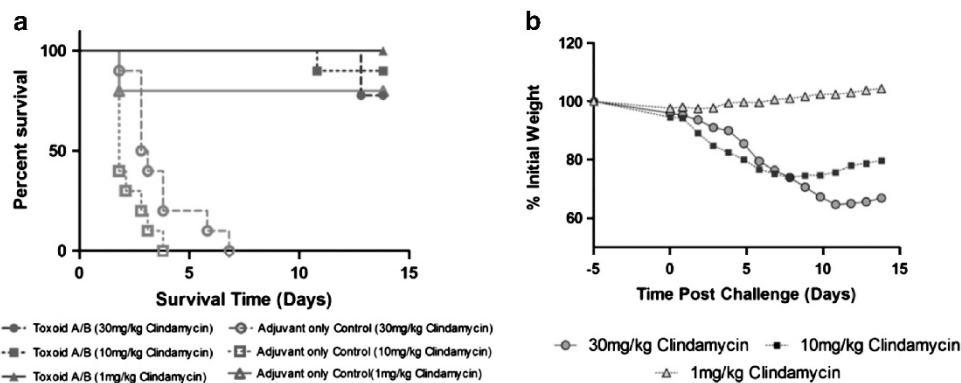
To dissect the effect of antibiotic treatment on the bacterial composition of the gut, microbial profiling was conducted on fecal samples collected from hamsters either before clindamycin treatment or on days 5, 9, 15 and 20 post treatment in the hopes of identifying taxa that might be associated with the inhibitory phenomenon described in Figure 1. Significant microbiome changes were observed between specimens sampled on different days post treatment ( $P < 0.001$ ). Microbiota profiling revealed profound changes in bacterial taxa present in feces, when comparing samples obtained at day 0 and those obtained on day 5 and a subsequent return to near baseline composition by day 20, confirming the observed *in vitro* and *in vivo* time course of susceptibility to *C. difficile* challenge. Using the microarray approach we examined bacterial taxa that demonstrated a change in density in comparison to the undisrupted state.

#### *Distinct microbiomes were associated with the resistant, susceptible and recovered phases*

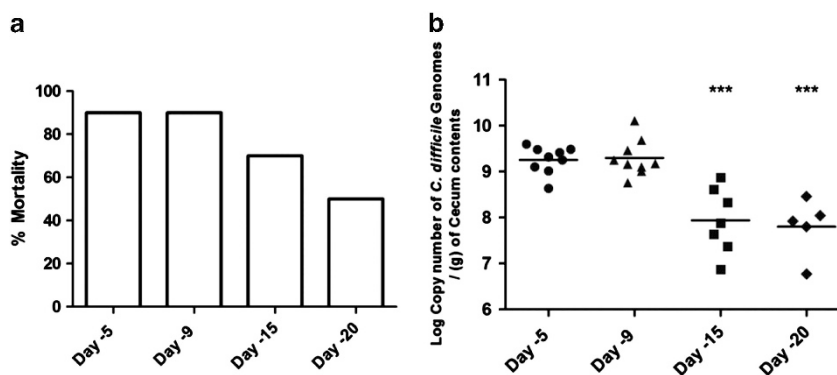
From the results of the *in vitro* and *in vivo* time course experiments described above, three phases were defined: the Resistant Phase on day 0, the Susceptible Phase from days 1 to 9 and the Recovered Phase from days 10 to 20. Two 16S rRNA



**Figure 3** ELISA titers from hamsters immunized with either toxoid A/B or adjuvant only. (a) Anti-toxin A antibodies ( $P > 0.0001$ ) (b) Anti-toxin B antibodies ( $P > 0.0001$ ).



**Figure 4** *In vivo* observations from immunized hamster challenge. (a) (Solid circle dashed line) 30 mg kg<sup>-1</sup> clindamycin-treated and toxoid-immunized hamsters. (Solid square dashed line) 10 mg kg<sup>-1</sup> clindamycin disrupted and toxoid-immunized hamsters. (Solid triangle solid line) 1 mg kg<sup>-1</sup> clindamycin disrupted and toxoid-immunized hamsters. (Open circle dashed line) 30 mg kg<sup>-1</sup> clindamycin disrupted and no vaccine immunized hamsters. (Open square dashed line) 10 mg kg<sup>-1</sup> clindamycin disrupted and no vaccine immunized hamsters. (Open triangle solid line) 1 mg kg<sup>-1</sup> clindamycin disrupted and no vaccine immunized hamsters (b) Percent initial weight loss averaged over the group of toxoid-immunized hamsters for each day of the challenge illustrating the recovery points in the challenge model ( $N = 10$  hamsters per group).



**Figure 5** *C. difficile* introduction timing post disruption. (a) Percent mortality of hamsters by time of spore introduction. (b) 16S qPCR of cecal contents of the hamsters at time of termination. \*\*\* $P < 0.05$  when compared with 5 days post disruption spore challenge ( $N = 10$  hamsters per group).

gene methods were used to track population dynamics, DNA–DNA hybridization-based PhyloChip probe and V4 Illumina MiSeq sequencing. Microbiome dissimilarity between samples was calculated with the Weighted UniFrac method (Lozupone *et al.*, 2006) and visualized using principal coordinate analysis in Figure 6, where each point represents one sample and the distance between points represents the dissimilarity in the types and populations of

microbiota within samples. The level of significance for inter-group dissimilarity was summarized in Supplementary Table S1.

A general agreement between the PhyloChip and V4 community shift data is detailed below and can be summarized with four high level observations: (1) starting gut communities were similar across all treatment groups, (2) high antibiotic dosage had a greater effect than low dosage, which had a greater

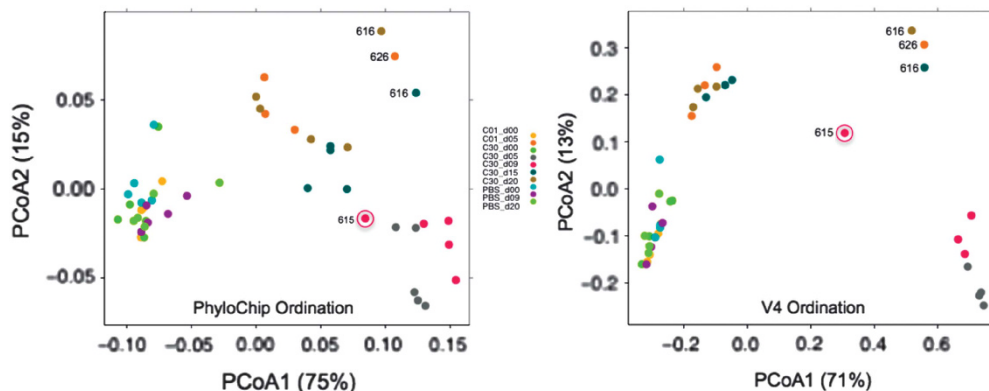
effect than the PBS treatment, (3) recovery was slower than perturbation and was not complete by day 20 and (4) outlier identification was congruent. No significant difference was observed between the three animal treatment groups (PBS, 1 mg kg<sup>-1</sup> and 30 mg kg<sup>-1</sup> clindamycin) on day 0 pre treatment indicating that no group contained a starting community structure which was systematically biased. In other words, all hamsters had similar starting microbiomes. The PhyloChip results revealed that the microbiomes in the PBS-treated hamsters had significantly changed when sampled at different time points ( $P=0.030$ ) as seen by the drift along both principal coordinate analysis (PCoA) axes among the points colored blue, purple and light green. The V4 data did not reveal a community shift over time in the PBS cohort ( $P=0.557$ ). In the low dosage group, which received 1 mg kg<sup>-1</sup> clindamycin, significant microbiome changes greater in magnitude than in the PBS group were demonstrated by day 5 using both technologies as evidenced by the decreases in within:between ratios in Supplementary Table S1. In the high dosage group, the community shift from day 0 to 5 was larger than those observed in the low dose group and even lower within:between ratios resulted.

Samples collected on days 5 and 9, the Susceptible Phase, in the high dosage group, were the most dissimilar from the baseline samples, which were visualized by a large change in their position along PCoA1. Both methods were in agreement in revealing that significant shifts had taken place between days 5 and 9 (PhyloChip,  $P=0.038$ ; V4,  $P=0.022$ ). Both methods also showed that sample C30\_615\_d09 was an outlier along the PCoA primary axis in Figure 6 compared with the other day 9 samples from the high-dose-treated hamsters. C30\_615\_d09 was the only sample from the Susceptible Phase observed as an outlier. Excluding C30\_615\_d09, the PhyloChip PCoA indicated less overlap between day 5 and 9 samples than the V4 PCoA.

The period of time from day 9 to 15 was sufficient for the high-dose hamsters to recover from their *C. difficile* susceptibility and the corresponding microbial community structure was observed to have shifted marginally in the V4 data ( $P=0.061$ ) and significantly in the PhyloChip data ( $P=0.019$ ) towards the baseline structure. Communities on days 15 and 20 were indistinguishable by the Adonis test due to high intra-group variance driven by hamster 616 (Figure 6). Notably, the microbiome from the high dose clindamycin treatment group remained distinct from the baseline microbiome even 20 days post treatment (PhyloChip,  $P=0.013$ ; V4,  $P=0.033$ ) and was not distinct from the day 5 microbiome of the low dose hamsters (PhyloChip,  $P=0.570$ ; V4,  $P=0.742$ ). In summary, a high dose of clindamycin resulted in a rapid microbiome perturbation and associated susceptibility to infection followed by a slower phenotypic recovery and an incomplete return to baseline microbial community structure.

#### Antibiotic treatment affected populations within multiple phyla

Clindamycin treatment was associated with population shifts among multiple phyla. As shown in Supplementary Figure S1 the samples from the same treatment group on the same day were observed to have reproducible proportions in overall hybridization scores and the two largest changes in phylum-level composition were readily observed. In comparison to pre-treated and PBS-treated hamsters, hamsters treated with 30 mg kg<sup>-1</sup> clindamycin proportionally lost *Bacteroidetes* ( $P=2.6 \times 10^{-16}$ ) and gained *Proteobacteria* ( $P=2.8 \times 10^{-20}$ ) by day 5, an observation corroborated by the V4 data (Supplementary Figure S2). In fact, 18 of the 24 phyla tracked demonstrated highly significant shifts ( $P < 1.0 \times 10^{-03}$ ) in populations (Supplementary Table S2), but considering the phylum-level data was normalized to be compositional, or additive to 100%, some changes are likely not independent



**Figure 6** Sample-to-sample weighted UniFrac dissimilarity matrix ordinated by principal coordinate analysis (PCoA) along two axes. Percent of dissimilarity matrix explained by each axis is denoted in parentheses. Color legend applies to both PhyloChip (left) and V4 (right) plots. Selected samples are labeled with hamster number. Points representing sample C30\_615\_d09, the sole outlier in the susceptible phase, are circled in pink.



(Friedman and Alm, 2012). Interesting phyla generally considered as environmental, such as the recently described *Armatimonadetes* (Tamaki *et al.*, 2011) were not only encountered in the fecal samples but demonstrated significant increase in relative abundance after antibiotic application. In terms of fold-change, *Firmicutes*, *Tenericutes* and *Actinobacteria* were more stable than *Bacteroidetes* and *Proteobacteria*. The most significant change in cumulative hybridization scores was a greater threefold increase post antibiotic treatment in *Fusobacteria* ( $P=2.4 \times 10^{-19}$ ) despite this phylum ranking low in the overall proportions. In comparing the phylum composition reported by hybridization and sequencing, a general trend was determined in that the phyla observed with low proportions in the overall hybridization scores were not detected in the V4 sequencing data set.

#### *Distinct OTU population trajectories were observed between the Resistant, Susceptible and Recovered phases*

Both techniques, PhyloChip G3 and V4 sequencing, verified that multiple individual OTUs were significantly altered after the 30 mg kg<sup>-1</sup> clindamycin treatment. Examining all taxa, 887 of 934 PhyloChip OTUs and 380 of 3913 V4 sequencing OTUs achieved a level of significance of  $q < 0.05$  from a three group analysis of variance test, where the three groups were defined as samples from the Resistant Phase at day 0, the Susceptible Phase at days 5 and 9 and the Recovered Phase at days 15 and 20. Outlier sample C30\_615\_d09 was excluded from analysis of variance tests. The population trajectories of the most significantly altered OTUs as assayed via PhyloChip and V4 sequencing revealed that OTUs followed distinct population shifts (Supplementary Figure S3). For example OTUs within *Rikenellaceae* and *Oceanospirillales* were depressed after treatment. In contrast, OTUs within *Ruminococcaceae*, *Enterobacteriaceae*, *Eubacterium* and others were found in a greater abundance in the amplicon community after antibiotic treatment relative to pre treatment. Regardless of the method, OTUs with significant abundance shifts were observed and the directions of population changes across phases were not the same for each OTU.

#### *Putatively protective taxa were identified*

We searched specifically for OTUs significantly reduced in population during the Susceptible Phase of days 5 and 9 when compared with the undisturbed Resistant Phase, followed by a significant increase in the Recovered Phase of days 15 and 20. An OTU meeting these two criteria was considered a PPO. In this analysis, the Resistant Phase was represented by all day 0 samples regardless of treatment arm and all PBS-treated samples regardless of time point. To remove the OTUs demonstrating the PPO pattern due to the time effect alone, those significantly decreased in abundance in PBS-treated hamsters on day 9 were excluded, as were those that

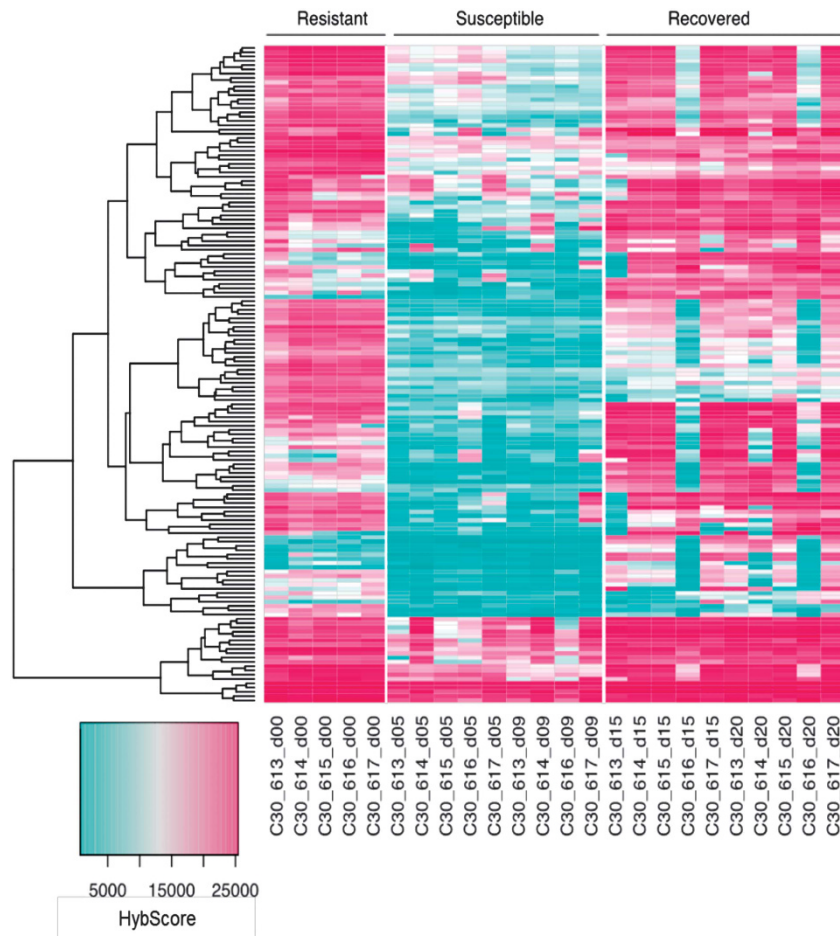
significantly increased in abundance on day 20 compared with day 9. Counts of OTUs retained at each filtering step are presented in Supplementary Table S3. The search found 153 PhyloChip OTUs meeting all criteria even after the Benjamini–Hochberg correction procedure for statistical significance (Figure 7) and zero V4 sequencing OTUs evaluated with the same thresholds. Therefore, the stringency was relaxed for the V4 OTUs to utilize the *P*-values without Benjamini–Hochberg correction to yield eight OTUs (Supplementary Figure S4). The same results were obtained after summarizing all V4 sequence counts into species groups to overcome the potential problem introduced by over-splitting taxa into reference OTUs. The V4 technique found many taxa that diminished with antibiotic treatment, but few that rebounded (Supplementary Figure S5). Integration of the two technologies, as summarized in Table 1, was enabled by mapping both to the same taxonomy revealing the genera *Bacteroides* and *Parabacteroides* to contain PPOs found in both data sets.

The bacterial PPOs that were classified to a recognized genus were then scored from 1 to 5 based on the integrated results across technologies and against public HMP data (Table 1). The purpose was to highlight taxa with the most confirmatory evidence of relevance to human health. *Bacteroides* and *Parabacteroides* contained PPOs found using both technologies and were also prevalent in human stools; thus, they scored a 5. *Bifidobacterium*, *Prevotella*, *Rikenellaceae*, *Flavobacteriaceae*, *Blautia*, *Clostridium*, *Roseburia*, *Ruminococcus* and *Oscillospira* all scored 4 since these groups contained PhyloChip PPOs, were all verified as present in the hamster stools by V4, and have been found in human stools. Three families within *Sphingobacteriales*, namely the *Sphingobacteriaceae*, *Chitinophagaceae* and *Flexibacteraceae*, attained the next highest score of 3 since they have been observed in HMP data but not specifically in HMP stool. It should be mentioned that the HMP 16S rRNA gene surveys were collected with  $\sim 5.0 \times 10^3$  to  $\sim 1.0 \times 10^5$  reads per sample, a depth at which presence/absence data is unreliable (Caporaso *et al.*, 2012), suggesting that alternative scoring schemes such as weighting the hybridization data more heavily could be explored in future investigations. A surprising, albeit low-scoring, observation was the occurrence of the archaeal PPOs *Euryarchaeota* (*Halorubrum* and MOB7-9) and *Crenarchaeota* (pSL4).

## Discussion

The goal of this study was to understand the effects of clindamycin treatment on the gut microbiota of golden Syrian hamsters and the impact of microbiome changes on susceptibility of the hamsters to *C. difficile* colonization, bacterial growth and subsequent disease. We initially observed that fecal extracts, collected from animals 5 days after administration of a single dose of clindamycin, supported





**Figure 7** Population dynamics across time points for high dosage clindamycin group for 153 OTUs putatively protective against *C. difficile* infection. Heat Map coloration represents highest hybridization scores (Hybscores) as red and lowest as blue. Dendrogram at left represents hierarchical clustering of pair-wise Euclidian distances among OTU trajectories.

the germination and growth of *C. difficile* spores on agar plates containing taurocholate to a much greater extent than extracts obtained from animals prior to antibiotic treatment. This observation was manifested by both larger and more numerous clostridial colonies and suggested that residual clindamycin had been cleared from the hamster gut by 5 days after treatment and that the animals were likely susceptible to *C. difficile* challenge. We next wished to examine this phenomenon in greater detail and to understand both the period of susceptibility of hamsters to challenge as well as the role of various microbial taxa in the rendering hamsters resistant to infection so we developed a novel, broth culture method to investigate the effects of fecal extracts obtained at various time points after antibiotic treatment.

The observation that filtered fecal extracts retained factors inhibitory for the growth of *C. difficile* was inconsistent with previous reports suggesting that these components were removed by filtration (Borriello and Barclay, 1986). One possible explanation for this discrepancy was the inclusion of taurocholate in the culture medium used for our experiments. While taurocholate has a role in

*C. difficile* growth through enhancing spore germination, it has also been shown to be metabolized by certain members of the microbiota found in the gut into secondary bile salts (Sorg and Sonenshein, 2008). These secondary bile salts have an inhibitory effect on *C. difficile* growth and germination, as was demonstrated in an *ex vivo* experiment where the cecal contents collected from mice either pre or post antibiotic treatment were mixed with taurocholate (Wilson, 1983; Giel *et al.*, 2010). The investigators reported that the addition of taurocholate to cecal contents from mice that had not been treated with antibiotics yielded substances that were inhibitory to *C. difficile* growth, while taurocholate-supplemented cecal contents from antibiotic treated mice were permissive for *C. difficile* growth. The authors also determined that the cecal microbiota were metabolizing taurocholate into secondary bile salts that were inhibitory for *C. difficile* growth, and that the presence of the enzymes responsible for converting primary bile salts into secondary bile salts were found in equivalent concentrations in both the cecum and in the feces (Coleman *et al.*, 1994; Berr *et al.*, 1996; Thomas *et al.*, 2001), an observation

**Table 1** Taxa containing one or more PPO scored from 1 to 5 based on congruence from hybridization and sequencing techniques and prevalence of the taxon in the human microbiome

	Counts of putatively protective OTUs (PPOs)		Taxon detected in one or more samples		HMP prevalence among stool samples (%)		HMP prevalence among all samples (%)		Final score
	Hyb $q < 0.05$	V4 $P < 0.05$	Hyb	V4	V1-V3	V3-V5	V1-V3	V3-V5	
<i>Archaea</i>									
Crenarchaeota									
pSL4	1		Y						1
Euryarchaeota									
Halorubrum	1		Y						1
MOB7-9	1		Y						1
<i>Bacteria</i>									
<i>Actinobacteria</i>									
<i>Brevibacterium</i>	1		Y				2.4	2.9	2
<i>Microbacterium</i>	1		Y				3.4	2.9	2
<i>Actinoalloteichus</i>	1		Y						1
<i>Bifidobacterium</i>	4		Y	Y	1.1	3.9	1.1	1.2	4
<i>Bacteroidetes</i>									
<i>Bacteroides</i>	10	2	Y	Y	100.0	100.0	42.0	56.2	5
<i>Parabacteroides</i>	7	6	Y	Y	89.3	89.7	17.5	24.7	5
<i>Prevotella</i>	5		Y	Y	47.6	47.0	80.0	83.1	4
Rikenellaceae	38		Y	Y	62.6	58.9	19.2	27.9	4
Flavobacteriaceae	1		Y	Y	12.3	5.0	70.1	71.8	4
Chitinophagaceae	1		Y	Y			2.9	1.6	3
Flexibacteraceae	2		Y	Y			2.4	2.5	3
	1		Y	Y			2.3	2.2	3
<i>Sphingobacteriaceae</i>									
<i>Cyanobacteria</i>									
Streptophyta	1		Y	Y	0.5	0.6	8.2	18.7	4
<i>Firmicutes</i>									
<i>Bacillus</i>	2		Y			0.3	4.9	5.6	3
<i>Blautia</i>	1		Y	Y	95.2	97.8	16.1	18.7	4
<i>Clostridium</i>	1		Y	Y	96.3	98.1	13.0	16.2	4
<i>Roseburia</i>	1		Y	Y	97.9	95.6	18.3	19.9	4
<i>Ruminococcus</i>	1		Y	Y	93.6	78.0	14.1	17.9	4
<i>Bacteroides</i>	1		Y	Y	21.4		1.6		4
<i>Oscillospira</i>	2		Y	Y	96.8	97.5	14.1	17.0	4
<i>Proteobacteria</i>									
Rhodospirillaceae	2		Y				0.6	2.0	2
<i>Spirochaetes</i>									
<i>Treponema</i>	1		Y						1

Abbreviations: HMP, human microbiome project; Hyb, hybridization; OTU, operational taxonomic unit; PPO, putatively protective OTU; Y, yes. Taxa are grouped by kingdom and phylum. In the Archaea, candidate taxa are also presented.

recently supported by meta-metabolomic profiling (Theriot *et al.*, 2014). A recent report by Howerton *et al.* (2013) described the use of a synthetic derivative of taurocholate, CamSA, which is a competitive inhibitor of taurocholate-induced spore germination that protected mice from challenge with a large number of *C. difficile* spores, further implicating the critical role of bile salts in the regulation of spore germination. While our data suggests a role for microbiome conversion of primary to secondary bile salts in the inhibition of *C. difficile* spore germination and growth, we have not directly measured bile salts in hamster feces and therefore cannot rule out the impact of other soluble factors on *C. difficile*-induced disease.

We subsequently asked if the *in vitro* evaluation of fecal extracts collected at various time points following antibiotic administration could be used to determine the corresponding *in vivo* susceptibility of Syrian

hamsters to *C. difficile* challenge. Fecal extracts from naïve hamsters were inhibitory for *C. difficile* growth while extracts obtained from clindamycin-treated hamsters supported *C. difficile* growth. Using fecal extracts from samples collected in a longitudinal study, a plot was generated which strongly resembled the theoretical plot of *C. difficile* risk presented by Rupnik *et al.* (2009) as well as results reported by Abujamel *et al.* (2013), which demonstrated that stool suspensions collected from patients undergoing antibiotic therapy were permissive to *C. difficile* growth for a period of ~14 to 21 days after the clearance of the antibiotics.

We next attempted to correlate the growth inhibitory effect of fecal extracts with resistance to challenge with *C. difficile* spores. Because clindamycin-treated hamsters are exquisitely sensitive to challenge with this bacterium, we monitored survival in hamsters immunized with a vaccine

consisting of toxoids prepared from the two major toxins produced by the organism, *C. difficile* toxin A and toxin B. Animals challenged with the *C. difficile* strain VPI 10463 demonstrated clinical symptoms of disease including a profound decrease in body weight. By monitoring body weight of challenged animals, we were able to determine that the time point at which the hamsters began regaining weight corresponded with the point at which the fecal extracts began to recover their ability to inhibit the growth of *C. difficile*. This effect was extrapolatable across multiple dose levels of clindamycin. In addition, animals treated with only very low doses of clindamycin (1 mg kg<sup>-1</sup>) were uniformly resistant to *C. difficile* challenge, regardless of their immunization status, presumably due to an incomplete disruption of their microbial flora.

We also examined the recovery of the hamsters' resistance to *C. difficile* challenge in naive hamsters to determine the period of microbiome disruption following antibiotic treatment. To do this, we challenged animals either 5, 9, 15 or 20 days following microbiota disruption with clindamycin. We observed a return of the resistance to infection beginning around 15 days post disruption as these animals were less likely to succumb to CDI with lower levels of *C. difficile* colonization detected in surviving animals. Indeed, by 20 days post disruption, 50% of the animals survived challenge (Figure 5b). The confluence of this result with the *in vitro* analysis described above suggest that measuring the inhibitory activity of fecal extracts may be a useful surrogate for predicting the *in vivo* susceptibility of hamsters to CDI.

The clindamycin-induced microbiome perturbation in the hamster model was in general concordance with past reports in mice, where *Enterobacteriaceae* were observed to rapidly expand and multiple families within diverse phyla decline (Buffie *et al.*, 2012; Lawley *et al.*, 2012). Our study expands on this knowledge by observing significant changes *in vivo* over a greater number of phyla and by directly linking the temporal microbiome shifts to *C. difficile* suppression *in vitro*.

Using the longitudinal molecular profiling data on the hamster microbiome, we found genera of gut bacteria that were suppressed by clindamycin at an early time point and rebounded in abundance by day 15 post clindamycin treatment. The PPOs within Bacteroides, Clostridia and Bifidobacterium were among the groups shown to be negatively affected by clindamycin treatment and these genera are known to produce the enzyme responsible for converting taurocholate into inhibitory secondary bile salts (White *et al.*, 1981; Gustafsson *et al.*, 1998; Ridlon *et al.*, 2006). From our observations, it appears that the protective genera for hamsters intersect but do not co-inside with those for mice, since past reports demonstrate that additional genera outside those listed in Table 1 were able to resolve CDI in C57BL/6 mice (Lawley *et al.*, 2012).

Interestingly, genera associated with susceptibility were also uncovered. For instance, the PhyloChip but not V4 sequencing reported the presence and antibiotic-associated increase in Chloroflexi and *Planctomycetes* (Supplementary Table S2), known to be rare members of the healthy mammalian microbiome (DeSantis *et al.*, 2006; Yildirim *et al.*, 2010) and which are resistant to antibiotics (Bunge *et al.*, 2008; Cayrou *et al.*, 2010). These findings suggest that a more comprehensive view of population dynamics was achieved by employing the hybridization assay compared with sequencing alone.

The data presented here provide a useful tool for predicting the effect of microbiome disruption and its relation to CDI risk in hamsters. They also suggest that bacteria commonly associated with bile salt metabolism may be responsible for inhibition of *C. difficile* growth *in vivo* in hamsters. The translation of the hamster model to natural infection in humans could provide some exciting new possibilities in the *C. difficile* field. By screening patients for susceptibility to CDI, it should be possible to identify a population at greater risk for disease and allow for intervention by microbiome manipulation or immunization with vaccines or monoclonal antibodies to prevent subsequent infection. This technique may also allow the development of a novel screening method for therapeutic agents, which spare beneficial bacteria in the gut hence preserving the resistance to infection in treated individuals.

## Conflict of Interest

All authors are either current or former employees of Merck & Co or Second Genome Inc and may hold financial interests in one or both companies.

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## References

- Abujamel T, Cadnum JL, Jury LA, Sunkesula VC, Kundrapu S, Jump RL *et al.* (2013). Defining the vulnerable period for re-establishment of *Clostridium difficile* colonization after treatment of *C. difficile* infection with oral vancomycin or metronidazole. *PLoS One* **8**: e76269.
- Berr F, Kullak-Ublick GA, Paumgartner G, Munzing W, Hylemon PB. (1996). 7 alpha dehydroxylating bacteria enhance deoxycholic acid input and cholesterol saturation of bile in patients with gallstones gastroenterology. *Gastroenterology* **111**: 1611–1620.
- Borriello SP, Barclay FE. (1986). An *in-vitro* model of colonisation resistance to *Clostridium difficile* infection. *J Med Micro* **21**: 299–309.
- Buffie CG, Jarchum I, Equinda M, Lipuma L, Gobourne A, Viale A *et al.* (2012). Profound alterations of intestinal



- microbiota following a single dose of clindamycin results in sustained susceptibility to *Clostridium difficile*-induced colitis. *Infect Immune* **80**: 62–73.
- Bunge M, Wagner A, Fischer M, Andreesen JR, Lechner U. (2008). Enrichment of a dioxin-dehalogenating *Dehalococcoides* species in two-liquid phase cultures. *Environ Microbiol* **10**: 2670–2683.
- Caporaso JG, Lauber C, Walters WA, Berg-Lyons D, Lozupone CA, Turnbaugh PJ *et al.* (2011). Global patterns of 16S rRNA diversity at a depth of millions of sequences per sample. *Proc Natl Acad Sci USA* **15**: 4516–4522.
- Caporaso JG, Paszkiewicz K, Field D, Knight R, Gilbert JA. (2012). The Western English Channel contains a persistent microbial seed bank. *ISME J* **10**: 1089–1093.
- Cayrou C, Raoult D, Drancourt M. (2010). Broad-spectrum antibiotic resistance of *Planctomycetes* organisms determined by Etest. *J Antimicrob Chemother* **65**: 2119–2122.
- Coleman JP, Hudson LL, Adams MJ. (1994). Characterization and regulation of the NADP-linked 7 alpha-hydroxysteroid dehydrogenase gene from *Clostridium sordellii*. *J Bacteriol* **176**: 4865–4874.
- DeSantis TZ, Hugenholz P, Larsen N, Rojas M, Brodie EL, Keller K *et al.* (2006). Greengenes, a chimera-checked 16S rRNA gene database and workbench compatible with ARB. *Appl Environ Microbiol* **72**: 5069–5072.
- Friedman J, Alm EJ. (2012). Inferring correlation networks from genomic survey data. *PLoS Comput Biol* **8**: e1002687.
- Giel JL, Sorg JA, Sonenshein AL, Zhu J. (2010). Metabolism of bile salts in mice influences spore germination in *Clostridium difficile*. *PLoS One* **5**: 1–7.
- Gustafsson A, Norin E, Midtvedt T. (1998). Effect of clindamycin given alone or with *Lactobacillus delbrueckii* and *Streptococcus thermophilus* on 7 alpha dehydroxylation of bile acids in rats. *Clin Microbiol Infect* **4**: 594–598.
- Hazen TC, Dubinsky EA, DeSantis TZ, Andersen GL, Piceno YM, Singh N *et al.* (2010). Deep-sea oil plume enriches indigenous oil-degrading bacteria. *Science* **330**: 204–208.
- Howerton A, Patra M, Abel-Santos E. (2013). A new strategy for the prevention of *Clostridium difficile* infection. *J Infect Dis* **207**: 1498–1504.
- Human Microbiome Project Consortium (2012). Structure, function and diversity of the healthy human microbiome. *Nature* **486**: 207–214.
- Kuczynski J, Stombaugh J, Walters WA, González A, Caporaso JG, Knight R. (2011). Using QIIME to analyze 16S rRNA gene sequences from microbial communities. *Curr Protoc Microbiol*; Chapter 10:Unit 10.7. doi: 10.1002/0471250953.bi1007s36.
- Lawley TD, Clare S, Walker AW, Stares MD, Connor TR, Raisen C *et al.* (2012). Targeted restoration of the intestinal microbiota with a simple, defined bacteriotherapy resolves relapsing *Clostridium difficile* disease in mice. *PLoS Pathogens* **8**: e1002995.
- Long Sterling K, Williams OB. (1958). Method for removal of vegetative cells from bacterial spore preparations. *J Bacteriol* **76**: 332–332.
- Lozupone C, Hamady M, Knight R. (2006). UniFrac—an online tool for comparing microbial community diversity in a phylogenetic context. *BMC Bioinformatics* **7**: 371.
- McDonald D, Price MN, Goodrich J, Nawrocki EP, DeSantis TZ, Probst A *et al.* (2012). An improved Greengenes taxonomy with explicit ranks for ecological and evolutionary analyses of bacteria and archaea. *ISME J* **6**: 610–618.
- Penders J, Vink C, Driessen C, London N, Thijs C, Stobberingh EE. (2005). Quantification of *Bifidobacterium* spp., *Escherichia coli* and *Clostridium difficile* in faecal samples of breast-fed and formula-fed infants by real-time PCR. *FEMS Microbiol Lett* **243**: 141–147.
- Poutanen SM, Simor AE. (2004). *Clostridium difficile*-associated diarrhea in adults. *Can Med Assoc J* **171**: 51–58.
- Edgar RC. (2010). Search and clustering orders of magnitude faster than BLAST. *Bioinformatics* **26**: 2460–2461.
- Ridlon JM, Kang DJ, Hylemon PB. (2006). Bile salt biotransformations by human intestinal bacteria. *J Lipid Res* **47**: 241–259.
- Rupnik M, Wilcox MH, Gerding DN. (2009). *Clostridium difficile* infection: new developments in epidemiology and pathogenesis. *Nat Rev Microbiol* **7**: 526–536.
- Sambol SP, Tang JK, Merrigan MM, Johnson S, Gerding DN. (2001). Infection of hamsters with epidemiologically important strains of *Clostridium difficile*. *J Infect Dis* **183**: 1760–1766.
- Schloss PD, Westcott SL, Ryabin T, Hall JR, Hartmann M, Hollister EB *et al.* (2009). Introducing mothur: open-source, platform-independent, community-supported software for describing and comparing microbial communities. *Appl Environ Microbiol* **75**: 7537–7541.
- Sorg JA, Sonenshein AL. (2008). Bile salts and glycine as co-germinants for *Clostridium difficile* spores. *J Bacteriol* **190**: 2505–2512.
- Tamaki H, Tanaka Y, Matsuzawa H, Muramatsu M, Meng XY, Hanada S *et al.* (2011). *Armatimonas rosea* gen. nov., sp. nov., of a novel bacterial phylum, Armatimonadetes phyl. nov., formally called the candidate phylum OP10. *Int J Syst Evol Microbiol* **61**: 1442–1447.
- Theriot CM, Koenigsknecht MJ, Carlson Jr PE, Hatton GE, Nelson AM, Li B *et al.* (2014). Antibiotic-induced shifts in the mouse gut microbiome and metabolome increase susceptibility to *Clostridium difficile* infection. *Nat Commun* **5**: 3314.
- Thomas LA, Veysey MJ, French G, Hylemon PB, Murphy GM, Dowling RH. (2001). Bile acid metabolism by fresh human colonic contents: a comparison of cecal versus faecal samples. *Gut* **49**: 835–842.
- van Nood E, Vrieze A, Nieuwdorp M, Fuentes S, Zoetendal EG, de Vos WM *et al.* (2013). Duodenal infusion of donor feces for recurrent *Clostridium difficile*. *NEJM* **368**: 407–415.
- White BA, Cacciapuoti AF, Fricke RJ, Whitehead TR, Mosbach EH, Hylemon PB. (1981). Cofactor requirements for 7 alpha dehydroxylation of cholic and chenodeoxycholic acid in cell extracts of the intestinal anaerobic bacterium, *Eubacterium* species V.P.I. 12708. *J Lipid Res* **22**: 891–898.
- Wilson KH. (1983). Efficiency of various bile salt preparations for stimulation of *Clostridium difficile* spore germination. *J Clin Microbiol* **18**: 1017–1019.
- Yildirim S, Yeoman CJ, Sipos M, Torralba M, Wilson BA, Goldberg TL *et al.* (2010). Characterization of the fecal microbiome from non-human wild primates reveals species specific microbial communities. *PLoS One* **5**: e13963.

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