

# High-resolution phylogenetic microbial community profiling

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## Abstract

The representation of bacterial and archaeal genome sequences is strongly biased towards cultivated organisms, which belong to merely four phylogenetic groups. Functional information and inter-phyllum level relationships are still largely underexplored for candidate phyla, which are often referred to as ‘microbial dark matter’. Furthermore, a large portion of the 16S rRNA gene records in the GenBank database are labeled as “environmental samples” and “unclassified”, which is in part due to low read accuracy, potential chimeric sequences produced during PCR amplifications and the low resolution of short amplicons. In order to improve the phylogenetic classification of novel species and advance our knowledge of the ecosystem function of uncultivated microorganisms, high-throughput full length 16S rRNA gene sequencing methodologies with reduced biases are needed. We evaluated the performance of PacBio single-molecule real-time (SMRT) sequencing in high-resolution phylogenetic microbial community profiling. For this purpose, we compared PacBio and Illumina metagenomic shotgun and 16S rRNA gene sequencing of a mock community as well as of an environmental sample from Sakinaw Lake, British Columbia. Sakinaw Lake is known to contain a large percentage of microbial species from candidate phyla. Sequencing results show that community structure based on PacBio shotgun and 16S rRNA gene sequences is highly similar in both the mock and the environmental communities. Resolution power and community representation accuracy from SMRT sequencing data appeared to be independent of %GC content of microbial genomes and was higher when compared to Illumina-based metagenome shotgun and 16S rRNA gene (iTag) sequences, e.g. full-length sequencing resolved all 23 OTUs in the mock community, while iTags did not resolve closely related species. SMRT sequencing hence offers various potential benefits when characterizing uncharted microbial communities.

## Objectives

This study pursued the following aims:

- 1) To evaluate the representation accuracy between PacBio and Illumina (shotgun and 16S) of a known community
- 2) To evaluate the influence of GC-richness on sequence representation
- 3) To evaluate the resolution power of the phylogenetic diversity of Sakinaw Lake, especially with respect to candidate phyla
- 4) To evaluate the representation of candidate phyla OTUs and compare between PacBio 16S and iTags

## Results

### Mock Community Analysis

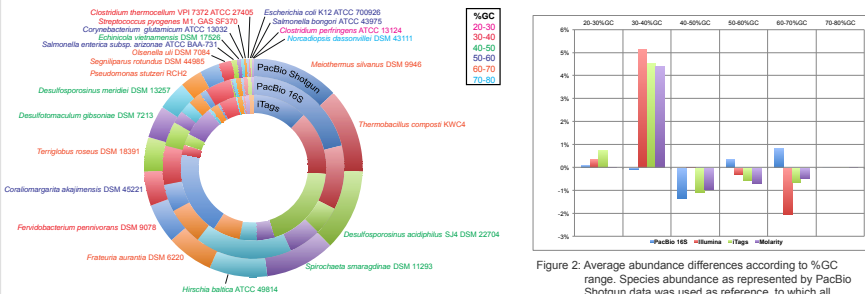


Figure 1: Abundance profiles of Mock community as represented by PacBio and Illumina sequences. Order follows the abundance profile of the PacBio Shotgun sequence data. Species name are colored by %GC range.

### Sakinaw Lake Analysis

Table 1: OTU-assignment statistics of classifiable sequences. Comparison between iTag and PacBio 16S data shows that datasets are very similar and do not show large discrepancies where sequences can be classified.

	iTags	PacBio 16S
# of phyla resolved (reads)	32 (4,407)	34 (5,000)
# of candidate phyla (reads)	18 (2,139)	16 (1,724)
# of families resolved (reads)	45 (3,906)	49 (4,636)
# of families from candidate phyla (reads)	22 (3,197)	18 (3,217)
# of OTUs (reads)	1,843 (4,407)	359 (5,000)

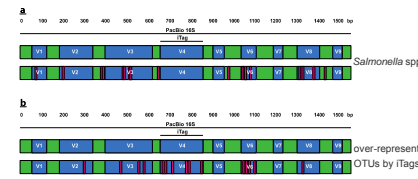


Figure 3: a) Sequence similarities between *Salmonella* spp. 16S full-length (97.4%) and V4-region (100%) sequences. b) Over-estimated diversity by iTag sequences can result from hypervariability over the V4-region compared to the full-length sequence.

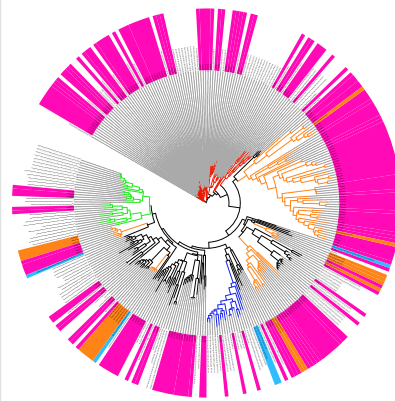


Figure 4: PacBio OTU tree (359 assigned OTUs). Pink: 175 (48.74%) unclassified OTUs; orange text labels: candidate phyla; blue text labels: phyla classified in PacBio data and absent from iTags. Branch colors denote phyla clades.

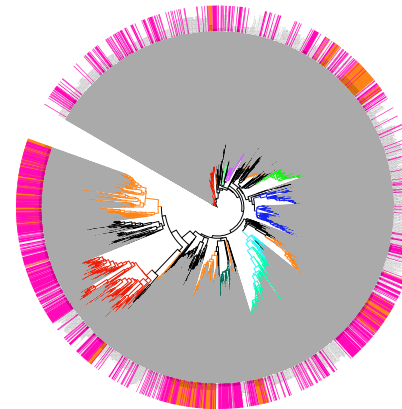


Figure 5: iTag OTU tree (1,843 assigned OTUs). Pink: 828 unclassified OTUs (44.9%); orange text labels: candidate phyla; branch colors denote phyla clades.

## Materials & Methods

DNA from species in the mock community was obtained from the American Type Culture Collection (ATCC). The environmental water sample was collected at 120 m depth from Sakinaw Lake, British Columbia, Canada, in 2010. DNA was isolated using 0.22 µM Sterivex Filters and Cesium Chloride Density Gradient Centrifugation [1]. For universal amplification of the V4 region of the 16S rDNA (iTags), forward primer 515F and reverse primer 806R were used (250 bp insert). Full-length 16S rDNA amplification was performed using primers 27F and 1492R. DNA was amplified using the KAPA SYBR FAST qPCR Kit. Pooled amplicons were purified with AMPure (Agencourt Bioscience, Beverly, MA) and analyzed with a Bioanalyzer 2100 (Agilent) instrument. Amplicons and genomic DNA were sequenced on an Illumina Miseq, HiSeq 2500, and a PacBio RSII sequencing platform, respectively. From the mock community, we obtained 2,116,448 iTag reads, 7,438,720 Illumina shotgun reads, ~10,000 PacBio 16S reads, and 604,529 PacBio Shotgun reads.

16S sequences of the Sakinaw sample were first rarefied to 5,000 reads. OTUs with ≥ 2 reads were used for phylogenetic analysis resulting in 4,407 iTag and 5,000 PacBio sequences. Sequences were initially aligned using the SINA aligner [2]. Phylogeny based on this alignment was reconstructed using fasttree [3].

## Conclusions

- 1) The two closely related *Salmonella* spp. were not resolved by iTag sequences, because dissimilarities occur outside the V4-region
- 2) PacBio 16S sequences do not appear to be as influenced by %GC-content as Illumina sequences
- 3) There are minor differences between datasets from iTags and PacBio 16S in the classifiable OTUs
- 4) iTag sequences may overestimate microbial diversity as 16S variability in the V4-region is not homogeneous across phyla
- 5) Full-length 16S sequences are essential for the expansion of current databases because partial 16S can be more accurately placed when few or no cultured representatives are available

## References

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## Acknowledgement/Contact

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