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ORIGINAL ARTICLE Reset of a critically disturbed microbial ecosystem: faecal transplant in recurrent *Clostridium difficile* infection

Susana Fuentes¹, Els van Nood², Sebastian Tims¹, Ineke Heikamp-de Jong¹, Cajo JF ter Braak³, Josbert J Keller^{2,4}, Erwin G Zoetendal¹ and Willem M de Vos^{1,5} ¹Laboratory of Microbiology, Wageningen University, Wageningen, The Netherlands; ²Department of Internal Medicine, Academic Medical Center, University of Amsterdam, Amsterdam, The Netherlands; ³Biometris, Wageningen University, Wageningen, The Netherlands; ⁴Department of Gastroenterology, Haga teaching hospital, The Hague, The Netherlands and ⁵Departments of Bacteriology and Immunology, and Veterinary Biosciences, University of Helsinki, Helsinki, Finland

Recurrent *Clostridium difficile* infection (CDI) can be effectively treated by infusion of a healthy donor faeces suspension. However, it is unclear what factors determine treatment efficacy. By using a phylogenetic microarray platform, we assessed composition, diversity and dynamics of faecal microbiota before, after and during follow-up of the transplantation from a healthy donor to different patients, to elucidate the mechanism of action of faecal infusion. Global composition and network analysis of the microbiota was performed in faecal samples from nine patients with recurrent CDI. Analyses were performed before and after duodenal donor faeces infusion, and during a follow-up of 10 weeks. The microbiota data were compared with that of the healthy donors. All patients successfully recovered. Their intestinal microbiota changed from a low-diversity diseased state, dominated by Proteobacteria and Bacilli, to a more diverse ecosystem resembling that of healthy donors, dominated by Bacteroidetes and Clostridium groups, including butyrate-producing bacteria. We identified specific multi-species networks and signature microbial groups that were either depleted or restored as a result of the treatment. The changes persisted over time. Comprehensive and deep analyses of the microbiota of patients before and after treatment exposed a therapeutic reset from a diseased state towards a healthy profile. The identification of microbial groups that constitute a niche for C. difficile overgrowth, as well as those driving the reinstallation of a healthy intestinal microbiota, could contribute to the development of biomarkers predicting recurrence and treatment outcome, identifying an optimal microbiota composition that could lead to targeted treatment strategies.

The ISME Journal (2014) **8**, 1621–1633; doi:10.1038/ismej.2014.13; published online 27 February 2014 **Subject Category:** Microbe-microbe and microbe-host interactions

Keywords: faecal microbiota transplantation; C. difficile infection; HITChip; intestinal microbiota

Introduction

During the last decade, the incidence and severity of diarrhoea associated with *Clostridium difficile* infection (CDI) has markedly increased (Kelly and LaMont, 2008; Khoruts and Sadowsky, 2011). *C. difficile* is a Gram-positive, anaerobic, toxinproducing bacterium that typically affects the elderly and hospitalized patients following antibiotic use. However, the emergence of more virulent and antibiotic-resistant strains has made CDI an important health issue not only in other populations,

E-mail: susana.fuentes@wur.nl

such as patients suffering from inflammatory bowel disease (Ananthakrishnan *et al.*, 2009) but also in populations typically considered as healthy (Kelly and LaMont, 2008). Recurrences are a frequent and severe complication of CDI and can affect over 30% of the patients (Bakken *et al.*, 2011; Gough *et al.*, 2011).

Therapies include, among others, antibiotic therapy effective in 70–85% of patients with an initial episode of CDI, but only in ~30% of patients with subsequent relapses (van Nood *et al.*, 2013). However, currently, the only effective treatment option for longstanding recurrent CDI is faecal microbiota transplantation (FMT) or donor faeces infusion, with a cure rate of 94% in patients with antibiotic refractory disease (van Nood *et al.*, 2013; Vrieze *et al.*, 2013). FMT is defined as the transfer of intestinal microbiota from a healthy donor that leads

Correspondence: S Fuentes, Laboratory of Microbiology, Wageningen University, Dreijenplein 10 (building 316), 6703 HB Wageningen, The Netherlands.

Received 29 July 2013; revised 25 November 2013; accepted 9 January 2014; published online 27 February 2014

to the restoration of a stable microbial community in the gut (Borody and Khoruts, 2011; Lo Vecchio and Zacur, 2012). Although FMT has been documented to exist for over 1000 years (Zhang et al., 2012; de Vos, 2013), its application in the medical field was again reported over 50 years ago (Eiseman et al., 1958). Since then, FMT has been used to treat over 500 cases of CDI and other disorders with a disturbed intestinal microbiota (Borody et al., 2003; Landy et al., 2011; Vrieze et al., 2012; Kassam et al., 2013). Although it is generally believed that the efficacy of FMT can be explained by restoration of healthy gut microbiota, there are still few studies addressing the microbial composition and dynamics triggered by FMT (Khoruts et al., 2010; Manichanh et al., 2010; Rea et al., 2011; Petrof et al., 2013).

The intestinal microbiota constitutes an organ by itself, with digestive functions and specific metabolic and signalling networks established between microorganisms and the host (Zoetendal et al., 2008; Aziz et al., 2013). It is shaped by over 1000 specieslike phylotypes and dominated by microorganisms, many of them not yet cultured, belonging to five major phyla (that is, Firmicutes, Bacteroidetes, Actinobacteria, Proteobacteria and Verrucomicrobia). The complexity of the intestinal microbial communities requires the application of highthroughput techniques, including metagenomics and 16S rRNA-based approaches. The microbiota composition fluctuates around a stable individual core, and the homoeostasis of this intestinal ecosystem has been shown to be a key factor in the maintenance of health and development of disease (Jalanka-Tuovinen et al., 2011; Rajilic-Stojanovic et al., 2012; Faith et al., 2013). Recently, a metagenomics analysis of European subjects showed that the intestinal microbiota of individuals can be assigned to one of three groups, named enterotypes, based on composition and relative abundance of certain key bacterial groups (Arumugam et al., 2011), which can fluctuate over time (Wu et al., 2011; Rajilic-Stojanovic *et al.*, 2012). Currently, however, this concept is under extensive debate, where researchers rather favour a continuous gradient as opposed to separate enterotypes (Huse et al., 2012; Jeffery et al., 2012; Yong, 2012). Independent of whether these are distinct clusters or gradients, specific patterns of microbiota composition can be assigned not only in the gut but also across the human body (Koren et al., 2013), which could be of relevance in disease (Jeffery et al., 2012; Zupancic *et al.*, 2012).

Patients with CDI harbour an intestinal microbiota with a characteristic reduced diversity owing to antibiotic use (Chang *et al.*, 2008; Shahinas *et al.*, 2012). We hypothesized that patients with recurrent CDI also show a composition favourable for the overgrowth of *C. difficile*, lacking specific signature microbes that prevent them to return to a sustainable homeostatic status after infection, resulting in recurrences. The goal of the present study was to detail the microbiota of patients with recurrent CDI, and to monitor its dynamics following FMT, by identifying potential signature microbes and key networks present in both healthy donors and patients. These results could expand the microbial knowledge of recurrent CDI, beneficial not only for early diagnostics but also for the development of novel general or individualized treatment strategies. Understanding how microbes behave during FMT and identifying an optimal microbiota composition that prevents recurrences could assist in the selection of optimal microbial features of a transplanted microbiota for a successful outcome.

Materials and methods

Study design and population

Nine patients with recurrent CDI who were treated with FMT in a randomized open label trial (the FECAL trial) (van Nood *et al.*, 2013) were studied. Available isolates of *C. difficile* were analysed by PCR ribotyping (Paltansing et al., 2007). Five patients were initially randomized to FMT; four patients were initially randomized to vancomycin treatment and received FMT after antibiotic treatment failed. To prepare for FMT, patients received 4 or 5 days vancomycin 500 mg four times a day followed by bowel lavage using a macrogol solution on the last day of antibiotic treatment. The next day, 500 ml of a solution consisting of > 75 g of donor faeces mixed with isotonic saline was infused through a nasoduodenal tube at a rate of $\sim 20 \text{ ml min}^{-1}$. Faeces for FTM were collected from donors on the day of treatment and immediately transported to the hospital in a clean plastic container. The donor faeces solution was infused within 6 h after collection of the faeces by the donor. Faecal samples were collected from donors and patients before FMT (day 0) and from patients at days 14, 21, 35 and 70 after treatment and stored at -80 °C until microbial analysis was performed.

A detailed protocol of donor selection, preparation of the donor faeces solution and follow-up of patients was described previously (van Nood *et al.*, 2013). One of the donors (donor D4) was used in four different patients for FMT, owing to ready access to this donor. The FECAL trial was conducted at the Academic Medical Center Amsterdam, the Netherlands, and the research protocol was approved by its Ethics Committee (Netherlands Trial Register; www.trialregister.nl, number NTR1177). All participants were personally informed, received information and provided written consent before the study. Baseline demographics and clinical information are listed in Supplementary Table 1.

Microbiota composition: networks and dynamics

DNA was isolated from faecal samples as previously described (Salonen *et al.*, 2010) and used for the

characterization of the intestinal microbiota composition using the Human Intestinal Tract Chip (HITChip), a phylogenetic microarray containing a duplicated set of over 5000 probes based on 16S rRNA gene sequences of 1140 intestinal bacterial phylotypes (Rajilic-Stojanovic *et al.*, 2009). This microarray provides information regarding both composition and relative quantity of bacteria that make up the human intestinal tract communities. Detailed information on HITChip procedure is provided as Supplementary Material.

To monitor the microbial dynamics as a result of FMT, a 1% relative abundance threshold was defined and bacterial groups above the threshold were followed for 10 weeks. The cumulative relative abundance of the bacterial groups that passed the threshold (that is, relative abundance above 1%) accounted from 76–90% of the total intestinal microbiota in donors' samples and patients' samples from day 0 to the end of the trial. Phylogenetic groups found above the threshold in donors' samples and absent (or below threshold) in patients' samples at day 0 were called 'donor signature' groups. Conversely, groups found in patient samples before FMT and not in donor samples were termed 'CDI signature' groups.

In addition, a series of co-(and anti)occurrence networks were determined across individuals and calculated for donors, and for patients before and for 5 weeks after intervention. These networks were built using Spearman correlations calculated based on the abundance of the 130 bacterial groups (at the approximate genus level) targeted by the HITChip, using thresholds of $\rho > |0.8|$ and relative abundance > 0.1%. Networks were visualized using the Gephi network visualization and exploration platform (Bastian *et al.*, 2009).

The stability of the microbial composition established after FMT was evaluated by comparison of the signals for all probes included in the HITChip using the Pearson moving-window correlation of consecutive samples.

Statistical analyses

The bacterial composition of the samples was compared at the phylum level (grouped at the class level for the Firmicutes) and at the approximate genus level (130 phylogenetic groups with >90% 16S rRNA gene sequence similarity; (Rajilic-Stojanovic *et al.*, 2009)) using the Wilcoxon signed-rank test corrected for false discovery rate, in which a corrected P < 0.05 was considered significant. Same testing was applied for bacterial diversity (Shannon index; (Magurran, 2004)), richness and evenness (Pielou's evenness index).

Similarity indices were calculated with the Pearson product moment correlation on the log-transformed signal intensities of all probes included in the HITChip microarray. This represents how similar the microbiota profiles are between the different samples.

Multivariate statistical analyses were performed with Canoco 5 (ter Braak and Smilauer, 2012). Principal component analysis was performed on log-transformed probe signal intensity profiles derived from the HITChip phylogenetic microarray. Principal response curve (PRC) analysis was used to graphically summarize the global differences in the microbiota composition between patients and their respective donors over time (van den Brink and ter Braak, 1999). PRC combines the amounts of taxa, after logarithmic transformation, to a new single variable. The taxa with large deviations weigh high in this combination, whereas taxa that have equal amounts in patients and donors have zero weight. The quality of the PRC graph is expressed by the ratio of the variance explained by the PRC axis and the variance of all deviations across time. For details on interpretation and implementation see Supplementary Material.

Results

Changes in microbiota composition in CDI as a result of FMT

Nine patients with recurrent CDI caused by a variety of C. difficile ribotypes were treated by FMT with microbiota from a total of six healthy donors, one of which (donor D4) donated four times. All patients were cured by FMT without recurrence during follow-up and to date. Faecal samples were collected from donors (at day 0), and from patients before and four times after FMT during a follow-up period of 10 weeks. The microbiota composition of the donors' samples before and after the dilution and filtration showed a high overall similarity (average Pearson correlation coefficient $> 88 \pm 4\%$, Supplementary Table 3). Hierarchical clustering showed that samples from patients after FMT were notably more similar to donor profiles than to their own profiles at day 0 (Figure 1a; Supplementary Figure 1).

FMT had a marked effect on diversity, richness and evenness of the microbiota of CDI patients (Figure 1b). Before FMT (day 0), patients showed significantly lower diversity levels compared with healthy donors (4.5 ± 0.4 and 5.7 ± 0.2 respectively, P = 0.00006), which were increased and maintained after FMT, with scores at day 70 (5.7 ± 0.3) in the range of those of healthy donors. A similar significant increase was observed for richness and evenness levels, lower in patients with recurrent CDI before FMT and successfully restored and maintained after treatment.

Comparison of the microbiota composition in patients with recurrent CDI revealed an immediate shift after FMT to a distribution more similar to that of healthy donors, both individually per patient and globally in all patients (Figure 2a). Before FMT, CDI patients showed a common characteristic profile dominated by members of the Proteobacteria and Bacilli. All post-transplant samples were enriched



Figure 1 (a) Hierarchical cluster with a heatmap of samples from patient P4 and its corresponding donor (D4). (b) Diversity, richness and evenness scores for healthy donors and CDI patients before and after faecal transplantation. Symbols correspond to individual patients, and average values are shown with black lines. Day 0 averages for diversity, richness and evenness are significantly different to donors and the rest of the time points (P < 0.003).



Figure 2 (a) Faecal microbiota composition at the phylum level (class level for the Firmicutes) of healthy donors and CDI patients before and after faecal transplant (shown are groups with relative abundance >0.5%). (b) Heatmap of relative abundances of bacterial groups (approximate genus level) that differ significantly between donors and CDI patients before faecal transplant and at the end of the study (P<0.05).

with bacteria from the Bacteroidetes and *Clostridium* clusters IV and XIVa, the latter two groups being recognized to include most of the known intestinal butyrate producers. These *Clostridium* clusters, normally representative of healthy donor microbiota, also increased in diversity (Supplementary Table 4).

Differences in the microbiota were also found when compared at a higher resolution at the approximate genus level (Figure 2b). As expected, a pronounced contrast was found between healthy donors and pre-transplantation samples (day 0). Relative abundances of 41% of the genus-level phylogenetic groups targeted by the HITChip were significantly different between donors and CDI patients before FMT (P < 0.05). These differences were largely reduced after FMT, with only 13% of all groups remaining different at day 70 (Supplementary Table 2). The microbiota of the CDI patients were characterized by a high level of signals derived from potentially pathogenic taxa belonging to the Proteobacteria (for example, *Enterobacter, Klebsiella, Sutterella* or *Proteus* spp.). After FMT, these groups returned to low levels

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comparable to those found in the microbiota of healthy individuals.

Effect of the donor microbiota on post-transplant ecosystem

To predict optimal features of a microbiota that leads to a successful FMT, we compared samples from patients that received material from the same donor (donor D4, n=4) and those receiving from different donors (n=5). The microbiota of D4 was stable between the different samples provided, with an average similarity index of 0.93 ± 0.02 , a value in line with those previously observed for healthy adults (Rajilic-Stojanovic *et al.*, 2012; Figure 3a).

When comparing the microbiota composition of patients and donors before FTM, those assigned to D4 and the ones assigned to different donors showed comparable low similarity values with their respective donors ($r=0.35\pm0.19$ or $r=0.34\pm0.07$, respectively). However, at the end of the trial,



Figure 3 Pearson's similarity indices at the probe level of the HITChip microarray. (a) Similarity of microbiota composition of samples of donor D4 (four different FMT samples); donor D4 and other donors and CDI patients at day 0; CDI patients receiving from donor D4 and other donors at the end of the trial (*P=0.01); donor D4 and other donors and CDI patients at day 70. (b) Similarity of microbiota composition of all donors and CDI patients over time; similarity of samples from CDI patients at day 70 compared with their own day 0 and their corresponding donor (*P=0.0001).

samples from patients assigned to D4 were found to be significantly more similar between them $(r=0.73\pm0.05)$ than when comparing those receiving from different donors $(r=0.65\pm0.04, P=0.01)$. Interestingly, at the end of the trial the similarity of patients' microbiota with their corresponding donors tended to be higher in patients receiving FMT from D4 $(r=0.79\pm0.08)$ than in those obtaining from other donors $(r=0.66\pm0.11)$, although this difference was not significant (P=0.08) (Figure 3a). This suggests that some microbiota compositions may leave a more prevalent and stable imprint on the patients' faecal microbial composition, which is maintained even between different individuals.

A more detailed analysis of the microbiota of D4 revealed a significantly higher abundance of *Bacteroides* spp. (more specifically those related to *B. intestinalis*, *B. plebeius* and *B. uniformis*) as compared with other donors, with average relative abundances of $3.81 \pm 0.31\%$ for D4 and $1 \pm 0.12\%$ for other donors (P = 0.01).

Reshape and network dynamics of the microbial environment after FMT

As indicated above, FMT had an immediate repairing effect on the intestinal microbiota of CDI patients. To further investigate how microbes behave during transplant by looking at global dynamics triggered by the treatment, we developed an approach to identify potential signature bacterial characteristic of CDI as well as those responsible for microbiota restoration. These signature bacterial groups were selected based on their relative abundance (over 1%) and monitored throughout the duration of the study (Supplementary Figure 2; Figure 4). 'CDI signature' groups, initially accounting for almost half of the total microbiota of the patients at day 0 $(41 \pm 22.1\%)$, were reduced over fivefold just 14 days after FMT (to $6.5 \pm 2.8\%$). Simultaneously, the 'donor signature' groups absent in CDI patients at day 0 increased to $22.8 \pm 8.4\%$. These changes were maintained for the 10-week duration of the study, as seen by the monitoring of the relative abundance of the different signature groups.

Among the donor signature bacteria increasing in patients after FMT, members of the Bacteroidetes as well as butyrate producers from *Clostridium* clusters IV and XIVa were found, including those related to *Faecalibacterium prausnitzii* and *Butyrivibrio crossotus* (Table 1). Among the CDI signature groups displaced by the intervention, we found populations of bacteria generally occurring at lower densities in the small intestine such as *Enterococcus*, *Lactobacillus* or *Veillonella*. Remarkably, the levels of potentially pathogenic bacteria were reduced, including *C. difficile* that dropped immediately from $4 \pm 2.1\%$ at day 0 to $0.2 \pm 0.2\%$ post transplant, the latter values being similar to those found in healthy





Figure 4 Reshape of the intestinal microbial environment as a result of faecal transplantation. Bacterial signature groups (relative abundance >1%) were followed up for a period of 10 weeks after FMT. Changes in 'donor signature', 'CDI signature', 'donor+CDI (common)' and 'non-signature' phylotypes over time.

donors. Proteobacteria, such as *Enterobacter* aerogenes and *Escherichia coli*, changed from $4.6 \pm 9.9\%$ at day 0 to $0.1 \pm 0.1\%$ 14 days after the intervention. These findings confirm an immediate shift from an ecosystem dominated by potentially pathogenic bacteria to a donor-like microbiota.

An in-depth analysis of co- and anti-occurrence networks strengthened the concept of the phylum Bacteroidetes as an essential component in this process (Figure 5). A network formed by members of this phylum, central in the microbiota from healthy donors, was absent in networks of CDI patients at day 0, with members of this network being even below the selected threshold. Microbial networks observed in the faecal profiles of CDI patients were characterized by a dominance of potential pathogens such as Klebsiella pneumoniae and E. aerogenes, negatively correlated to known butyrate-producing bacteria such as Eubacterium rectale and Roseburia intestinalis. Network analyses after FMT showed that the Bacteroidetes cluster and its connections were successfully restored after FMT.

Stability of the intestinal microbiota after FMT

The intestinal microbial ecosystem restored by FMT stabilized quickly over time (Figure 3b). The microbiota of CDI patients was found to be stable from 14 days after FMT, with similarity indices typically found in healthy individuals ($r=0.9\pm0.02$ s.d.). This stability was maintained throughout the 10 weeks post-transplant follow-up with no significant changes. As expected, at the end of the trial the microbial composition of patients resembled more their respective donors than each patient's own pre-transplant sample (day 0), with similarity indices of 0.7 ± 0.1 s.d. and 0.4 ± 0.1 s.d., respectively (P=0.0001) (Figure 3b).

To visualize the global changes of the microbiota of CDI patients after faecal transplant throughout the follow-up period, we performed a multivariate analysis specifically geared towards visualization of trends over time. A principal component analysis (Figure 6a) demonstrated that patients' samples immediately shift and stabilize after FMT towards those from the healthy donor. A principle response curve (PRC, Figure 6b) further confirmed our previous observations that samples at day 0 of patients were highly different from those of their donors and that these differences globally decreased over time, were patients tended to have a microbiota more in line with that of a healthy donor. The main components of the observed changes in composition were Bacilli (mostly small intestinal bacteria) and Proteobacteria (including vancomycin-resistant and potentially pathogenic bacteria). The direction of change of these groups over time was opposite to that of the Bacteroidetes and several members of the *Clostridium* clusters IV and XIVa, including F. prausnitzii, E. rectale, R. intestinalis and other known butyrate-producing bacteria.

Discussion

In this study we showed that FMT by donor faeces infusion results in a normalization of the disturbed microbiota as seen in patients with longstanding recurrent CDI. In particular diversity, including richness and evenness, significantly reduced in all patients before FMT, recovered to normal values immediately after treatment. We were also able to identify specific signature groups and networks of bacteria that could be involved both in the development of an ecosystem prone to recurrences, as well as in the restoration of a healthy microbiota after donor faeces infusion.

In CDI the use of broad-spectrum antibiotics is believed to create an ecosystem that deviates from the normal predominance of members of the Bacteroidetes and Firmicutes to a one dominated by Bacilli and Proteobacteria (Chang *et al.*, 2008; Mariat *et al.*, 2009). The microbiota of CDI patients is characterized by an absence or reduction of Bacteroidetes spp., as observed both by cultivation (Tvede and Rask-Madsen, 1989) as well as with 16S rRNA gene-targeted molecular approaches (Grehan et al., 2010; Khoruts et al., 2010). This was confirmed in our study, where patients at day 0 showed significant reduction in the relative abundance of several groups belonging to the Bacteroidetes, as well as displaying complete absence of the central co-occurrence networks involving these bacteria. Bacteroides spp. have been shown to have a role in the resistance against C. difficile infection (Tvede and Rask-Madsen, 1989; Hopkins and Macfarlane, 2002, 2003) and are involved in carbohydrate metabolism and regulation of immune functions (Hooper and Gordon, 2001; Wexler, 2007; Vaishnava et al., 2011).

Table 1 Signature bacterial groups of donors and CDI patients' microbiota

	Donor signature (total 44 %)	CDI signature (total 41%)	Common >1% (total 44%)
Actinobacteria			Bifidobacterium
Bacteroidetes	Allistipes et rel. Bacteroides vulgatus et rel. Parabacteroides distasonis et rel. Prevotella melaninogenica et rel.		
Firmicutes			
Bacilli		Enterococcus Lactobacillus plantarum et rel. Lactobacillus salivarius et rel. Streptococcus intermedius et rel. Streptococcus mitis et rel.	Streptococcus bovis et rel.
Clostridium cluster I		Clostridia	
<i>Clostridium</i> cluster IV	Faecalibacterium prausnitzii et rel. Oscillospira guillermondii et rel. Ruminococcus callidus et rel. Sporobacter termitidis et rel. Subdoliaranulum variable et rel.	Clostridium orbiscindens et rel.	
Clostridium cluster IX		Veillonella	
Clostridium cluster XI		<i>Clostridium difficile</i> et rel.	
Clostridium cluster XIVa	Butyrivibrio crossotus et rel. Eubacterium ventriosum et rel. Lachnobacillus bovis et rel.		Anaerostipes caccae et rel. Bryantella formatexigens et rel. Clostridium nexile et rel. Clostridium sphenoides et rel. Clostridium symbiosum et rel. Coprococcus eutactus et rel. Dorea formicigenerans et rel. Eubacterium hallii et rel. Eubacterium rectale et rel. Lachnospira pectinoschiza et rel. Outgrouping Clostridium cluster XIVa Roseburia intestinalis et rel. Ruminococcus gnavus et rel. Ruminococcus obeum et rel.
Uncultured Clostridiales	Uncultured Clostridiales I Uncultured Clostridiales II		
Proteobacteria		Enterobacter aerogenes et rel. Klebisiella pneumoniae et rel. Proteus et rel. Sutterella wadsworthia et rel.	

Donor, CDI and common signature groups (that is, those present in both donors and CDI patients above threshold) add up to 44%, 41% and 44% of the total microbiota before transplantation, respectively.

Signature groups highlighted in red were detected at the end of the study above a threshold of 1% relative abundance. Groups shown in blue were reduced (<1%) or depleted after faecal transplantation.

In mice, *Bacteroides* was found to be one of the genera involved in the recovery of disease after bacteriotherapy using a mix of bacteria (Lawley *et al.*, 2012). These results in mice suggest that not a complete microbiota is needed, which may be promising for future therapeutic developments. In a mouse model for obesity, *B. uniformis* was found to reduce metabolic and immune dysfunction (Gauffin Cano *et al.*, 2012).

In our study, the microbiota of CDI patients before FMT was also characterized by an abnormal

overgrowth of Proteobacteria, with considerably higher amounts of low-level pathogens such as *E. aerogenes* and related species. Network analyses of samples at day 0 were dominated by potential pathogens such as *K. pneumoniae*. This proteobacterial overgrowth could lead us to hypothesize a constant low-grade intestinal inflammation, that prevents the microbiota to return to a homeostatic status. An increase in Proteobacteria has also been reported in several models of antibiotic treatment and in obesity-induced inflammation

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Figure 5 Bacterial networks of (a) donors, (b) patients before FMT and (c) patients for 5 weeks after treatment. Shown groups with Spearman correlations > |0.8| and relative abundance > 0.1% in at least 50% of the samples. Green lines and red lines indicate co- and anti-occurrence respectively (that is, positive and negative correlations).



Figure 6 (a) Principal component analysis of CDI patients over time based on their microbiota composition. First and second ordination axes are plotted, explaining 30 and 10% of the variability in the data set, respectively. (b) Principal response curve analysis summarizing the differences in total microbiota composition between patients and their respective donors over time. The graph shows 35% of all time-dependent differences in microbiota composition between patients and their donors. Bacterial groups shown are the main drivers of the differences between patients and donors: groups that have a positive weight on the response curve follow the observed curves, whereas those with negative weights follow the opposite pattern.

(O'Keefe, 2010; Frazier *et al.*, 2011; Verdam *et al.*, 2013).

An enrichment of bacteria generally associated with the small intestine, such as *Veillonella*, *Streptococcus* or *Lactobacillus* species, was previously observed in patients with recurrent CDI before FMT (Khoruts *et al.*, 2010; Zoetendal *et al.*, 2012). Many of these trends can be explained by the history of antibiotic use of these patients (Vrieze, 2013), as most *Lactobacillus* spp. are intrinsically resistant to vancomycin (Swenson *et al.*, 1990). In our study, bacteria related to *Lactobacillus plantarum* and *Streptococcus intermedius* had relative abundances that were between 3 and \geq 50-fold higher in CDI

patients than in healthy donors, returning to levels more similar to those observed in donor samples after FMT.

As already mentioned, extended periods of antibiotic treatment have a profound impact on the microbiota composition, which makes it very difficult to separate signature groups owing to the treatment or the disease. In an attempt to uncouple these signatures we compared the microbiota composition of a group of healthy volunteers, receiving a standard vancomycin treatment without developing CDI, with that of the CDI patients at day 0. We were able to assess differences in microbiota composition that could be a trigger for the development

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of recurrent CDI (Vrieze, 2013). These differences were found predominantly in species within the Bacteroidetes (sixfold higher in non-CDI patients, P = 0.009), and the Firmicutes, more specifically members of the Clostridium clusters IV and XIVa (6.5-fold and 11-fold higher, respectively, in non-CDI patients, P < 0.002). Species related to the *Clostridium* cluster IX butvrate producer Megasphaera elsdenii were found 10-fold higher in non-CDI subjects as compared with CDI patients (P=0.01). Butyrate is a short-chain fatty acid shown to have signalling and protective effects on the gut (Wong et al., 2006; Hamer et al., 2008). A deficiency of butyrate in the colon can promote growth and toxin production of *C. difficile* (O'Keefe, 2010), whereas its delivery to the colon decreases pain sensation (Hamer et al., 2008). This comparison of subjects undergoing antibiotic treatment that leads (or not) to CDI is key for understanding the role of different microbial groups in its pathogenesis, as well as for identifying potential factors for recurrence, and it is currently under research (Antharam et al., 2013).

Faecal transplantation triggered a therapeutic reset in the intestinal community of our patients. By defining a threshold to identify 'donor signature' and 'CDI signature' bacterial groups, we were able to monitor the reshaping of the transplanted microbiota over time. As a result of FMT, members of the Bacteroidetes showed the most substantial changes. Networks including these groups, absent in day 0 samples, were immediately re-established after FMT as a central and key component of the co- and antioccurrence networks. Donor signature bacterial groups were identified including bacteria often associated with health (for example, the potentially anti-inflammatory F. prausnitzii) (Sokol et al., 2008) as well as microbes associated with different steps of the complex carbohydrate fermentation scheme, such as primary complex carbohydrate degradation or secondary fermenters, like butyrate producers. Assessing a resilient and stable colonization of the gastrointestinal tract by a healthy microbiota and its networks is the key to identify an optimal ' healthy' microbiota composition, ideal for a successful FMT (Brandt et al., 2011; Vrieze et al., 2013).

A previous study using denaturing gradient gel electrophoresis revealed a durable establishment of donor bacteria up to 24 weeks post transplant, with slight changes in the composition over time (Grehan *et al.*, 2010). In our study, using a more comprehensive microarray-based profiling approach, we confirmed that the microbiota of CDI patients stabilized immediately after FMT, by adopting specific donor signatures that are stably maintained over time.

In addition, our findings suggest that there is a role of the donor microbiota composition in the outcome of FMT. Although all patients successfully recovered, a microbiota imprint could be observed, where some donors can make a larger impact on the microbiota compared with others. Donor D4 seemed to create a more prevalent and stable environment as compared with other donors over time. An in-depth analysis of D4 microbiota revealed a four-time higher relative abundance of *Bacteroides* spp. (that is, those related to *B. intestinalis*, *B. plebeius* and B. uniformis) compared with other donors. In contrast, groups generally considered pathogenic, such as *B. fragilis* and *B. vulgatus*, were not found significantly higher in this donor. The higher stability could lead to hypothesize into what makes a better microbiota composition to be used for FMT, and which are the drivers for a durable and stable recovery. Future larger and longer studies are needed to increase our understanding in the effect of donor microbiota on treatment outcome, enabling to look at functions of microbes within a group to select the 'perfect donor composition' for treatment of CDI.

As demonstrated in this study, the identification of bacterial signatures and central networks as drivers for the restoration of a healthy intestinal microbiota, as well as the dynamics of FMT, could allow us to predict the success of the treatment. Overall, we identified the existence of key groups and networks that represent ecosystem and metabolic drivers, and are likely to be central for the development of recurrent CDI or the maintenance of homeostasis in the microbiota of healthy individuals, and could be therefore used as predictors of recurrence and treatment outcomes. These results could lead not only to early diagnostics of CDI recurrence but also to the development of novel general or individualized targeted treatment strategies. This could ultimately lead to the identification of a defined and essential microbial core as a cure for CDI patients in next-generation therapies (de Vos, 2013), identifying and selecting signature bacterial groups sufficient for treating this potentially fatal disease.

Conflict of Interest

The authors declare no conflict of interest.

Acknowledgements

We thank the HITChip team for technical assistance in performing experiments and Dr Ed Kuijper for performing the PCR Ribotyping of patient samples in the study.

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Supplementary Information accompanies this paper on The ISME Journal website (http://www.nature.com/ismej)