

# Unearthing the soil carbon food web with DNA-SIP

Ashley N Campbell \*, Charles Pepe-Ranney †, and Daniel H Buckley †

\*Department of Microbioloby, Cornell University, New York, USA, and †Department of Crop and Soil Sciences, Cornell University, New York, USA Submitted to Proceedings of the National Academy of Sciences of the United States of America

### **Abstract**

We describe a high-resolution approach for identifying microbial contributions to soil C-cycling dynamics using nucleic acid stable isotope probing coupled with next generation sequencing (HR-SIP). We amended series of soil microcosms with a complex mixture of model carbon (C) substrates and inorganic nutrients similar to plant biomass. A single C constituent in the C substrate mixture was substituted for its <sup>13</sup>C-labeled equivalent in each microcosm series. Specifically, in separate microcosms we substituted  $^{13}\text{C-xylose}$  or  $^{13}\text{C-cellulose}$  for their unlabeled equivalents. Xylose and cellulose were chosen to represent labile soluble C and polymeric insoluble C, respectively. Microcosm DNA was interrogated for  $^{13}{\rm C}$  incorporation at days 1, 3, 7, 14 and 30. Incorporation of  $^{13}{\rm C}$  from xylose into microcosm DNA was observed at days 1, 3, and 7, while incorporation of <sup>13</sup>C from cellulose was peaked at day 14 and was maintained through day 30. Of over 6,000 OTUs detected, a total of 49 and 63 unique OTUs assimilated  $^{13}\mathrm{C}$  from xylose and cellulose into DNA, respectively. Xylose assimilating OTUs were more abundant in the microcosm community than cellulose assimilating OTUs, while cellulose OTUs demonstrated a greater substrate specificity than xylose OTUs. Xylose responders exhibited a unique time signature from days one to seven, manifested by a succession from Firmicutes, to Bacteroidetes, to Actinobacteria. <sup>13</sup>C-cellulose incorporating OTUs included members of the Verrucomicrobia and Chloroflexi. monolayer | structure | x-ray reflectivity | molecular electronics

Abbreviations: SAM, self-assembled monolayer; OTS, octadecyltrichlorosilane

# Introduction

Excluding plant biomass, there are 2,300 Pg of carbon (C) stored in soils worldwide which accounts for  $\sim 80\%$  of the global terrestrial C pool (Amundson, 2001; Batjes, 1996). When organic C from plants reaches soil it is degraded by fungi, archaea, and bacteria. This C is returned to the atmosphere as  $CO_2$  or remains in the soil as humic substances that can persist up to 2000 years (Yanagita, 1990). The majority of plant biomass C in soil is respired and produces 10 times more  $CO_2$  than anthropogenic emissions on an annual basis (Chapin, 2002). Global changes in atmospheric  $CO_2$ , temperature, and ecosystem nitrogen inputs are expected to impact primary production and C inputs to soils (Groenigen et al., 2006) but it remains difficult to predict the re-

sponse of soil processes to anthropogenic change (Davidson, Janssens, and Luo, 2006). Current climate change models concur on atmospheric and oceanic but not terrestrial C predictions (Friedlingstein et al., 2006). Contrasting terrestrial C model predictions reflect how little is known about soil C cycling. Inconsistencies in terrestial modeling could be improved by elucidating the relationship between dissolved organic carbon and microbial communities in soils (Neff and Asner, 2001).

An estimated 80-90% of C cycling in soil is mediated by microorganisms (Coleman and Jr, 1996; Nannipieri et al., 2003a). Understanding microbial processing of nutrients in soils presents a special challenge due to the hetergeneous nature of soil ecosystems and methods limitations. Soils are biologically, chemically, and physically complex which affects microbial community composition, diversity, and structure (Nannipieri et al., 2003a). Confounding factors such as physical protection/aggregation, moisture content, pH, temperature, frequency and type of land disturbance, soil history, mineralogy, N quality and availability, and litter quality all affect the ability of the soil microbial community to access and metabolize C substrates (Kalbitz et al., 2000; Sollins, Homann, and Caldwell, 1996). Further, rates of metabolism are often measured without knowing the identity of the microbial species involved (Nannipieri et al., 2003b) leaving the importance of community membership towards maintaining ecosystem functions unknown (Allison and Martiny, 2008; Nannipieri et al., 2003b; J. P. Schimel and Schaeffer, 2012). Litter bag experiments have shown that the community composition of soils can have quantitative and qualitative impacts on the breakdown of plant materials (J. Schimel, 1995). Reciprocal exchange of litter type and microbial inocula under controlled environmental conditions reveals that differences in community composition can account for 85% of the variation in litter carbon mineralization

## **Reserved for Publication Footnotes**



(Strickland et al., 2009). In addition, assembled communities of cellulose degraders reveal that the composition of the community has significant impacts on the rate of cellulose degradation (Wohl, Arora, and Gladstone, 2004).

An important step in understanding soil C cycling dynamics is identifying contributions from specific microbial lineages and investigating the relationship between genetic diversity and community structure with function (O'Donnell et al., 2002). The vast majority of microorganisms continue to resist cultivation in the laboratory, and even when cultivation is achieved, the traits expressed by a microorganism in culture may not be representative of those expressed when in its natural habitat. Stable-isotope probing (SIP) provides a unique opportunity to link microbial identity to activity and has been utilized to expand our knowledge of biogeochemical processes (Chen and Murrell, 2010). The most successful applications of this technique have identified organisms which mediate processes performed by a narrow set of functional guilds such as methanogens (Lu, 2005). The technique has been less applicable to the study of soil C cycling because of limitations in resolving power as a result of simultaneous labeling of many different organisms in the community. Additionally, molecular applications such as tRFLP, DGGE and cloning that are frequently used in conjunction with SIP provide insufficient resolution of taxon identity and depth of coverage. We have developed an approach called **High Resolution-SIP** (HR-SIP) that employs a complex mixture of substrates added to soil at a low concentration relative to soil organic matter pools along with high throughput DNA sequencing. This greatly expands the ability of nucleic acid SIP to explore complex patterns of C-cycling in microbial communities with increased resolution.

A temporal cascade occurs in natural microbial communities during the plant biomass degradation in which labile C degradation precedes polymeric C degradation (Hu and Bruggen, 1997; Rui, Peng, and Lu. 2009). The aim of this study is to track the temporal dynamics of C assimilation through discrete individuals of the soil microbial community to provide greater insight into soil C-cycling. Our experimental approach includes the addition of a soil organic matter (SOM) simulant (a complex mixture of model carbon sources and inorganic nutrients common to plant biomass), where a single C constituent is substituted for its <sup>13</sup>C-labeled equivalent, to soil. Parallel incubations of soils amended with this complex C mixture allows us to test how different C substrates cascade through discrete taxa within the soil microbial community. In this study we use <sup>13</sup>C-xylose and <sup>13</sup>C-cellulose as a proxy for labile and polymeric C, respectively. We couple nucleic acid stable isotope probing with high throughput DNA sequencing to identify soil microbial community members responsible for specific C transformations. Amplicon sequencing of 16S rRNA gene fragments from many gradient fractions and multiple gradients make it possible to track C assimilation by hundreds of taxa.

## Results

We observed C use dynamics by the soil microbial community by conducting a nucleic acid SIP experiment wherein xylose or cellulose carried the isotopic label. We set up three soil microcosm series. Each microcosm was amended with a C substrate mixture that included cellulose and xylose. The C substrate mixture approximated the chemical composition of freshly degrading plant biomass. The same substrate mixture was added to microcosms in each series, however, for each series except the control, one substrate was substituted for its <sup>13</sup>C counterpart; <sup>13</sup>C-cellulose in one series, <sup>13</sup>C-xylose in another, and no <sup>13</sup>C-labeled substrates in the control. Microcosm amendments are shorthand identified in the following figures by the following code: "13CXPS" refers to the amendment with <sup>13</sup>C-xylose (that is <sup>13</sup>C Xylose Plant Simulant), "13CCPS" refers to the <sup>13</sup>C-cellulose amendment and "12CCPS" refers to the amendment that only contained <sup>12</sup>C substrates (i.e. control). Xylose or cellulose were chosen to carry the isotopic label to contrast C assimilation for labile, soluble C (xylose) versus insoluble, polymeric C (cellulose). 5.3 mg of C substrate mixture per gram soil was added to each microcosm representing 18% of the total soil C. The mixture included 0.42 mg xylose-C and 0.88 mg cellulose-C g soil<sup>-1</sup>. Microcosms were harvested for DNA extraction at days 1, 3, 7, 14 and 30 during a 30 day incubation. <sup>13</sup>C-xylose assimilation peaked immediately and tapered over the 30 day incubation whereas <sup>13</sup>C-cellulose assimilation peaked two weeks after amendment additions(Figure 1).

Microcosm DNA was density fractionated on CsCl density gradients. We assayed SSU rRNA gene content of CsCl gradient fractions using high-throughput DNA sequencing technology. We sequenced SSU rRNA gene amplicons from a total of 277 CsCl gradient fractions from 14 CsCl gradients and 12 bulk microcosm DNA samples. The SSU rRNA gene data set contained 1,102,685 total sequences. The average number of sequences per sample was 3,816 (sd 3,629) and 265 samples had over 1,000 sequences. We sequenced SSU rRNA gene amplicons from an average of 19.8 fractions per CsCl gradient (sd 0.57). The average density between fractions was 0.0040 g mL<sup>-1</sup> The sequencing effort recovered a total of 5,940 OTUs. 2,943 of the total 5,940 OTUs were observed in bulk samples. We observed 33 unique phylum and 340 unique genus annotations.

Soil microcosm microbial community changes with time. Bulk soil DNA sequencing revealed changes in the soil microcosm microbial community structure and membership correlated significantly with incubation time (Figure S4B, p-value 0.23, R<sup>2</sup> 0.63, Adonis test Anderson (2001)). The identity of the <sup>13</sup>C-labeled substrate added to the microcosms did not significantly correlate with community structure and membership (p-value 0.35). Additionally, microcosm beta diversity was significantly less than gradient fraction beta diversity (p-value 0.003, "betadisper" function R Ve-



gan package CITE Anderson, Ellingsen, and McArdle (2006)). Twenty-nine OTUs significantly changed in relative abundance with time ("BH" adjusted p-value < 0.10, Benjamini and Hochberg (1995)) (Figure S1). OTUs that significantly increased in relative abundance with time included OTUs in the Verrucomicrobia, Proteobacteria, Planctomycetes, Cyanobacteria, Chloroflexi and Acidobacteria. OTUs that significantly decreased in relative abundance with time included OTUs in the Proteobacteria, Firmicutes, Bacteroidetes and Actinobacteria (Figure S1). Proteobacteria was the only phylum that had OTUs which increased significantly and OTUs that decreased significantly in abundance with time. If sequences were grouped by taxonomic annotations at the class level, only four classes significantly changed in abundance, Bacilli (decreased), Flavobacteria (decreased), Gammaproteobacteria (decreased) and Herpetosiphonales (increased) (Figure S2). Of the 29 OTUs that changed significantly in relative abundance with time, 14 are labeled substrate responders (Figure S1).

OTUs that assimilated <sup>13</sup>C from xylose. Within the first 7 days of incubation approximately 63% of <sup>13</sup>C-xylose was respired and only an additional 6% more was respired from day 7 to 30, as determined from isotopic analysis of the <sup>13</sup>C remaining in the soil at each time point. At the end of the 30 day incubation 30% of the <sup>13</sup>C from added xylose remained in the soils. The <sup>13</sup>C remaining in the soil from <sup>13</sup>C-xylose addition was likely stabilized by assimilation into microbial biomass and/or microbial conversion into other forms of organic matter. It is also possible that some <sup>13</sup>C-xylose remains unavailable to microbes due to abiotic interactions in soil (Kalbitz et al., 2000). An average 16% of the <sup>13</sup>C-cellulose added was respired within the first 7 days, 38% by day 14, and 60% by day 30.

Isotope incorporation by an OTU is revealed by enrichment of the OTU in heavy CsCl gradient fractions containing <sup>13</sup>C labeled DNA relative to heavy fractions from control gradients containing no <sup>13</sup>C labeled DNA. We refer to OTUs that putatively incorporated <sup>13</sup>C into DNA originally from an isotopically labeled substrate as a substrate "responder". At day 1, 84\% of \(^{13}\text{C-xylose}\) responsive OTUs belonged to Firmicutes, 11% to Proteobacteria and 5% to Bacteroidetes. Firmicutes responders decreased from 16 OTUs at day 1 to one OTU at day 3 while Bacteroidetes responders increased from one OTU at day 1 to 12 OTUs at day 3. The remaining day 3 responders are members of the *Proteobacteria* (26%) and the Verrucomicrobia (5%). Day 7 responders were 53% Actinobacteria, 40% Proteobacteria, and 7% Firmicutes. The identities of <sup>13</sup>C-xylose responders change with time. The numerically dominant <sup>13</sup>C-xylose responder phylum shifts from Firmicutes to Bacteroidetes and then to Actinobacteria across days 1, 3 and 7 (Figure 2, Figure 3).

All of the <sup>13</sup>C-xylose responders in the *Firmicutes* phylum are closely related (at least 99% sequence iden-

tity) to cultured isolates from genera that are known to form endospores (Table S2). Each <sup>13</sup>C-xylose responder is closely related to isolates annotated as members of Bacillus, Paenibacillus or Lysinibacillus. Bacteroidetes <sup>13</sup>C-xylose responders are predominantly closely related to Flavobacterium species (5 of 8 total responders) (Table S2). Only one Bacteroidetes <sup>13</sup>C-xylose responder is not closely related to a cultured isolate, "OTU.183" (closest LTP BLAST hit, Chitinophaca sp., 89.5% sequence identity, Table S2). OTU.183 shares high sequence identity with environmental clones derived from rhizosphere samples (accession AM158371, unpublished) and the skin microbiome (accession JF219881, Kong et al. (2012)). Other Bacteroidetes responders share high sequence identities with canonical soil genera including *Dyadobacer*, *Solibius* and *Terrimonas*. Six of the 8 *Actinobacteria* <sup>13</sup>C-xylose responders are in the Micrococcales order. One <sup>13</sup>C-xylose responding Actinobacteria OTU shares 100% sequence identity with Agromyces ramosus (Table S2). A. ramosus is a known predatory bacterium but is not dependent on a host for growth in culture (Casida, 1983). It is not possible to determine the specific origin of assimilated  $^{13}\mathrm{C}$  in a DNA-SIP experiment.  $^{13}\mathrm{C}$  can be passed down through trophic levels although heavy isotope representation in C pools targeted by cross-feeders and predators would be diluted with depth into the trophic cascade. It is possible, however, that the <sup>13</sup>C labeled Agromyces OTU was assimilating 13 C primarily by predation if the Agromyces OTU was selective enough with respect to its prey that it primarily attacked <sup>13</sup>C-xylose assimilating organisms.

Cellulose OTUs. Only 2 and 5 OTUs had incorporated <sup>13</sup>C from <sup>13</sup>C-cellulose at days 3 and 7, respectively. At days 14 and 30 42 and 39 OTUs incorporated <sup>13</sup>C from  $^{13}\mathrm{C}\text{-cellulose}$  into biomass. A Cellvibrio and Sandaracinaceae OTU assimilated  $^{13}\mathrm{C}$  from  $^{13}\mathrm{C}\text{-cellulose}$  at day 3. Day  $7^{-13}$ C-cellulose responders included the same Cellvibrio responder as day 3, a Verrucomicrobia OTU and three Chloroflexi OTUs. 50% of Day 14 responders belong to Proteobacteria (66% Alpha-, 19% Gamma-, and 14% Beta-) followed by 17% Planctomucetes, 14% Verrucomicrobia, 10% Chloroflexi, 7% Actinobacteria and 2% cyanobacteria. Bacteroidetes OTUs began to incorporate <sup>13</sup>C from cellulose at day 30 (13% of day 30 responders). Other day 30 responding phyla included Proteobacteria (30% of day 30 responders; 42% Alpha-, 42% Delta, 8% Gamma-, and 8% Beta-), Planctomycetes (20%), Verrucomicrobia (20%), Chloroflexi (13%) and cyanobacteria (3%). Proteobacteria, Verrucomicrobia, and Chloroflexi had relatively high numbers of responders with strong response across multiple time points (Figure 2).

Proteobacteria represent 46% of all <sup>13</sup>C-cellulose responding OTUs identified. Cellvibrio accounted for 3% of all proteobacterial <sup>13</sup>C-cellulose responding OTUs detected. Cellvibrio was one of the first identified cellulose degrading bacteria and was originally described



by Winogradsky in 1929 who named it for its cellulose degrading abilities (Boone, 2001). All <sup>13</sup>C-cellulose responding Proteobacteria share high sequence identity with 16S rRNA genes from sequenced cultured isolates (Table S1) except for "OTU.442" (best cultured isolate match 92% sequence identity in the Chrondomyces genus, Table S1) and "OTU.663" (best cultured isolate match outside Proteobacteria entirely, Clostridium genus, 89% sequence identity, Table S1). Some Proteobacteria responders share high sequence identity with isolates in genera known to possess cellulose degraders including Rhizobium, Devosia, Stenotrophomonas and Cellvibrio. One Proteobacteria OTU shares high sequence identity (100%) with a Brevundimonas cultured isolate. Brevundimonas has not previously been identified as a cellulose degrader, but has been shown to degrade cellouronic acid, an oxidized form of cellulose (Tavernier et al., 2008).

Verrucomicrobia, a cosmopolitan soil phylum often found in high abundance (Fierer, Ladau, et al., 2013), are hypothesized to degrade polysaccharides in many environments (Chin et al., 1999; Fierer, Ladau, et al., 2013; Herlemann et al., 2013). Verrucomicrobia comprise 16% of the total  $^{13}$ C-cellulose responder OTUs detected. 40% of Verrucomicrobia <sup>13</sup>C-cellulose responders belong to the uncultured "FukuN18" family originally identified in freshwater lakes (Parveen et al., 2013). The strongest Verrucomicrobial responder OTU to <sup>13</sup>Ccellulose shared high sequence identity (97%) with an isolate from Norway tundra soil (Jiang et al., 2011) although growth on cellulose was not assessed for this isolate. Only one other <sup>13</sup>C-cellulose responding verrucomicrobium shared high DNA sequence identity with an isolate, "OTU.638" (Table S1) with Roseimicrobium gellanilyticum (100% sequence identity) which has been shown to grow on soluble cellulose (Otsuka et al., 2012). The remaining <sup>13</sup>C-cellulose Verrucomicrobia responders did not share high sequence identity with any isolates (maximum sequence identity with any isolate 93%).

*Chloroflexi* are known for metabolically dynamic lifestyles ranging from anoxygenic phototrophy to organohalide respiration (Hug et al., 2013). Recent studies have focused on *Chloroflexi* roles in C cycling (Cole et al., 2013; Goldfarb et al., 2011; Hug et al., 2013) and several *Chloroflexi* utilize cellulose (Cole et al., 2013; Goldfarb et al., 2011; Hug et al., 2013). Four closely related OTUs in an undescribed *Chloroflexi* lineage (closest matching isolate for all four OTUs: *Herpetosiphon geysericola*, 89% sequence identity, Table S1) responded to <sup>13</sup>C-cellulose (Figure S3). One additional OTU also from a poorly characterized *Chloroflexi* lineage (closest cultured isolate matched a proteobacterium at 78% sequence identity) responded to <sup>13</sup>C-cellulose (Figure S3).

Other notable <sup>13</sup>C-cellulose responders include a *Bacteroidetes* OTU that shares high sequence identity (99%) to *Sporocytophaga myxococcoides* a known cellulose degrader (Vance et al., 1980), and three *Actinobacteria* OTUs that share high sequence identity (100%)

with isolates. One of the three Actinobacteria <sup>13</sup>Ccellulose responders is in the Streptomyces, a genus known to possess cellulose degraders, while the other two share high sequence identity to cultured isolates Allokutzneriz albata (Labeda and Kroppenstedt, 2008; Tomita, Hoshino, and Miyaki, 1993) and Lentzea waywayandensis (Labeda, Hatano, et al., 2001; Labeda and Lyons, 1989); neither isolate decomposes cellulose in culture. Nine *Planctomycetes* OTUs responded to <sup>13</sup>Ccellulose but none are within described genera (closest cultured isolate match 91% sequence identity, Table S1) (Figure S3). One <sup>13</sup>C-cellulose responder is annotated as "cyanobacteria". The cyanobacteria phylum annotation is misleading as the OTU is not closely related to any oxygenic phototrophs (closest cultured isolate match Vampirovibrio chlorellavorus, 95% sequence identity, Table S1). A sister clade to the oxygenic phototrophs classically annotated as "cyanobacteria" in SSU rRNA gene reference databases, but does not possess any known phototrophs, has recently been proposed to constitute its own phylum, "Melainabacteria" Rienzi et al. (2013); although, the phylogenetic position of "Melainabacteria" is debated (Soo et al., 2014). The catalog of metabolic capabilities associated with cyanobacteria (or candidate phyla previously annotated as cyanobacteria) are quickly expanding (Rienzi et al., 2013; Soo et al., 2014). Our findings provide evidence for cellulose degradation within a lineage closely related to but apart from oxygenic phototrophs. Notably, polysaccharide degradation is suggested by an analysis of a "Melainabacteria" genome (Rienzi et al., 2013). Although we highlight <sup>13</sup>C-cellulose responders that share high sequence identity with described genera, most <sup>13</sup>Ccellulose responders uncovered in this experiment are not closely related to cultured isolates (Table S1).

Xylose responders are more abundant members of the soil community than cellulose responders. <sup>13</sup>C-xylose responders are generally more abundant members based on relative abundance in bulk DNA SSU rRNA gene content than <sup>13</sup>C-cellulose responders (Figure 4, p-value 0.00028). However, both abundant and rare OTUs responded to <sup>13</sup>C-xvlose and <sup>13</sup>C-cellulose (Figure 4). For instance, a *Delftia* <sup>13</sup>C-cellulose responder is fairly abundant in the bulk samples ("OTU.5", Table S1). OTU.5 was on average the 13th most abundant OTU in bulk samples. A <sup>13</sup>C-xylose responder ("OTU.1040", Table S2) has a mean relative abundance in bulk samples of  $3.57 \times 10^{-05}$ . Two  $^{13}$ C-cellulose responders were not found in any bulk samples ("OTU.862" and "OTU.1312", Table S1). Of the 10 most abundant responders, 8 are <sup>13</sup>C-xylose responders and 6 of these 8 are consistently among the 10 most abundant OTUs in bulk samples.

Responder abundances summed at phylum level generally increased for <sup>13</sup>C-cellulose (Figure XX) whereas <sup>13</sup>C-xylose responder abundances summed at the phylum level decreased over time for *Firmicutes*, *Bacteroidetes*, *Actinobacteria* and *Proteobacteria* although



Proteobacteria spiked at day 14 (Figure S5). Bulk abundance trends are roughly consistent with  $^{13}{
m C}$  assimilation.

Cellulose degraders exhibit higher substrate specificity than xylose utilizers. Cellulose responders exhibited a greater shift in buoyant density (BD) than xylose responders in response to isotope incorporation (Figure 4, p-value  $1.8610x^{-06}$ ). <sup>13</sup>C-cellulose responders shifted on average 0.0163 g/mL (sd 0.0094) whereas xylose responders shifted on average 0.0097 (sd 0.0094). For reference, 100% <sup>13</sup>C DNA BD is 0.04 g/mL greater than the BD of its  $^{12}\mathrm{C}$  counterpart. DNA BD increases as its ratio of <sup>13</sup>C to <sup>12</sup>C increases. An organism that only assimilates C into DNA from a <sup>13</sup>C isotopically labeled source, will have a greater <sup>13</sup>C: <sup>12</sup>C ratio in its DNA than an organism utilizing a mixture of isotopically labeled and unlabeled C sources. Upon labeling, DNA from an organism that incorporates exclusively <sup>13</sup>C will increase in BD more than DNA from an organism that does not exclusively utilize isotopically labeled C. Therefore the magnitude DNA BD shifts indicate substrate specificity given our experimental design as only one substrate was labeled in each amendment. We measured density shift as the change in an OTU's density profile center of mass between corresponding control and labeled gradients. BD shifts, however, should not be evaluated on an individual OTU basis as a small number of density shifts are observed for each OTU and the variance of the density shift metric at the level of individual OTUs is unknown. It is therefore more informative to compare density shifts among substrate responder groups. Further, density shifts are based on relative abundance profiles and would be distorted in comparison to density shifts based on absolute abundance profiles and should be interpreted with this transformation in mind. It should also be noted that there was overlap in observed density shifts between <sup>13</sup>C-cellulose and <sup>13</sup>C-xylose responder groups, suggesting that although cellulose degraders are generally more substrate specific than xylose utilizers, each responder group exhibits a range of substrate specificities (Figure 4).

Estimated rrn gene copy number in substrate responder **groups.** <sup>13</sup>C-xylose responder estimated rrn gene copy number is inversely related time of first response (pvalue 2.02x10<sup>-15</sup>, Figure 5). OTUs that first respond at later time points have fewer estimated rrn copy number than OTUs that first respond earlier (Figure 5). rrn copy number estimation is a recent advance in microbiome science (Kembel et al., 2012) although the relationship of rrn copy number per genome with ecological strategy is well established (J. A. Klappenbach, Dunbar, and T. M. Schmidt, 2000). Microorganisms with a high rrn copy number tend to be fast growers specialized to take advantage of boom-bust environments whereas microorganisms with low rrn copy number favor slower growth under lower and more consistent nutrient input (ibid.). At the beginning of our incubation, OTUs with estimated high rrn copy number or "fast-growers" assimilate xylose into biomass and with time slower growers (lower rrn copy number) begin to incorporate <sup>13</sup>C from xylose. Further, <sup>13</sup>C-xylose responders have more estimated rRNA operon copy numbers per genome than <sup>13</sup>C-cellulose responders (p-value  $1.878 \times 10^{-09}$ ) suggesting xylose respiring microbes are generally faster growers than cellulose degraders.

### Discussion

Pure culture based studies drove early soil microbial ecology research. Important pure cultures from soil historically included nine genera Agrobacterium, Alcaligenes, Arthrobacter, Bacillus, Flavobacterium, Micromonospora, Nocardia, Pseudomonas, and Streptomyces ((Alexander, 1977) and reviewed by Janssen (2006)) but culture-independent surveys of soil microbial diversity revealed soil can harbor 5,000 OTUs per half gram of soil (Schloss and Handelsman, 2006). We recovered almost 6,000 OTUs in this study. Although culturing techniques can produce isolates from diverse soil lineages (Janssen et al., 2002), numerically dominant soil microorganisms are still uncultured and we know little of their ecophysiology (Janssen, 2006). In contrast DNA-SIP can characterize functional roles for thousands of phylotypes in a single experiment. We found 104 OTUs in an agricultural soil that can incorporate C from xylose and/or cellulose into biomass. We also used DNA-SIP to assay substrate specificity and temporal dynamics of C-cycling or soluble and polymeric C degraders. Included in the <sup>13</sup>C-xylose and <sup>13</sup>Ccellulose responsive OTUs were members of numerically dominant yet functionally uncharacterized soil phylogenetic groups such as Verrucomicrobia, Planctomycetes and  ${\it Chloroflexi}.$ 

Microbial response to isotopic labels. We propose that C added to soil microcosms in this experiment followed the following path through the microbial food web (Figure S7): First, labile C such as xylose was assimilated by fast-growing opportunistic Firmicutes spore formers. The remaining labile C and new biomass C was assimilated in succession by slower growing *Bacteroidetes*, Actinobacteria and Proteobacteria phylotypes that were either tuned to lower C substrate concentrations, were predatory bacteria (e.g. Agromyces), and/or were specialized for consuming viral lysate. C from polymeric substrates entered the bacterial community after 14 days. Canonical cellulose degrading bacteria such as Cellvibrio degraded cellulose degraders but uncharacterized lineages in the Chloroflexi, Planctomycetes and Verrucomicrobia, specifically the Spartobacteria, were also significant contributors to cellulose decomposition.

Ecological strategies of soil microorganisms participating in the decomposition of organic matter. We assessed the ecology of  $^{13}$ C-responsive OTUs by estimating the rrn gene copy number and the BD shift upon labeling



for each OTU. rrn gene copy number correlates positively with growth rate (J. Klappenbach et al., 2001) and BD shift is indicative of substrate specificity (see results). We also observed how <sup>13</sup>C-substrate responsive OTUs changed in relative abundance with time in the microcosms and the abundance rank of <sup>13</sup>C-substrate responsive OTUs in the bulk DNA. Ecological metrics show <sup>13</sup>C-cellulose responsive OTUs grow slower (Figure 5), have greater substrate specificity (Figure 4), and are generally lower abundance than <sup>13</sup>C-xylose responsive OTUs (Figure 4). The higher abundance of xylose responders may also be in part due to of their high rrn gene copy number resulting in an inflated abundance relative per genome. There are only faint ecological differences within the <sup>13</sup>C-cellulose responsive OTUs but the combination of rrn gene copy number, BD shift, abundance rank and relative abundance change over time is consistent with phylum membership (Figure RADVIZ). <sup>13</sup>C-xylose responsive OTU rrn gene copy number correlated inversely with the time at which the OTU was first found to incorporate <sup>13</sup>C into DNA (Figure 5) suggesting that fast-growing microbes assimilated <sup>13</sup>C from xylose before slow growers.

Ecological metrics suggest cellulose degraders are substrate specialists that grow slow and are in low bulk abundance. Labile C responder ecological strategies were more varied perhaps because some <sup>13</sup>C labeled microorganisms did not primarily assimilate xylose but became labeled via predatory interactions and/or are saprophytes. <sup>13</sup>C-xylose responsive OTUs are generalists, grow faster and are more abundant when compared <sup>3</sup>C-cellulose responders. <sup>13</sup>C-xylose responders vary in growth rate and while generally higher abundance than <sup>13</sup>C-cellulose responders can also be low abundance microorganisms. It's not clear whether the observed activity succession from Firmicutes to Bacteroidetes and finally Actinobacteria in response to <sup>13</sup>C-xylose addition marks a trophic cascade or functional groups tuned to different resource concentrations or both. Notably, each temporally defined response group clustered phylogenetically suggesting a uniform ecological strategy (Figure S3). It's also clear that some of the non-Firmicutes <sup>13</sup>C-xylose responders are closely related to known predators (Agromyces) and many marine predatory bacteria are members of the Bacteroidetes (CITE). If the temporal dynamics of <sup>13</sup>C-xylose incorporation are due to trophic interactions, our results suggest that there are many predatory soil bacteria that consume fast-growing, opportunistic, primary labile C assimilating, gram-positive spore-formers. Hence, trophic interactions among soil bacteria may be of importance in soil C turnover models.

Phylogenetic affiliation of <sup>13</sup>C-cellulose and <sup>13</sup>C-xylose responsive microorganisms. *Verrucomicrobia*, cosmopolitan soil microbes (Bergmann et al., 2011), can comprise up to 23% of 16S rRNA gene sequences in high-throughput DNA sequencing surveys of SSU rRNA genes in soil (ibid.) and can account for up to 9.8%

of soil 16S rRNA (Daniel H. Buckley and Thomas M. Schmidt, 2001). Many Verrucomicrobia were first isolated in the last decade Wertz et al., 2011 but only one of the 15 most abundant verrucomicrobial phylotypes in a global soil sample collection shared greater than 93% sequence identity with a cultured isolate (Bergmann et al., 2011). Genomic analyses and physiological profiling of Verrucomicrobia isolates revealed Verrucomicrobia are capable of methanotrophy, diazotrophy, and cellulose degradation (Otsuka et al., 2012; Wertz et al., 2011), yet the function of soil Verrucomicrobia in global C-cycling remains unknown. Only two of the ten putative cellulose degrading Verrucomicrobia identified in this experiment share at least 95% sequence identity with an isolate ("OTU.83" and "OTU.627", Table S1). Seven of ten  $^{13}$ C-cellulose responding verru comicrobial OTUs were classified as Spartobacteria which are a numerically dominant family of Verrucomicrobia in SSU rRNA gene surveys of 181 globally distributed soil samples (Bergmann et al., 2011). Given their ubiquity and abundance in soil as well as their demonstrated incorporation of <sup>13</sup>C from <sup>13</sup>C-cellulose, *Verrucomicrobia* lineages, particularly Spartobacteria, may be important contributors to cellulose decomposition on a global scale.

Cellulose degrading soil *Chloroflexi* have previously been identified in DNA-SIP studies (Schellenberger, Kolb, and Drake, 2010). The cellulose degrading Chloroflexi in this study are only distantly related to isolates S1. Chloroflexi are among the six most abundant soil phyla commonly recovered soil microbial diversity surveys (Janssen, 2006). Chloroflexi are typically not as as abundant as Verrucomicrobia but are roughly as abundant as Bacteroidetes and Planctomycetes (ibid.). Four of five <sup>13</sup>C-cellulose responsive *Chloroflexi* identified in this study are annotated as belonging to the Herpetosiphon although they share less than 95% sequence identity with their closest cultured relative in the Herpetosiphon genus (H. geysericola). H. geysericola is a predatory bacterium shown to prev upon Aerobacter in culture and can also digest cellulose (Lewin, 1970). In our study, "Herpetosiphon" <sup>13</sup>C-cellulose responders did not show a delayed response to <sup>13</sup>C-cellulose as compared to other responders but nonetheless could have become labeled by feeding on primary <sup>13</sup>C-cellulose degraders. The prey specificity of predatory bacteria is not well established especially in situ. <sup>13</sup>C-labeling would be positively correlated with prey specificity. If the predator specifically preyed upon one population then it could take on the same labeling percent as that population given enough generations. Preying on multiple types would produce a mixed and dilute labeling signature if some of the prey were not isotopically labeled. We also observed  $^{13}\mathrm{C}\text{-incorporation}$  from cellulose

We also observed <sup>13</sup>C-incorporation from cellulose by *Proteobacteria*, *Planctomycetes* and *Bacteroidetes*. Strains in *Proteobacteria*, *Planctomycetes* and *Bacteroidetes* have all been previously implicated in cellulose degradation. *Planctomycetes* is the least studied of the three phyla and only one *Planctomycetes* isolate can grow on cellulose. None of the seven *Planctomycetes* cel-

6 www.pnas.org — Footline Author



lulose degraders identified in this experiment are closely related to isolates. Acidobacteria did not pass or operational criteria for assessing <sup>13</sup>C incorporation from cellulose into DNA in our microcosms. Acidobacteria have been found to degrade cellulose in culture CITE and are a numerically significant soil phylum CITE. Acidobacteria have been shown to dominate at low nutrient availability (CITE: cederlund 2014), which may explain why they were not active in this study's nutrient replete microcosm conditions. The Acidobacteria in our microcosms were mainly annotated as belonging to candidate orders in the Silva taxonomic nomenclature. The highest relative abundance for any Acidobacteria order in the bulk samples was 0.20 (order "DA023") and the highest relative abundance of the Acidobacteria phylum was 0.23.

Conclusion. Microorganisms sequester atmospheric carbon and respire soil organic matter (SOM) influencing climate change on a global scale. The specific microbial lineages that transform different soil C components are yet to be established. Molecular tools will unravel the soil microbial food web and reveal how specific microbial lineages impact soil C flux. Our results show physiologically undefined yet cosmopolitan soil microorganisms decompose cellulose. We also show phylogenetic groups rise and fall and are supplanted by others in activity over 7 days in response to labile C addition and OTUs that assimilate xylose and those that assimilate cellulose are largely different.

The succession hypothesis of decomposition predicts a succession from microbial types that use labile C to those that use recalcitrant polymeric C over time CITE. Cellulose degraders succeeded labile C degraders as predicted. But, in response to <sup>13</sup>C-xylose, *Firmicutes* phylotypes were succeeded by *Bacteroidetes* which were then succeeded by *Actinobacteria* representing a nested succession (Figure 3). We found that <sup>13</sup>C substrate responders changed as much as XX-fold in relative abundance over time (Figure S1).

The xylose responders demonstrate a smaller change in BD than the cellulose responders suggesting that xylose responders assimilate multiple C sources (labeled and unlabeled) consistent with a generalist response, while cellulose responders are more heavily labeled suggesting that cellulose is their main source of C, a response more consistent with a specialist lifestyle. Xylose responders include many taxa, such as spore-fomers, known for the ability to respond rapidly to an influx of new nutrients while cellulose responders include many OTUs that are common in soil but uncultured.

Xylose and cellulose utilization were demonstrated across 7 phyla each revealing a high diversity of bacteria able to utilize these substrates. The high taxonomic diversity may enable substrate metabolism under a broad range of environmental conditions (Goldfarb et al., 2011). Other studies of microbial communities have observed a positive correlation with taxonomic or phylogenetic diversity and functional diversity (Bryant et

al., 2012; Fierer, Ladau, et al., 2013; Fierer, Leff, et al., 2012; Gilbert et al., 2010; Philippot et al., 2010; Tringe, 2005). The data presented here supports that specific functional attributes can be shared among diverse taxa and closely related taxa may have very different physiologies (Fierer, Leff, et al., 2012; Philippot et al., 2010). This information adds to the growing collection of data suggesting that community membership is important to biogeochemical processes.

In the future deeper sequencing will enable us to increase coverage and assess C use by more community members. We can expand our knowledge of soil C use dynamics to a wide array of C substrates and increase our grasp on specific community member contributions to the soil C cycle.

### Methods

Additional information on sample collection and analytical methods is provided in SI Materials and Methods.

Twelve soil cores (5 cm diameter x 10 cm depth) were collected from six random sampling locations within an organically managed agricultural field in Penn Yan, New York. Soils were pretreated by sieving (2 mm), homogenizing sieved soil, and pre-incubating 10 g of dry soil weight in flasks for 2 weeks. Soils were amended with a 5.3 mg g soil<sup>-1</sup> carbon mixture; representative of natural concentrations Schneckenberger et al., 2008. Mixture contained 38% cellulose, 23% lignin, 20% xylose, 3% arabinose, 1% galactose, 1% glucose, and 0.5% mannose by mass, with the remaining 13.5% mass composed of an amino acid (in-house made replica of Teknova C0705) and basal salt mixture (Murashige and Skoog, Sigma Aldrich M5524). Three parallel treatments were performed; (1) unlabeled control,(2)<sup>13</sup>C-cellulose, (3)<sup>13</sup>Cxylose (98 atom% <sup>13</sup>C, Sigma Aldrich). Each treatment had 2 replicates per time point (n = 4) except day 30 which had 4 replicates; total microcosms per treatment n = 12, except <sup>13</sup>C-cellulose which was not sampled at day 1, n = 10. Other details relating to substrate addition can be found in SI. Microcosms were sampled destructively (stored at -80°C until nucleic acid processing) at days 1 (control and xylose only), 3, 7, 14, and

Nucleic acids were extracted using a modified Griffiths procotol Griffiths et al., 2000. To prepare nucleic acid extracts for isopycnic centrifugation as previously described D. H. Buckley et al., 2007, DNA was size selected (>4kb) using 1% low melt agarose gel and  $\beta$ -agarase I enzyme extraction per manufacturers protocol (New England Biolab, M0392S). For each time point in the series isopycnic gradients were setup using a modified protocol Neufeld et al., 2007 for a total of five  $^{12}\mathrm{C}$ -control, five  $^{13}\mathrm{C}$ -xylose, and four  $^{13}\mathrm{C}$ -cellulose microcosms. A density gradient (average density 1.69 g mL $^{-1}$ ) solution of 1.762 g cesium chloride (CsCl) ml $^{-1}$  in gradient buffer solution (pH 8.0 15 mM Tris-HCl, 15 mM EDTA, 15 mM KCl) was used to separate  $^{13}\mathrm{C}$ -enriched and  $^{12}\mathrm{C}$ -nonenriched DNA. Each gradient was loaded

with approximately 5  $\mu g$  of DNA and ultracentrifuged for 66 h at 55,000 rpm and room temperature (RT). Fractions of  $\sim 100 \ \mu L$  were collected from below by displacing the DNA-CsCl-gradient buffer solution in the centrifugation tube with water using a syringe pump at a flow rate of 3.3  $\mu$ L s<sup>-1</sup> Manefield et al., 2002 into Acroprep<sup>TM</sup> 96 filter plate (Pall Life Sciences 5035). The refractive index of each fraction was measured using a Reichart AR200 digital refractometer modified as previously described D. H. Buckley et al., 2007 to measure a volume of 5  $\mu$ L. Then buoyant density was calculated from the refractive index as previously described ibid. (see also SI). The collected DNA fractions were purified by repetitive washing of Acroprep filter wells with TE. Finally, 50  $\mu$ L TE was added to each fraction then resuspended DNA was pipetted off the filter into a new microfuge tube.

For every gradient, 20 fractions were chosen for sequencing between the density range 1.67-1.75 g mL<sup>-1</sup>. Barcoded 454 primers were designed using 454-specific adapter B, 10 bp barcodes Hamady et al., 2008, a 2 bp linker (5'-CA-3'), and 806R primer for reverse primer (BA806R); and 454-specific adapter A, a 2 bp linker (5'-TC-3'), and 515F primer for forward primer (BA515F). Each fraction was PCR amplified using 0.25  $\mu \rm L$  5 U  $\mu \rm l^{-1}$ AmpliTaq Gold (Life Technologies, Grand Island, NY; N8080243), 2.5  $\mu$ L 10X Buffer II (100 mM Tris-HCl, pH 8.3, 500 mM KCl), 2.5  $\mu$ L 25 mM MgCl<sub>2</sub>, 4  $\mu$ L 5 mM dNTP, 1.25  $\mu$ L 10 mg mL<sup>-1</sup> BSA, 0.5  $\mu$ L 10  $\mu$ M BA515F, 1  $\mu$ L 5  $\mu$ M BA806R, 3  $\mu$ L H<sub>2</sub>O, 10  $\mu$ L 1:30 DNA template) in triplicate. Samples were normalized either using Pico green quantification and manual calculation or by SequalPrep  $^{\rm TM}$  normalization plates (Invitation plates) rogen, Carlsbad, CA; A10510), then pooled in equimolar concentrations. Pooled DNA was gel extracted from a 1%agarose gel using Wizard SV gel and PCR clean-up system (Promega, Madison, WI; A9281) per manufacturer's protocol. Amplicons were sequenced on Roche 454 FLX system using titanium chemistry at Selah Genomics (formerly EnGenCore, Columbia, SC)

## References

- Alexander, Martin (1977). Introduction to Soil Microbiology. New Jersey: Wiley. 480 pp.
- Allison, S. D. and J. B. H. Martiny (2008). "Resistance resilience, and redundancy in microbial communities". In: Proceedings of the National Academy of Sciences 105. Supplement 1, pp. 11512–11519.
- Amundson, Ronald (2001). "The carbon budget in soils". In: Annu Rev Earth Planet Sci 29.1, pp. 535–562.
- Anderson, Marti J. (2001). "A new method for non-parametric multivariate analysis of variance". In: Austral Ecology 26.1, pp. 32–46.
- Anderson, Marti J., Kari E. Ellingsen, and Brian H. McArdle (2006). "Multivariate dispersion as a measure of beta diversity". In: *Ecology Letters* 9.6. PMID: 16706913, pp. 683–693.

- Batjes, N. H. (1996). "Total carbon and nitrogen in the soils of the world". In: European Journal of Soil Science 47.2, pp. 151–163.
- Benjamini, Y. and Y. Hochberg (1995). "Controlling the false discovery rate: a practical and powerful approach to multiple testing". In: *Journal of the Royal Statistical Society, Series B* 57, pp. 289–300.
- Bergmann, Gaddy T. et al. (2011). "The underrecognized dominance of Verrucomicrobia in soil bacterial communities". In: Soil Biology and Biochemistry 43.7, pp. 1450–1455.
- Boone, David (2001). Bergey's manual of systematic bacteriology. New York: Springer.
- Bryant, Jessica A et al. (2012). "Microbial community phylogenetic and trait diversity declines with depth in a marine oxygen minimum zone". In: *Ecology* 93.7, pp. 1659–1673.
- Buckley, D. H. et al. (2007). "Stable isotope probing with 15n achieved by disentangling the effects of genome g+c content and isotope enrichment on dna Density". In: *Appl Environ Microbiol* 73.10, pp. 3189–3195.
- Buckley, Daniel H. and Thomas M. Schmidt (2001). "Environmental factors influencing the distribution of rRNA from Verrucomicrobia in soil". In: *FEMS Microbiol Ecol* 35.1, pp. 105–112.
- Casida, L. E. (1983). "Interaction of Agromyces ramosus with Other Bacteria in Soil." In: Appl Environ Microbiol 46.4, pp. 881–8.
- Chapin, F (2002). Principles of terrestrial ecosystem ecology. New York: Springer.
- Chen, Yin and J. Colin Murrell (2010). "When metagenomics meets stable-isotope probing: progress and perspectives". In: *Trends Microbiol* 18.4, pp. 157–163.
- Chin, Kuk-Jeong et al. (1999). "Characterization and identification of numerically abundant culturable bacteria from the anoxic bulk soil of rice paddy microcosms". In: *Appl Environ Microbiol* 65.11, pp. 5042–5049.
- Cole, J. K. et al. (2013). "Kallotenue papyrolyticum gen. nov. sp. nov., a cellulolytic and filamentous thermophile that represents a novel lineage (Kallotenuales ord. nov., Kallotenuaceae fam. nov.) within the class Chloroflexia". In: Int J Syst Evol Microbiol 63.Pt 12, pp. 4675–4682.
- Coleman, David and D.A. Crossley Jr (1996). "Fundamentals of Soil Ecology". In: American Journal of Alternative Agriculture 4, pp. 190–190.
- Davidson, Eric A, Ivan A Janssens, and Yiqi Luo (2006). "On the variability of respiration in terrestrial ecosystems: moving beyond Q10". In: *Global Change Biology* 12.2, pp. 154–164.
- Fierer, Noah, J. Ladau, et al. (2013). "Reconstructing the microbial diversity and function of preagricultural tallgrass prairie soils in the united states". In: *Science* 342.6158, pp. 621–624.
- Fierer, Noah, J. W. Leff, et al. (2012). "Cross-biome metagenomic analyses of soil microbial communities and their functional attributes". In: *Proceedings of*

8 www.pnas.org — — Footline Author

- the National Academy of Sciences 109.52, pp. 21390-
- Friedlingstein, P. et al. (2006). "Climate-carbon cycle feedback analysis: Results from the c 4 mip model intercomparison". In: J Climate 19.14, pp. 3337–3353.
- Gilbert, Jack A Field et al. (2010). "The taxonomic and functional diversity of microbes at a temperate coastal site: a 'multi-omic' study of seasonal and diel temporal variation". In: PLoS ONE 5.11. Ed. by Francisco Rodriguez-Valera, e15545.
- Goldfarb, Katherine C. et al. (2011). "Differential Growth Responses of Soil Bacterial Taxa to Carbon Substrates of Varying Chemical Recalcitrance". In: Frontiers in Microbiology 2.
- Griffiths, R. I. et al. (2000). "Rapid method for coextraction of DNA and RNA from natural environments for analysis of ribosomal DNA- and rRNA-based microbial community composition". In: Appl Environ Microbiol 66.12, pp. 5488–5491.
- Groenigen, K. J. et al. (2006). "The impact of elevated atmospheric [co2] on soil c and n dynamics: a metaanalysis". In: Managed Ecosystems and CO2. Springer Science + Business Media, pp. 373–391.
- Hamady, Micah et al. (2008). "Error-correcting barcoded primers for pyrosequencing hundreds of samples in multiplex". In: Nat Meth 5.3, pp. 235-237.
- Herlemann, D. P. R. et al. (2013). "Metagenomic de novo assembly of an aquatic representative of the verrucomicrobial class spartobacteria". In: mBio 4.3, e0056912 - e0056912.
- Hu, S. and A. H. C. van Bruggen (1997). "Microbial dynamics associated with multiphasic decomposition of <sup>14</sup>C-Labeled Cellulose in Soil". In: *Microb Ecol* 33.2, pp. 134–143.
- Hug, Laura A et al. (2013). "Community genomic analyses constrain the distribution of metabolic traits across the Chloroflexi phylum and indicate roles in sediment carbon cycling". In: Microbiome~1.1,~p.~22.
- Janssen, Peter H. (2006), "Identifying the dominant soil bacterial taxa in libraries of 16S rRNA and 16S rRNA genes". In: Applied and Environmental Microbiology 72.3. PMID: 16517615 PMCID: PMC1393246, pp. 1719-1728.
- Janssen, Peter H. et al. (2002). "Improved culturability of soil bacteria and isolation in pure culture of novel members of the divisions acidobacteria, actinobacteria, proteobacteria, and verrucomicrobia". In: Applied and Environmental Microbiology 68.5. PMID: 11976113 PMCID: PMC127570, pp. 2391-2396.
- Jiang, F. et al. (2011). "Luteolibacter luojiensis sp. nov. isolated from Arctic tundra soil, and emended description of the genus Luteolibacter". In: Int J Syst Evol Microbiol 62.Pt 9, pp. 2259-2263.
- Kalbitz, K. et al. (2000). "Controls on the dynamics of dissolved organic matter in soils: a review". In: Soil Sci 165.4, pp. 277–304.
- Kembel, Steven W. et al. (2012). "Incorporating 16S gene copy number information improves estimates of

- microbial diversity and abundance". In: PLoS Comput Biol 8.10. Ed. by Christian von Mering, e1002743.
- Klappenbach, J. A., J. M. Dunbar, and T. M. Schmidt (2000). "rRNA Operon copy number reflects ecological strategies of bacteria". In: Appl Environ Microbiol 66.4, pp. 1328-1333.
- Klappenbach, JA et al. (2001). "rrndb: the Ribosomal RNA Operon Copy Number Database." In: 29, pp. 181-4.
- Kong, H. H. et al. (2012). "Temporal shifts in the skin microbiome associated with disease flares and treatment in children with atopic dermatitis". In: Genome Res 22.5, pp. 850-859.
- Labeda, D. P., K. Hatano, et al. (2001). "Revival of the genus Lentzea and proposal for Lechevalieria gen. nov". In: Int J Syst Evol Microbiol 51.3, pp. 1045-1050.
- Labeda, D. P. and R. M. Kroppenstedt (2008). "Proposal for the new genus Allokutzneria gen. nov. within the suborder Pseudonocardineae and transfer of Kibdelosporangium albatum Tomita et al. 1993 as Allokutzneria albata comb. nov." In: Int J Syst Evol Microbiol 58.6, pp. 1472–1475.
- Labeda, D. P. and A. J. Lyons (1989). "Saccharothrix texasensis sp. nov. and Saccharothrix waywayandensis sp. nov." In: Int J Syst Bacteriol 39.3, pp. 355–358.
- Lewin, Ralph A. (1970). "New Herpetosiphon species (Flexibacterales)". In: Canadian Journal of Microbiology 16.6, pp. 517-520.
- Lu, Y. (2005). "In situ stable isotope probing of methanogenic archaea in the rice rhizosphere". In: Science 309.5737, pp. 1088-1090.
- Manefield, M. et al. (2002). "RNA Stable isotope probing a novel means of linking microbial community function to phylogeny". In: Appl Environ Microbiol 68.11, pp. 5367–5373.
- Nannipieri, P. et al. (2003a). "Microbial diversity and soil functions". In: European Journal of Soil Science 54.4, pp. 655–670.
- (2003b). "Microbial diversity and soil functions". In: European Journal of Soil Science 54.4, pp. 655–670.
- Neff, Jason C. and Gregory P. Asner (2001). "Dissolved organic carbon in terrestrial ecosystems: synthesis and a model". In: Ecosystems 4.1, pp. 29–48.
- Neufeld, Josh D et al. (2007). "DNA stable-isotope probing". In: Nature Protocols 2.4, pp. 860–866.
- O'Donnell, Anthony G. et al. (2002). "Plants and fertilisers as drivers of change in microbial community structure and function in soils". In: Interactions in the Root Environment: An Integrated Approach. Springer Netherlands, pp. 135–145.
- Otsuka, S. et al. (2012). "Roseimicrobium gellanilyticum gen. nov. sp. nov., a new member of the class Verrucomicrobiae". In: Int J Syst Evol Microbiol 63.Pt 6, pp. 1982-1986.
- Parveen, Bushra et al. (2013). "Temporal dynamics and phylogenetic diversity of free-living and particleassociated Verrucomicrobia communities in relation

- to environmental variables in a mesotrophic lake". In:  $FEMS\ Microbiol\ Ecol\ 83.1,\ pp.\ 189-201.$  Philippot, Laurent et al. (2010). "The ecological coher-
- Philippot, Laurent et al. (2010). "The ecological coherence of high bacterial taxonomic ranks". In: Nat Rev Micro 8.7, pp. 523–529.
- Rienzi, Sara C Di et al. (2013). "The human gut and groundwater harbor non-photosynthetic bacteria belonging to a new candidate phylum sibling to Cyanobacteria". In: *eLIFE* 2.
- Rui, J., J. Peng, and Y. Lu (2009). "Succession of bacterial populations during plant residue decomposition in rice field soil". In: Appl Environ Microbiol 75.14, pp. 4879–4886.
- Schellenberger, Stefanie, Steffen Kolb, and Harold L. Drake (2010). "Metabolic responses of novel cellulotyic and saccharolytic agricultural soil Bacteria to oxygen". In: *Environ Microbiol* 12.4, pp. 845–861.
- Schimel, J. (1995). "Ecosystem consequences of microbial diversity and community structure". In: Arctic and alpine biodiversity: patterns, causes and ecosystem consequences. Ed. by Prof Dr F. Stuart Chapin III and Prof Dr Christian Korner. Ecological Studies 113. Springer Berlin Heidelberg, pp. 239–254.
- Schimel, Joshua P. and Sean M. Schaeffer (2012). "Microbial control over carbon cycling in soil". In: Frontiers in Microbiology 3.
- Schloss, Patrick D and Jo Handelsman (2006). "Toward a census of bacteria in soil". In: *PLoS Comput Biol* 2.7. PMID: 16848637 PMCID: PMC1513271.
- Schneckenberger, Katja et al. (2008). "Microbial utilization and mineralization of [14C]glucose added in six orders of concentration to soil". In: Soil Biology and Biochemistry 40.8, pp. 1981–1988.
- Sollins, Phillip, Peter Homann, and Bruce A. Caldwell (1996). "Stabilization and destabilization of soil

- organic matter: mechanisms and controls". In: *Geoderma* 74.1-2, pp. 65–105.
- Soo, R. M. et al. (2014). "An expanded genomic representation of the phylum cyanobacteria". In: *Genome Biology and Evolution* 6.5, pp. 1031–1045.
- Strickland, Michael S et al. (2009). "Testing the functional significance of microbial community composition". In: *Ecology* 90.2, pp. 441–451.
- Tavernier, M. L. et al. (2008). " $\beta$ -(1,4)-Polyglucuronic Acids An Overview". In: TOBIOTJ 2.1, pp. 73–86.
- Tomita, K., Y. Hoshino, and T. Miyaki (1993). "Kibde-losporangium albatum sp. nov. Producer of the Antiviral Antibiotics Cycloviracins". In: Int J Syst Bacteriol 43.2, pp. 297–301.
- Tringe, S. G. (2005). "Comparative metagenomics of microbial communities". In: Science 308.5721, pp. 554–557.
- Vance, I. et al. (1980). "Extracellular Cellulase Production by Sporocytophaga myxococcoides NCIB 8639". In: Microbiology 117.1, pp. 235–241.
- Wertz, J. T. et al. (2011). "Genomic and physiological characterization of the verrucomicrobia isolate diplosphaera colitermitum gen. nov. sp. nov., reveals microaerophily and nitrogen fixation genes". In: *Appl Environ Microbiol* 78.5, pp. 1544–1555.
- Wohl, Debra L, Satyam Arora, and Jessica R Gladstone (2004). "Functional redundancy supports biodiversity and ecosystem function in a closed and constant environment". In: *Ecology* 85.6, pp. 1534–1540.
- Yanagita, Tomomichi (1990). Natural microbial communities: ecological and physiological features. Japan Scientific Societies Press. Springer-Verlag.



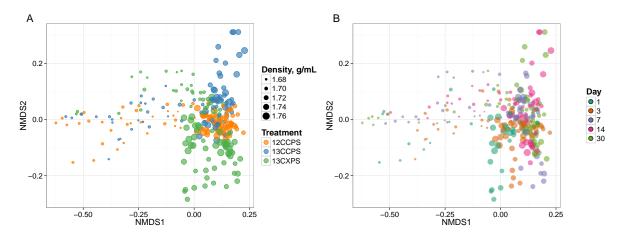
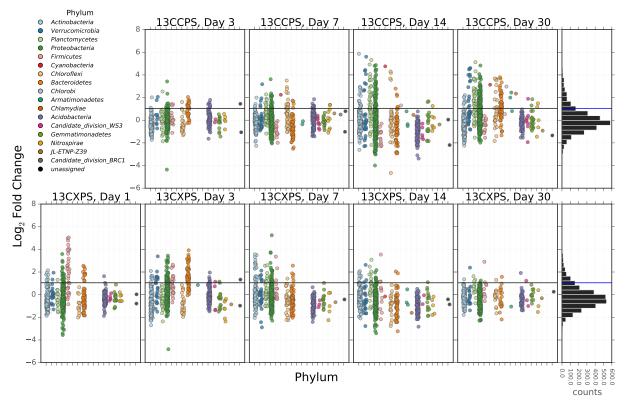


Fig. 1. NMDS analysis from weighted unifrac distances of 454 sequence data from SIP fractions of each treatment over time. Twenty fractions from a CsCl gradient fractionation for each treatment at each time point were sequenced (Fig. S1). Each point on the NMDS represents the bacterial composition based on 16S sequencing for a single fraction where the size of the point is representative of the density of that fraction and the colors represent the treatments (A) or days (B).



**Fig. 2.** Log2 fold change of  $^{13}$ C-responders in cellulose treatment (top) and xylose treatment (bottom). Log2 fold change is based on the relative abundance in the experimental treatment compared to the control within the density range 1.7125-1.755 g ml $^{-1}$ . Taxa are colored by phylum. 'Counts' is a histogram of log2 fold change values.



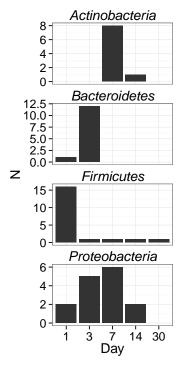
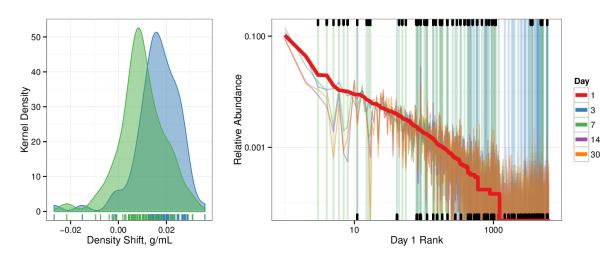


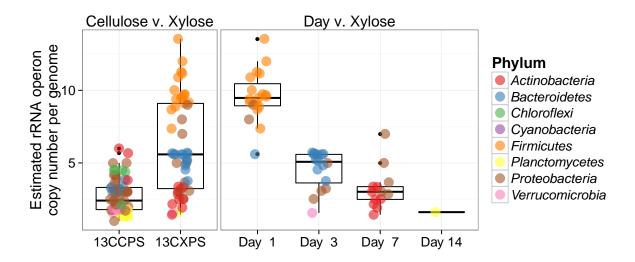
Fig. 3. Counts of <sup>13</sup>C-xylose responders in the Actinobacteria, Bacteroidetes, Firmicutes and Proteobacteria at days 1, 3, 7 and 30.



**Fig. 4.**  $^{13}$ C-responder characteristics based on density shift (A) and rank (B). Kernel density estimation of  $^{13}$ C-responder's density shift in cellulose treatment (blue) and xylose treatment (green) demonstrates degree of labeling for responders for each respective substrate.  $^{13}$ C-responders in rank abundance are labeled by substrate (cellulose, blue; xylose, green). Ticks at top indicate location of  $^{13}$ C-cylose responders in bulk community. Ticks at bottom indicate location of  $^{13}$ C-cellulose responders in bulk community. OTU rank was assessed from day 1 bulk samples.

12 | www.pnas.org — — Footline Author





 $\textbf{Fig. 5.} \quad \text{Estimated rRNA operon copy number per genome for } ^{13} \text{C responding OTUS. Panel titles indicate which labeled substrate(s) are depicted.}$ 



**Supplemental Figures and Tables** 



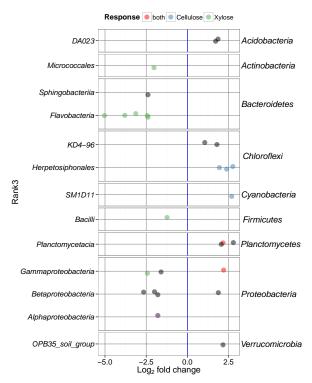


Fig. S1. Fold change time<sup>-1</sup> for OTUs that changed significantly in abundance over time. One panel per phylum (phyla indicated on the right). Taxonomic class indicated on the left.

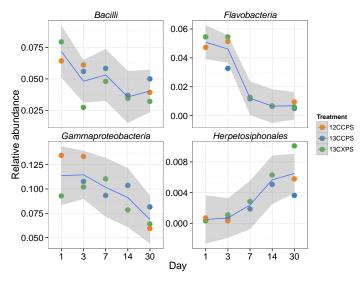


Fig. S2. Relative abundance versus day for classes that changed significantly in relative abundance with time.



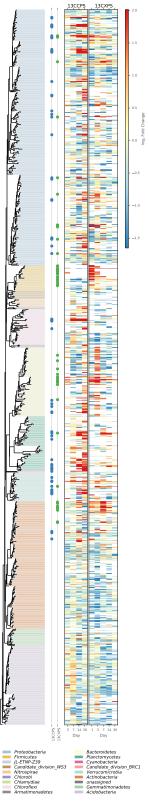


Fig. S3. Phylogenetic tree of sequences passing a user defined sparcity threshold (0.6) for at least one day of the time series. Branches are colored by phylum. <sup>13</sup>C-responders for cellulose (blue) and xylose (green) are indicated by a point beside the respective branch. Heatmap demonstrates log<sub>2</sub> fold change of each way has cough—the-full time series for both treatments (cellulose, left; xylose, right).

Footline Author



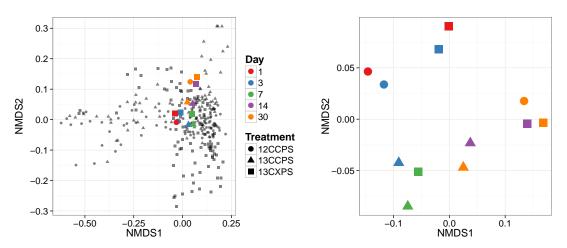


Fig. S4. Ordination of bulk gradient fraction phylogenetic profiles.



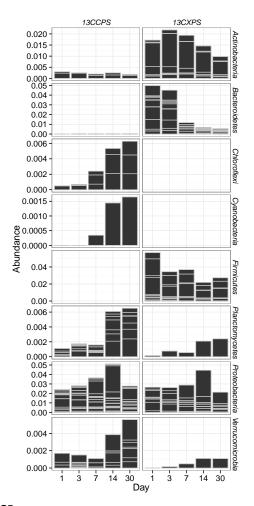


Fig. S5. Sum of bulk abundances with each phylum for responder OTUs.

18 www.pnas.org — — Footline Author



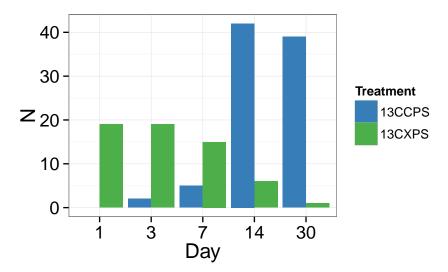


Fig. S6. Counts of responders to each isotopically labeled substrate (cellulose and xylose) over time.

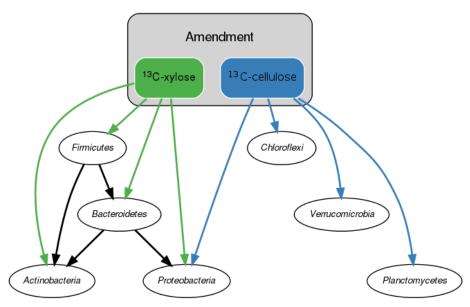


Fig. S7. Conceptual model of soil food web in this experiment.



Table S1:  $^{13}$ C-cellulose responders BLAST against Living Tree Project

OTU ID	Fold change	Day	Top BLAST hits	BLAST	%ID	Phylum; Class; Order
OTU.4446	3.49	7	Catenuloplanes niger, Catenuloplanes castaneus, Catenuloplanes atrovinosus, Catenuloplanes crispus, Catenuloplanes nepalensis, Catenuloplanes japonicus		97.72	Actinobacteria Frankiales Nakamurellaceae
OTU.62	2.57	7	Nakamurella flavida		100.0	Actinobacteria Frankiales Nakamurellaceae
OTU.24	2.81	7	Cellulomonas aerilata, Cellulomonas humilata, Cellulomonas terrae, Cellulomonas soli, Cellulomonas xylanilytica		100.0	Actinobacteria Micrococcales Cellulomonadaceae
OTU.4	2.84	7	Agromyces ramosus		100.0	Actinobacteria Micrococcales Microbacteriaceae
OTU.37	2.68	7	Phycicola gilvus, Microterricola viridarii, Frigoribacterium faeni, Frondihabitans sp. RS-15, Frondihabitans australicus		100.0	Actinobacteria Micrococcales Microbacteriaceae
OTU.5284	3.56	7	Isoptericola nanjingensis, Isoptericola hypogeus, Isoptericola variabilis		98.63	Actinobacteria Micrococcales Promicromonosporaceae
OTU.252	3.34	7	Promicromonospora thailandica		100.0	Actinobacteria Micrococcales Promicromonosporaceae
OTU.244	3.08	7	Cellulosimicrobium funkei, Cellulosimicrobium terreum		100.0	Actinobacteria Micrococcales Promicromonosporaceae
OTU.760	2.89	3	Dyadobacter hamtensis		98.63	Bacteroidetes Cytophagia Cytophagales
OTU.14	3.92	3	Flavobacterium oncorhynchi, Flavobacterium glycines, Flavobacterium succinicans		99.09	Bacteroidetes Flavobacteria Flavobacteriales
OTU.6203	3.32	3	Flavobacterium granuli, Flavobacterium glaciei		100.0	Bacteroidetes Flavobacteria Flavobacteriales
OTU.159	3.16	3	Flavobacterium hibernum		98.17	Bacteroidetes Flavobacteria Flavobacteriales
OTU.2379	3.1	3	Flavobacterium pectinovorum, Flavobacterium sp. CS100		97.72	Bacteroidetes Flavobacteria Flavobacteriales
OTU.131	3.07	3	Flavobacterium fluvii, Flavobacteria bacterium HMD1033, Flavobacterium sp. HMD1001		100.0	Bacteroidetes Flavobacteria Flavobacteriales
OTU.3540	2.52	3	Flavobacterium terrigena		99.54	Bacteroidetes Flavobacteria Flavobacteriales
OTU.107	2.25	3	Flavobacterium sp. 15C3, Flavobacterium banpakuense		99.54	Bacteroidetes Flavobacteria Flavobacteriales
OTU.277	3.52	3	Solibius ginsengiterrae		95.43	Bacteroidetes Sphingobacteriia Sphingobacteriales
OTU.183	3.31	3	No hits of at least 90% identity		89.5	Bacteroidetes Sphingobacteriia Sphingobacteriales
OTU.5906	3.16	3	Terrimonas sp. M-8		96.8	Bacteroidetes Sphingobacteriia Sphingobacteriales
OTU.360	2.98	3	Flavisolibacter ginsengisoli		95.0	Bacteroidetes Sphingobacteriia Sphingobacteriales

 ${f 20} \;\; ig| \;\; {\sf www.pnas.org} \, --$  Footline Author



Table S1 – continued from previous page

OTU ID	Fold change	Day	Top BLAST hits	BLAST %ID	Phylum;Class;Order
OTU.369	5.05	1	Paenibacillus sp. D75, Paenibacillus glycanilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.267	4.97	1	Paenibacillus pabuli, Paenibacillus tundrae, Paenibacillus taichungensis, Paenibacillus xylanexedens, Paenibacillus xylanilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.1040	4.78	1	Paenibacillus daejeonensis	100.0	Firmicutes Bacilli Bacillales
OTU.57	4.39	1	Paenibacillus castaneae	98.62	Firmicutes Bacilli Bacillales
OTU.394	4.06	1	$Paenibacillus\ pocheonensis$	100.0	Firmicutes Bacilli Bacillales
OTU.319	3.98	1	Paenibacillus xinjiangensis	97.25	Firmicutes Bacilli Bacillales
OTU.5603	3.96	1	Paenibacillus uliginis	100.0	Firmicutes Bacilli Bacillales
OTU.1069	3.85	1	Paenibacillus terrigena	100.0	Firmicutes Bacilli Bacillales
OTU.843	3.62	1	Paenibacillus agarexedens	100.0	Firmicutes Bacilli Bacillales
OTU.2040	2.91	1	Paenibacillus pectinilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.3	2.61	1	[Brevibacterium] frigoritolerans, Bacillus sp. LMG 20238, Bacillus coahuilensis m4-4, Bacillus simplex	100.0	Firmicutes Bacilli Bacillales
OTU.335	2.53	1	$Paenibacillus\ thail and ensis$	98.17	Firmicutes Bacilli Bacillales
OTU.3507	2.36	1	Bacillus spp.	98.63	Firmicutes Bacilli Bacillales
OTU.8	2.26	1	Bacillus niacini	100.0	Firmicutes Bacilli Bacillales
OTU.4743	2.24	1	Lysinibacillus fusiformis, Lysinibacillus sphaericus	99.09	Firmicutes Bacilli Bacillales
OTU.9	2.04	1	Bacillus megaterium, Bacillus flexus	100.0	Firmicutes Bacilli Bacillales
OTU.22	2.8	7	Paracoccus sp. NB88	99.09	Proteobacteria Alphaproteobacteria Rhodobacterales
OTU.5	3.69	7	Delftia tsuruhatensis, Delftia lacustris	100.0	Proteobacteria Betaproteobacteria Burkholderiales
OTU.346	3.44	3	Pseudoduganella violaceinigra	99.54	Proteobacteria Betaproteobacteria Burkholderiales
OTU.32	3.0	3	Sandaracinus amylolyticus	94.98	Proteobacteria Deltaproteobacteria Myxococcales
OTU.68	3.74	7	Shigella flexneri, Escherichia fergusonii, Escherichia coli, Shigella sonnei	100.0	Proteobacteria Gammaproteobacteria Enterobacteriales
OTU.290	3.59	1	Pantoea spp., Kluyvera spp., Klebsiella spp., Erwinia spp., Enterobacter spp., Buttiauxella spp.	100.0	Proteobacteria Gammaproteobacteria Enterobacteriales
OTU.11	5.25	7	Stenotrophomonas pavanii, Stenotrophomonas maltophilia, Pseudomonas geniculata	99.54	Proteobacteria Gammaproteobacteria Xanthomonadales
OTU.48	2.99	1	Aeromonas spp.	100.0	Proteobacteria Gammaproteobacteria aaa34a10
OTU.241	3.38	3	No hits of at least 90% identity	87.73	Verrucomicrobia Spartobacteria Chthoniobacterales



Table S2: <sup>13</sup>C-xylose responders BLAST against Living Tree Project

OTU ID	Fold change	Day	Top BLAST hits	BLAST %ID	Phylum; Class; Order
OTU.4446	3.49	7	Catenuloplanes niger, Catenuloplanes castaneus, Catenuloplanes atrovinosus, Catenuloplanes crispus, Catenuloplanes nepalensis, Catenuloplanes japonicus	97.72	Actinobacteria Frankiales Nakamurellaceae
OTU.62	2.57	7	Nakamurella flavida	100.0	Actinobacteria Frankiales Nakamurellaceae
OTU.24	2.81	7	Cellulomonas aerilata, Cellulomonas humilata, Cellulomonas terrae, Cellulomonas soli, Cellulomonas xylanilytica	100.0	Actinobacteria Micrococcales Cellulomonadaceae
OTU.4	2.84	7	Agromyces ramosus	100.0	Actinobacteria Micrococcales Microbacteriaceae
OTU.37	2.68	7	Phycicola gilvus, Microterricola viridarii, Frigoribacterium faeni, Frondihabitans sp. RS-15, Frondihabitans australicus	100.0	Actinobacteria Micrococcales Microbacteriaceae
OTU.5284	3.56	7	Isoptericola nanjingensis, Isoptericola hypogeus, Isoptericola variabilis	98.63	Actinobacteria Micrococcales Promicromonosporaceae
OTU.252	3.34	7	Promicromonospora thailandica	100.0	Actinobacteria Micrococcales Promicromonosporaceae
OTU.244	3.08	7	Cellulosimicrobium funkei, Cellulosimicrobium terreum	100.0	Actinobacteria Micrococcales Promicromonosporaceae
OTU.760	2.89	3	Dyadobacter hamtensis	98.63	Bacteroidetes Cytophagia Cytophagales
OTU.14	3.92	3	Flavobacterium oncorhynchi, Flavobacterium glycines, Flavobacterium succinicans	99.09	Bacteroidetes Flavobacteria Flavobacteriales
OTU.6203	3.32	3	Flavobacterium granuli, Flavobacterium glaciei	100.0	Bacteroidetes Flavobacteria Flavobacteriales
OTU.159	3.16	3	Flavobacterium hibernum	98.17	Bacteroidetes Flavobacteria Flavobacteriales
OTU.2379	3.1	3	Flavobacterium pectinovorum, Flavobacterium sp. CS100	97.72	Bacteroidetes Flavobacteria Flavobacteriales
OTU.131	3.07	3	Flavobacterium fluvii, Flavobacteria bacterium HMD1033, Flavobacterium sp. HMD1001	100.0	Bacteroidetes Flavobacteria Flavobacteriales
OTU.3540	2.52	3	Flavobacterium terrigena	99.54	Bacteroidetes Flavobacteria Flavobacteriales
OTU.107	2.25	3	Flavobacterium sp. 15C3, Flavobacterium banpakuense	99.54	Bacteroidetes Flavobacteria Flavobacteriales
OTU.277	3.52	3	Solibius ginsengiterrae	95.43	$Bacteroide tes\ Sphing obacteriia$ $Sphing obacteriales$
OTU.183	3.31	3	No hits of at least 90% identity	89.5	Bacteroidetes Sphingobacteriia Sphingobacteriales
OTU.5906	3.16	3	Terrimonas sp. M-8	96.8	$Bacteroidetes\ Sphingobacteriia$ $Sphingobacteriales$
OTU.360	2.98	3	$Flavisoli bacter\ ginsengi soli$	95.0	Bacteroidetes Sphingobacteriia Sphingobacteriales



Table S2 – continued from previous page

OTU ID	Fold change	Day	Top BLAST hits	BLAST %ID	Phylum;Class;Order
OTU.369	5.05	1	Paenibacillus sp. D75, Paenibacillus glycanilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.267	4.97	1	Paenibacillus pabuli, Paenibacillus tundrae, Paenibacillus taichungensis, Paenibacillus xylanexedens, Paenibacillus xylanilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.1040	4.78	1	Paenibacillus daejeonensis	100.0	Firmicutes Bacilli Bacillales
OTU.57	4.39	1	Paenibacillus castaneae	98.62	Firmicutes Bacilli Bacillales
OTU.394	4.06	1	Paenibacillus pocheonensis	100.0	Firmicutes Bacilli Bacillales
OTU.319	3.98	1	Paenibacillus xinjiangensis	97.25	Firmicutes Bacilli Bacillales
OTU.5603	3.96	1	Paenibacillus uliginis	100.0	Firmicutes Bacilli Bacillales
OTU.1069	3.85	1	Paenibacillus terrigena	100.0	Firmicutes Bacilli Bacillales
OTU.843	3.62	1	Paenibacillus agarexedens	100.0	Firmicutes Bacilli Bacillales
OTU.2040	2.91	1	Paenibacillus pectinilyticus	100.0	Firmicutes Bacilli Bacillales
OTU.3	2.61	1	[Brevibacterium] frigoritolerans, Bacillus sp. LMG 20238, Bacillus coahuilensis m4-4, Bacillus simplex	100.0	Firmicutes Bacilli Bacillales
OTU.335	2.53	1	$Paeniba cillus\ thail and ensis$	98.17	Firmicutes Bacilli Bacillales
OTU.3507	2.36	1	Bacillus spp.	98.63	Firmicutes Bacilli Bacillales
OTU.8	2.26	1	Bacillus niacini	100.0	Firmicutes Bacilli Bacillales
OTU.4743	2.24	1	Lysinibacillus fusiformis, Lysinibacillus sphaericus	99.09	Firmicutes Bacilli Bacillales
OTU.9	2.04	1	Bacillus megaterium, Bacillus flexus	100.0	Firmicutes Bacilli Bacillales
OTU.22	2.8	7	Paracoccus sp. NB88	99.09	Proteobacteria Alphaproteobacteria Rhodobacterales
OTU.5	3.69	7	Delftia tsuruhatensis, Delftia lacustris	100.0	Proteobacteria Betaproteobacteria Burkholderiales
OTU.346	3.44	3	Pseudoduganella violaceinigra	99.54	Proteobacteria Betaproteobacteria Burkholderiales
OTU.32	3.0	3	Sandaracinus amylolyticus	94.98	Proteobacteria Deltaproteobacteria Myxococcales
OTU.68	3.74	7	Shigella flexneri, Escherichia fergusonii, Escherichia coli, Shigella sonnei	100.0	Proteobacteria Gammaproteobacteria Enterobacteriales
OTU.290	3.59	1	Pantoea spp., Kluyvera spp., Klebsiella spp., Erwinia spp., Enterobacter spp., Buttiauxella spp.	100.0	Proteobacteria Gammaproteobacteria Enterobacteriales
OTU.11	5.25	7	Stenotrophomonas pavanii, Stenotrophomonas maltophilia, Pseudomonas geniculata	99.54	Proteobacteria Gammaproteobacteria Xanthomonadales
OTU.48	2.99	1	Aeromonas spp.	100.0	Proteobacteria Gammaproteobacteria aaa34a10
OTU.241	3.38	3	No hits of at least 90% identity	87.73	Verrucomicrobia Spartobacteria Chthoniobacterales