

Supplemental Information

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1 Supplemental Methods

1.1 Soil Collection and Preparation

We collected soils from an organic farm in Penn Yan, New York. Soils were Honoeye/Lima, a silty clay loam on calcareous bedrock. To get a field average, cores (5 cm diameter x 10 cm depth) were collected in duplicate from six different sampling locations around the field using a slide hammer bulk density sampler (coordinates: (1) N 42° 40.288 W 77° 02.438, (2) N 42 40.296 W 77° 02.438, (3) N 42° 40.309 W 77° 02.445, (4) N 42° 40.333 W 77° 02.425, (5) N 42° 40.340 W 77° 02.420, (6) N 42° 40.353 W 77° 02.417) on November 21, 2011. Soil cores were sieved (2mm), homogenized by mixing, and stored at 4 °C until pre-incubation (within 1-2 week of collection). Carbon (C) and nitrogen (N) content were previously measured for these soils [1]. Reported soil C values for the organic field were 12.15 (± s.d. 0.78) mg C g⁻¹ dry soil and 1.16 (± s.d. 0.13) mg N g⁻¹ dry soil [1].

1.2 Cellulose production

Bacterial cellulose was produced by *Gluconoacetobacter xylinus* grown in Heo and Son [2] minimal media (HS medium) made with 0.1% glucose and without inositol. For the production of ^{13}C -cellulose, $^{13}\text{C}_6$ -D-glucose, 99 atom % ^{13}C (Isotec) was used. Cellulose was produced in 1L Erlenmeyer flasks containing 100 mL HS medium inoculated with three colonies of *Gluconoacetobacter xylinus* grown on HS agar plates. Flasks were incubated statically in the dark at 30°C for 2-3 weeks. Cellulose pellicules were decanted, rinsed with deionized water, suspended in two volumes of 1% Alconox, and then autoclaved. Cellulose pellicules were purified by dialysis for 12 hr in 1 L deionized water and dialysis was repeated 10 times. Harvested pellicules were dried overnight (60°C), cut into pieces, and ground using a 5100 Mixer/Mill (SPEX SamplePrep, Metuchen, NJ), and dry sieved to 53 μm -250 μm . The particulate size range was selected to be representative of particulate organic matter in soils (3).

The purity of ground cellulose was checked by biological assay, Benedict's reducing sugars assay, Bradford assay, and isotopic analysis. *E. coli* is not able to use cellulose as a C source but is capable of growth on a variety of nutrients available in the HS medium. The biological assay consisted of *E. coli* inoculated into minimal M9 media which lacked a C source and was supplemented with either: (1) 0.01% glucose, (2) 2.5 mg purified, ground cellulose, (3) 25 mg purified, ground cellulose, (4) 25 mg purified, ground cellulose and 0.01% glucose. Growth in media was checked by spectrometer (OD_{450}). No measurable growth was observed with either 2 mg or 25 mg cellulose, indicating absence of contaminating nutrients that can support growth of *E. coli*. In addition, the presence of 25 mg cellulose did not inhibit the growth of *E. coli* cultures provided with glucose (relative to control), indicating the absence of compounds in the purified cellulose that could inhibit microbial growth.

Purified cellulose was also assayed for residual proteins and sugars using Bradford and Benedict's assays, respectively. Bradford assay was performed as in [3]. Ground, purified cellulose contained 6.92 μg protein mg cellulose $^{-1}$ (*i.e.* 99.31% purity). Reducing sugars were not detected in cellulose using Benedict's reducing sugar assay [4] tested at 10 mg cellulose ml $^{-1}$. Finally, ^{13}C -cellulose had an average 96% \pm 5 (s.d.) degree of ^{13}C labeling as determined by isotopic analysis (UCDavis Stable Isotope Facility).

1.3 Soil microcosms

Microcosms were created by adding 10 g d.w. sieved soil to a 250 mL Erlenmeyer flask capped with a butyl rubber stopper. The headspace was flushed with air every 3 days which was sufficient to prevent anoxia (data not shown). Microcosms were pre-incubated at room temperature for 2 weeks until the soil respiration rate (determined by GCMS measurement of head space CO_2) had stabilized. Sieving causes a transient increase in soil respiration rate presumably due to the liberation of fresh labile soil organic matter [5]. Pre-incubation ensures that this labile organic matter is consumed and/or stabilized prior to the beginning of the experiment. Respiration rate (CO_2) stabilized after 10 days (data not shown).

Three parallel treatments were established. Each treatment received the same amendment, where the only difference was the isotopically labeled component in the amendment. The treatments included an unlabeled control treatment and treatments that substituted either ^{13}C -cellulose (synthesized as described above) or $^{13}\text{C}_5$ -D-xylose (98 atom % ^{13}C (Isotec)) for their unlabeled equivalents. The molecular composition of the amendment was designed to approximate switch-grass biomass with hemicellulose replaced by its constituent monomers [6, 7]. The amendment was

1301 added at 5.3 mg g⁻¹ d.w. soil which is representative of natural concentrations in soil during early
 1302 phases of decomposition [8]. The amendment contained by mass: 38% cellulose, 23% lignin, 20%
 1303 xylose, 3% arabinose, 1% galactose, 1% glucose, and 0.5% mannose, 10.6% amino acids (Teknova
 1304 C0705), and 2.9% Murashige Skoog basal salt mixture which contains macro- and micro-nutrients
 1305 that are associated with plant biomass (Sigma Aldrich M5524). The amendment had a C:N ratio of
 1306 10. Cellulose (2 mg cellulose g⁻¹ d.w. soil) and lignin (1.2 mg lignin g⁻¹ d.w. soil) were uniformly
 1307 distributed over the soil surface as a powder and the remaining constituents were added in solution
 1308 in a volume of 0.12 ml g⁻¹ d.w. soil. The volume of liquid was determined in relation to soil
 1309 moisture to achieve 50% water holding capacity. Water holding capacity of 50% was chosen, in re-
 1310 lation to the texture for this soil, to achieve approximately 70% water filled pore space, which is the
 1311 optimal water content for respiration [9]. A total of 12 microcosms were established per treatment.
 1312 Microcosms were sampled destructively on days 1, 3, 7, 14, and 30 and soils were frozen at -80
 1313 °C. The cellulose treatment was not sampled on day 1 because it was not expected that significant
 1314 cellulose metabolism would have occurred within this time. The abbreviation 13CXPS refers to the
 1315 ¹³C-xylose treatment (¹³C Xylose Plant Simulant), 13CCPS refers to the ¹³C-cellulose treatment
 1316 and 12CCPS refers to the unlabeled control. A subset of soil from each sample was reserved for
 1317 isotopic analysis at the Cornell University Stable Isotope Laboratory to determine the mass of ¹³C
 1318 remaining in soil.

1319 **1.4 Nucleic acid extraction**

1320 Nucleic acids were extracted from 0.25 g soil using a modified Griffiths protocol [10]. Cells were
 1321 lysed by bead beating for 1 min at 5.5 m s⁻¹ in 2 mL lysis tubes containing 0.5 g of 0.1 mm diameter
 1322 silica/zirconia beads (treated at 300 °C for 4 hours to remove RNases), 0.5 mL extraction buffer
 1323 (240 mM Phosphate buffer 0.5% N-lauryl sarcosine), and 0.5 mL phenol-chloroform-isoamyl alcohol
 1324 (25:24:1) for 1 min at 5.5 m s⁻¹. After lysis, 85 µL 5 M NaCl and 60 µL 10% hexadecyltrimmonium
 1325 bromide (CTAB)/0.7 M NaCl were added to lysis tube, vortexed, chilled for 1 min on ice, and
 1326 centrifuged at 16,000 x g for 5 min at 4°C. The aqueous layer was transferred to a new tube and
 1327 reserved on ice. To increase DNA recovery, the pellet was back extracted with 85 µL 5 M NaCl and
 1328 0.5 mL extraction buffer. The aqueous extract was washed with 0.5 mL chloroform:isoamyl alcohol
 1329 (24:1). Nucleic acids were precipitated by addition of 2 volumes polyethylene glycol solution (30%
 1330 PEG 8000, 1.6 M NaCl) on ice for 2 hrs, followed by centrifugation at 16,000 x g, 4°C for 30 min.
 1331 The supernatant was discarded and pellets were washed with 1 mL ice cold 70% EtOH. Pellets
 1332 were air dried, resuspended in 50 µL TE and stored at -20 °C. To prepare nucleic acid extracts
 1333 for isopycnic centrifugation as previously described [11], DNA was size selected (> 4kb) using 1%
 1334 low melt agarose gel and β-agarase I enzyme extraction per manufacturers protocol (New England
 1335 Biolab, M0392S). Final resuspension of DNA pellet was in 50 µL TE.

1336 **1.5 Isopycnic centrifugation and fractionation**

1337 We fractionated DNA on density gradients for ¹³C-xylose treatments (days 1, 3, 7, 14, 30), ¹³C-
 1338 cellulose treatments (days 3, 7, 14, 30), and control treatments (days 1, 3, 7, 14, 30). A total of
 1339 5 µg DNA was added to each 4.7 mL CsCl density gradient. Density gradient were composed of
 1340 1.69 g mL⁻¹ CsCl mL⁻¹ in gradient buffer solution (pH 8.0 15 mM Tris-HCl, 15 mM EDTA, 15
 1341 mM KCl). Centrifugation was performed at 55,000 rpm 20 °C for 66 hr using a TLA-110 rotor in a
 1342 Bechman Coulter Optima MAX-E ultracentrifuge. Fractions of ~100 µL 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 $3.3 \mu\text{L s}^{-1}$ [12]. Fractions were collected in Acroprep 96 filter plates (part no. 5035, Pall Life Sciences). The refractive index of each fraction was measured using a Reichart AR200 digital refractometer modified as previously described to measure a volume of $5 \mu\text{L}$ [11]. Buoyant density was calculated from the refractive index as previously described [11] using the equation $\rho = a\eta - b$, where ρ is the density of the CsCl (g ml^{-1}), η is the measured refractive index, and a and b are coefficient values of 10.9276 and 13.593, respectively, for CsCl at 20°C [13] and correcting for non-CsCl salts in the gradient buffer. A total of 35 fractions were collected from each gradient and the average density between fractions was 0.0040 g mL^{-1} . The DNA was desalted by washing with TE (5X 200 μL) in the Acroprep filter wells. DNA was resuspended in 50 μL TE.

1.6 DNA Sequencing

1.6.1 PCR amplification of SSU rRNA genes

SSU rRNA genes were amplified from gradient fractions ($n = 20$ per gradient) and from non-fractionated DNA from soil. Barcoded primers consisted of: 454-specific adapter B, a 10 bp barcode (Reference 90), 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 PCR contained 1.25 U 1-1 AmpliTaq Gold (Life Technologies, Grand Island, NY; N8080243), 1X Buffer II (100 mM Tris-HCl, 500 mM KCl, pH 8.3), 2.5 mM MgCl₂, 200 M of each dNTP, 0.5 mg ml⁻¹ BSA, 0.2 M BA515F, 0.2 M BA806R, and 10 L of 1:30 DNA template in 25 l total volume). The PCR conditions were 95°C for 5min followed by 22 cycles of 95°C for 10 s, 53°C for 30 s, and 72°C for 30 s, followed by a final elongation at 72°C for 5 min. Amplification products were checked by 1% agarose gel. Reactions were performed in triplicate and pooled. Amplified DNA was gel purified (1% low melt agarose) using the Wizard SV gel and PCR clean-up system (Promega, Madison, WI; A9281) per manufacturers protocol. Samples were normalized by SequalPrepTM normalization plates (Invitrogen, Carlsbad, CA; A10510) and pooled in equimolar concentration. Amplicons were sequenced on Roche 454 FLX system using titanium chemistry at Selah Genomics (Columbia, SC).

1.6.2 DNA sequence quality control

SSU rRNA gene sequences were initially screened by maximum expected errors at a specific read length threshold [14]. Reads that had more than 0.5 expected errors at a length of 250 nt were discarded. The remaining reads were aligned to the Silva Reference Alignment as provided in the Mothur software package using the Mothur NAST aligner [15, 16]. Reads that did not align to the expected region of the SSU rRNA gene were discarded. After expected error and alignment based quality control. The remaining quality controlled reads were annotated using the UClust taxonomic annotation framework in [17, 18]. We used 97% cluster seeds from the Silva SSU rRNA database (release 111Ref) [19] as reference for taxonomic annotation (provided on the QIIME website) [19]. Quality control screening filtered out 344,472 of 1,720,480 raw sequencing reads leaving 1,376,008 reads for downstream analyses. Reads annotated as "Chloroplast", "Eukaryota", "Archaea", "Unassigned" or "mitochondria" were culled from the dataset.

1.6.3 OTU binning

Sequences were distributed into OTUs with a centroid based clustering algorithm (i.e. UPARSE [14]). The centroid selection also included robust chimera screening [14]. OTU centroids were established at a threshold of 97% sequence identity and non-centroid sequences were mapped back to centroids. Reads that could not be mapped to an OTU centroid at greater than or equal to 97% sequence identity were discarded.

1.6.4 Phylogenetic reconstruction

We used SSU-Align [20, 21] to align SSU rRNA gene sequences. Columns in the alignment that were aligned with poor confidence ($< 95\%$ of characters had posterior probability $> 95\%$) were not considered when building the phylogenetic tree leaving a multiple sequence alignment of 216 columns. Additionally, the alignment was trimmed to coordinates such that all sequences in the alignment began and ended at the same positions. FastTree [22] was used with default parameters to build the phylogeny.

1.6.5 Ordination and statistical analysis of differences in SSU rRNA gene composition

NMDS ordination was performed on weighted Unifrac [23] distances between samples. The Phyloseq [24] wrapper for Vegan [25] (both R packages) was used to compute sample values along NMDS axes. The 'adonis' function in Vegan was used to perform Adonis tests (default parameters) [26].

1.7 OTU characteristics

1.7.1 Identifying ^{13}C responders

Figures S11 and S12 demonstrate raw data for responder and non-responder OTUs, respectively. Responders increased in relative abundance in the high density fractions due to ^{13}C -labeling of their DNA. As our data is compositional, often OTUs had consistent *relative* abundance across the density gradients indicating the OTU DNA concentration across the gradient mirrored that of the total DNA concentration. If OTU DNA is centered outside the main distribution of DNA due to G+C content and/or ^{13}C -labeling its relative abundance increases near the center of the OTU DNA concentration profile. Thus, we identified responders by finding OTUs enriched in high density fractions of ^{13}C -treatment gradients relative to control. This technique accounts for the variation in OTU base abundance and the variation in OTU G+C content (and therefore natural buoyant density) because relative abundances in gradient fractions from ^{13}C -treatments are always compared to those in corresponding gradient fractions from control gradients.

We used DESeq2 (R package), an RNA-Seq differential expression statistical framework [27], to identify OTUs that were enriched in high density gradient fractions from ^{13}C -treatments relative to corresponding gradient fractions from control treatments (for review of RNA-Seq differential expression statistics applied to microbiome OTU count data see [28]). We define "high density gradient fractions" as gradient fractions whose density falls between 1.7125 and 1.755 g ml $^{-1}$. Briefly, DESeq2 includes several features that enable robust estimates of standard error in addition to reliable ranking of logarithmic fold change (LFC) (i.e. gamma-Poisson regression coefficients) in OTU relative abundance even with low count OTUs where LFC can often be noisy. Further, statistical evaluation of LFC can be performed with user-selected thresholds, as opposed to the typical null hypothesis that LFC is exactly zero, enabling the most biologically interesting OTUs

1422 to be identified for subsequent analyses. For each OTU, we calculated LFC and corresponding
1423 standard errors for enrichment in high density gradient fractions of ^{13}C treatments relative to
1424 control. Subsequently, a one-sided Wald test was used to statistically assess LFC values. The user-
1425 defined null hypothesis was that LFC was less than one standard deviation above the mean of all
1426 LFC values. P-values were corrected for multiple comparisons using the Benjamini and Hochberg
1427 method [29]. We independently filtered OTUs on the basis of sparsity prior to correcting P-values
1428 for multiple comparisons. The sparsity value that yielded the most adjusted P-values less than 0.10
1429 was selected for independent filtering by sparsity. Briefly, OTUs were eliminated if they failed to
1430 appear in at least 45% of high density gradient fractions for a given ^{13}C /control treatment pair.
1431 These sparse OTUs are unlikely to have sufficient data to allow for the determination of statistical
1432 significance. We selected a false discovery rate of 10% to denote statistical significance.

1433 1.7.2 Estimating rrn copy number

1434 We estimated the *rrn* copy number for each OTU as described [30] (i.e. we used the code and
1435 reference information provided by the authors [30] directly). In brief, OTU centroid sequences were
1436 inserted into a reference SSU rRNA gene phylogeny [31] from organisms of known *rrn* copy number.
1437 The *rrn* copy number was then inferred from the phylogenetic placement in the reference phylogeny.

1438 1.7.3 NRI, NTI, and consenTRAIT

1439 NRI and NTI were calculated using the “picante” R package [32]. We used the “independentswap”
1440 null model for phylogenetic distribution. The consenTRAIT clade depth for xylose and cellulose
1441 responders was calculated using R code from the original publication describing the metric [33]
1442 which employs the R “adephylo” package [34].

1443 1.7.4 Buoyant density shift estimates

1444 DNA buoyant density (BD) increases with atom % ^{13}C . Therefore, the magnitude of $\Delta\hat{B}\hat{D}$ indicates
1445 the degree of isotopic labeling for an OTU. We measured $\Delta\hat{B}\hat{D}$ as the change in an OTU’s density
1446 profile center of mass between corresponding control and labeled gradients (Figure S11). Because
1447 all gradients did not span the same density range and gradient fractions cannot be taken at specific
1448 density positions, we limited our $\Delta\hat{B}\hat{D}$ analysis to the density range for where all density gradients
1449 overlapped. Within this density range we linearly interpolated 20 evenly spaced relative abundance
1450 values. The center of mass for an OTU along the density gradient was then the density weighted
1451 average where weights were the linearly interpolated relative abundance values. $\Delta\hat{B}\hat{D}$ values are
1452 based on relative abundance profiles and would be distorted in comparison to $\Delta\hat{B}\hat{D}$ based on
1453 absolute DNA concentration profiles and should be interpreted with this transformation in mind.

1454 1.7.5 Finding cultured relatives of OTUs

1455 OTU centroids were compared (BLAST [35, 36]) to sequences in “The All-Species Living Tree”
1456 project (LTP). The LTP is a collection of SSU rRNA gene sequences for classified species of Archaea
1457 and Bacteria [37]. We used LTP version 115 for analyses in this paper.

1.7.6 OTU changes in relative abundance with time

We identified OTUs that changed in relative abundance over time using DESeq2 [27]. Specifically, we used day treated as an ordered factor as the regressor with LFC of the relative abundance in non-fractionated DNA as the outcome in the general linear model. We used the default DESeq2 base mean independent filtering and disabled the Cook's cutoff outlier detection. The null model was that abundance did not change with time and we assessed significance at a false discovery rate of 10%.

1.8 Sequencing and density fractionation statistics

Microcosm DNA was density fractionated on CsCl density gradients. 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^{-1} . 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.

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