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## An oligotrophic deep-subsurface community dependent on syntrophy is dominated by sulfur-driven autotrophic denitrifiers

Maggie C. Y. Lau<sup>a,1</sup>, Thomas L. Kieft<sup>b</sup>, Olukayode Kuloyo<sup>c,2</sup>, Borja Linage-Alvarez<sup>c,3</sup>, Esta van Heerden<sup>c</sup>, Melody R. Lindsay<sup>a,4</sup>, Cara Magnabosco<sup>a,5</sup>, Wei Wang<sup>d</sup>, Jessica B. Wiggins<sup>d</sup>, Ling Guo<sup>d</sup>, David H. Perlman<sup>e,6</sup>, Saw Kyin<sup>e</sup>, Henry H. Shwe<sup>e</sup>, Rachel L. Harris<sup>a</sup>, Youmi Oh<sup>f,7</sup>, Min Joo Yi<sup>g</sup>, Roland Purtschert<sup>h</sup>, Greg F. Slater<sup>i</sup>, Shuhei Ono<sup>j</sup>, Siwen Wei<sup>k</sup>, Long Li<sup>k,I</sup>, Barbara Sherwood Lollar<sup>I</sup>, and Tullis C. Onstott<sup>a</sup>

<sup>a</sup>Department of Geosciences, Princeton University, Princeton, NJ 08544; <sup>b</sup>Department of Biology, New Mexico Institute of Mining and Technology, Socorro, NM 87801; <sup>c</sup>Department of Microbial, Biochemical, and Food Biotechnology, University of the Free State, Bloemfontein 9301, South Africa; <sup>d</sup>High Throughput Sequencing and Microarray Facility, Lewis–Sigler Institute for Integrative Genomics, Princeton University, NJ 08544; <sup>e</sup>Proteomics and Mass Spectrometry Core, Department of Molecular Biology, Princeton University, NJ 08544; <sup>f</sup>Atmospheric and Oceanic Sciences, Princeton University, Princeton, NJ 08544; <sup>g</sup>Department of Ecology and Evolutionary Biology, Princeton University, Princeton, NJ 08544; <sup>h</sup>Climate and Environmental Physics, Physics Institute, University of Bern, 3012 Bern, Switzerland; <sup>i</sup>School of Geography and Earth Sciences, McMaster University, Hamilton, ON, Canada L8S 4K1; <sup>j</sup>Department of Earth, Atmospheric, and Planetary Sciences, Massachusetts Institute of Technology, Cambridge, MA 02139; <sup>k</sup>Department of Earth and Atmospheric Sciences, University of Alberta, Edmonton, AB, Canada T6G 2E3; and <sup>i</sup>Department of Earth Sciences, University of Toronto, ON, Canada M5S 3B1

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Subsurface lithoautotrophic microbial ecosystems (SLiMEs) under oligotrophic conditions are typically supported by H<sub>2</sub>. Methanogens and sulfate reducers, and the respective energy processes, are thought to be the dominant players and have been the research foci. Recent investigations showed that, in some deep, fluid-filled fractures in the Witwatersrand Basin, South Africa, methanogens contribute <5% of the total DNA and appear to produce sufficient CH<sub>4</sub> to support the rest of the diverse community. This paradoxical situation reflects our lack of knowledge about the in situ metabolic diversity and the overall ecological trophic structure of SLiMEs. Here, we show the active metabolic processes and interactions in one of these communities by combining metatranscriptomic assemblies, metaproteomic and stable isotopic data, and thermodynamic modeling. Dominating the active community are four autotrophic β-proteobacterial genera that are capable of oxidizing sulfur by denitrification, a process that was previously unnoticed in the deep subsurface. They co-occur with sulfate reducers, anaerobic methane oxidizers, and methanogens, which each comprise <5% of the total community. Syntrophic interactions between these microbial groups remove thermodynamic bottlenecks and enable diverse metabolic reactions to occur under the oligotrophic conditions that dominate in the subsurface. The dominance of sulfur oxidizers is explained by the availability of electron donors and acceptors to these microorganisms and the ability of sulfur-oxidizing denitrifiers to gain energy through concomitant S and H<sub>2</sub> oxidation. We demonstrate that SLiMEs support taxonomically and metabolically diverse microorganisms, which, through developing syntrophic partnerships, overcome thermodynamic barriers imposed by the environmental conditions in the deep subsurface.

active subsurface environment | metabolic interactions | sulfur-driven autotrophic denitrifiers | syntrophy | inverted biomass pyramid

**M** icroorganisms living in deep-subsurface ecosystems acquire energy through chemosynthesis and carbon from organic or inorganic sources. Whereas heterotrophs use dissolved organic carbon (DOC) transported from the surface and/or produced in situ, detrital organic deposits buried along with the sediments, and hydrocarbons migrating into petroleum reservoirs, chemolithoautotrophs fix dissolved inorganic carbon (DIC). In oligotrophic systems, subsurface lithoautotrophic microbial ecosystems (SLiMEs) (1) that are fueled by H<sub>2</sub> support the occurrence of autotrophic methanogens, acetogens, and sulfate reducers (2–5). These environments can host highly diverse communities, consisting mostly of prokaryotes, but also multicellular microeukaryotes and viral particles (6–13). Due to the limitation of available nutrients and energy substrates in the oligotrophic subsurface, it is reasonable to hypothesize that subsurface inhabitants with diverse functional traits cooperate syntrophically to maximize energy yield

#### Significance

Microorganisms are known to live in the deep subsurface, kilometers below the photic zone, but the community-wide metabolic networks and trophic structures (the organization of their energy and nutritional hierarchy) remain poorly understood. We show that an active subsurface lithoautotrophic microbial ecosystem (SLIME) under oligotrophic condition exists. Taxonomically and metabolically diverse microorganisms are supported, with sulfurdriven autotrophic denitrifiers predominating in the community. Denitrification is a highly active process in the deep subsurface that evaded recognition in the past. This study highlights the critical role of metabolic cooperation, via syntrophy between subsurface microbial groups, for the survival of the whole community under the oligotrophic conditions that dominate in the subsurface.

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Data deposition: The single-end Illumina reads of the RNA-seq data have been deposited at the National Center for Biotechnology Information BioProject (accession no. PRJNA308990). The Sanger sequences obtained by RT-PCR cloning have been deposited in the GenBank database (accession nos. KF901390–KF901421 and KF901484–KF901489). The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE partner repository (dataset identifier PXD004634).

<sup>1</sup>To whom correspondence should be addressed. Email: maglau@princeton.edu.

<sup>2</sup>Present address: Energy Bioengineering and Geomicrobiology Group, University of Calgary, Calgary, AB, Canada T2N 1N4.

<sup>3</sup>Present address: Consorcio de Promoción del Ovino, 49630 Villalpando, Castillo-León, Spain.
<sup>4</sup>Present address: Department of Microbiology and Immunology, Montana State Univer-

<sup>5</sup>Present address: Simons Center for Data Analysis, Simons Foundation, New York, NY 10010.

<sup>6</sup>Present address: Department of Chemistry, Princeton University, NJ 08544.

<sup>7</sup>Present address: Department of Earth, Atmospheric, and Planetary Sciences, Purdue University, West Lafayette, IN 47907.

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and growth, as has been demonstrated elsewhere (14–16). How such interspecies metabolic interactions relate to the subsurface trophic structure remains largely unexplored.

Syntrophy refers to metabolic partners being dependent on each other to create better conditions that are mutually beneficial for the metabolic activities observed (14), and critically, "the mutual dependence cannot be overcome by simply adding a cosubstrate or any type of nutrient" (16). Syntrophic microbial consortia are well known to anaerobically degrade organic carbon by cross-feeding on metabolic products such as acetate, formate, and  $H_2$  such that these substances do not accumulate to a toxic level that could suppress the activity of the producers (16). Anaerobic methane oxidizers (ANMEs) and sulfate reducers are the syntrophic partners responsible for anaerobic CH<sub>4</sub> oxidation in shallow, anoxic CH<sub>4</sub>-rich sediments. The details of such metabolic interaction are not fully understood but it is now known to involve production of  $S^0$  by ANMEs as an intermediate (17) and/or nanowires for direct electron transfer (18, 19). Recently, a consortium of Thioploca and anaerobic ammonia oxidizers that uses  $NO_3^-$  and  $NH_4^+$  as the electron-shuttling system was shown to contribute significantly to the loss of organic nitrogen in continental margin sediments at much shallower depths (20). It is, however, yet to be determined whether this partnership is commensal or syntrophic. Regardless, the latter two examples from oceanic subsurface environments validate the idea that symbiosis among microorganisms (via obligate and facultative syntrophy, mutualism, and commensalism) could play a pivotal role in sustaining the microbiome and biogeochemical cycling in the deeper biosphere on the Earth.

Our recent investigations in the Witwatersrand Basin, South Africa, indicated that the H2-driven microbial groups (methanogens, acetogens, and sulfate reducers) are less prevalent in the DNA communities (21) than previously perceived (2, 4, 22). Interestingly, in some cases, methanogens comprising <5% of the total DNA apparently produce sufficient CH<sub>4</sub> to support the rest of the community (23). These results indicate that our understanding of the metabolisms and energy fluxes in SLiMEs is far from complete (24). This study aimed to test the hypotheses that methanogenesis and/or other H2-driven processes are the predominant primary producers in SLiMEs and that methanogenic CH<sub>4</sub> from the rare methanogenic population sustains the entire community. Here, we describe the active community and metabolic pathways in fracture fluid with relatively low DOC (28.8  $\mu$ M) (21, 23). We used metatranscriptomics and metaproteomics to map the metabolic landscape of the active microbial community and to decipher the metabolic network among members. Our results show that this oligotrophic ecosystem runs upon syntrophic cooperation between microbial groups and is dominated by sulfur-oxidizing, autotrophic, denitrifying bacteria.

#### **Results and Discussion**

**Geochemistry Characterization.** The fluid investigated was collected from a fault zone at 1.34-km depth in the Witwatersrand Basin, South Africa. It was warm (38 °C), alkaline (pH 8.6), brackish (total dissolved solids, 3.6 gL<sup>-1</sup>) and hypoxic (pe = -1.4) (21, 23) (*SI Appendix*, Table S1). It had low H<sub>2</sub> (8.9 nM), high CH<sub>4</sub> (1.3 mM) relative to DIC (330  $\mu$ M), and high SO<sub>4</sub><sup>2–</sup> (623  $\mu$ M) relative to HS<sup>-</sup> (14.9  $\mu$ M). Noble gas-derived residence time for the fracture water (3–14 my based on <sup>40</sup>Ar, <sup>134</sup>Xe, and <sup>136</sup>Xe), and radiocarbon ages of 40–80 ky for the DIC in the water indicate mixing of older fracture water sourcing the DIC (12, 25–27) (*SI Appendix*, Table S1).

**Molecular Analyses.** We extracted the community DNA, RNA, and protein in parallel from biomass captured on a 0.1- $\mu$ m-pore size membrane filter. The DNA community was dominated by Proteobacteria, with metabolic potential for methanogenesis, CH<sub>4</sub> oxidation, SO<sub>4</sub><sup>2-</sup> reduction, NO<sub>3</sub><sup>-</sup> reduction, and N<sub>2</sub> fixation (8, 21, 23). This study analyzed the RNA and protein samples using metatranscriptomics and metaproteomics, respectively. High-quality single-end reads, a total of 21,577,391 bp, were generated from the total RNA (*SI Appendix*, Table S2). Protein-encoding genes (PEGs)

predicted from assembled mRNA transcripts were then used to annotate the metaproteome, and 1,983 unique peptides representing 824 protein IDs were identified. As mRNAs and proteins have different response times to environmental changes (28), they provide independent yet complementary snapshots of the active metabolic landscape. Relative abundances of active microorganisms reported here are derived from ribosomal RNA (rRNA) transcripts ( $\%_{rRNA}$ ) and ribosomal protein PEGs ( $\%_{rp}$ ). Because the per-cell abundance of these molecules varies, these values may not be directly equivalent to biomass, but they provide a reasonable approximation.

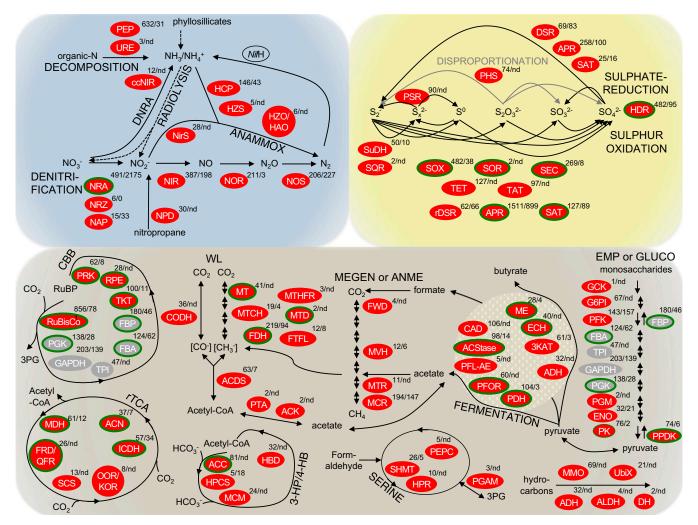
**Taxonomic Diversity.** Proteobacteria  $(85.3\%_{rRNA} \text{ and } 73.6\%_{rp})$  significantly outnumbered 38 other microbial phyla detected in the fracture fluid sample at the time of collection (*SI Appendix*, Fig. S1). Archaea comprised only  $1.9\%_{rRNA}$  and  $<0.1\%_{rp}$ , and eukaryotes were negligible  $(0.03\%_{rRNA})$  (*SI Appendix*, Fig. S1). This taxonomic profile of the active microbial (RNA) community is very similar to that of the total DNA community derived from the same sample (8, 21, 23). The active members will be described in greater detail along with the results of the expressed gene and enzymes for the N, S, and C metabolisms.

**Nitrogen Metabolisms.** The occurrence of canonical denitrification is indicated by detection of a complete suite of PEGs and the encoded enzymes (Fig. 1), and the metabolic intermediate N<sub>2</sub>O (22  $\mu$ M; *SI Appendix*, Table S1). Diverse denitrifiers related to *Sulfuritalea* (0.3%<sub>rRNA</sub> and 20.1%<sub>rp</sub>) and *Thauera* (1.5%<sub>rRNA</sub> and 3.5%<sub>rp</sub>) of Rhodocyclaceae (25.7%<sub>rRNA</sub> and 39.4%<sub>rp</sub>), *Thiobacillus* (3.3%<sub>rRNA</sub> and 2.3%<sub>rp</sub>) and *Sulfuricella* (0.2%<sub>rRNA</sub> and 1.8%<sub>rp</sub>) of Hydrogenophilaceae (4.7%<sub>rRNA</sub> and 5.0%<sub>rp</sub>), Rhodospirillaceae (4.3%<sub>rRNA</sub> and 2.9%<sub>rp</sub>), Ectothiorhodospiraceae (1.7%<sub>rRNA</sub> and 1.5%<sub>rp</sub>), and Bacillaceae (0.3%<sub>rRNA</sub>) were detected.

The discrepancy between the relative abundances of Sulfuritalealike taxa in rRNA transcripts and ribosomal protein PEGs was further investigated. About 70% of the rRNA transcripts cannot be assigned to known β-proteobacterial Rhodocyclaceae genera, whereas 50% of the ribosomal protein PEGs are related to Sulfuritalea (SI Appendix, Fig. S2). Reciprocal best-hit (RBH) BLAST search between the complete PEG transcriptome and 21 published Rhodocyclaceae genomes provides independent support of Sulfuritalea's dominance (SI Appendix, Fig. S2). The RBH BLAST search also indicates that Sulfuritalea- and Thauera-like taxa expressed PEGs involved in canonical denitrification, sulfur (HS<sup>-</sup>, S<sup>0</sup>,  $S_2O_3^{2-}$ ,  $SO_3^{2-}$ ) oxidation, and the Calvin–Benson–Bassham (CBB) cycle (green-outlined in Fig. 1; SI Appendix, Table S3). Together with Thiobacillus- and Sulfuricella-like taxa, sulfur-driven autotrophic denitrifiers (autotrophic microorganisms that couple NO<sub>3</sub><sup>-</sup> reduction with sulfur oxidation) accounted for  $27.8\%_{rp}$  of the active community.

In addition to canonical denitrification, NO<sub>2</sub><sup>-</sup> removal via anaerobic ammonium oxidation (ANAMMOX) and dissimilatory nitrate reduction to ammonia (DNRA) are indicated by the detection of the key enzymes Planctomycetes-related nitrite reductase (NirS) and hydroxylamine oxidoreductase (HAO) for ANAMMOX, and cytochrome c nitrite reductase (ccNIR) for DNRA, respectively. Brocadiaceae capable of ANAMMOX constituted only 0.07% of the rRNA. By RT-PCR cloning, we retrieved nifH gene transcripts of uncultured Proteobacteria in the same fracture fluid (SI Appendix, Table S4), indicating that microbial fixation of  $N_2$  occurred, but likely at levels too low to be detected in the PEG transcriptome. The highly isotopically enriched  $NO_3^-$  ( $\delta^{15}N_{AIR} = 36.3 \pm 0.1\%$ );  $\delta^{18}O_{VSMOW} = 49.2 \pm 0.5\%$ ), along with the relative  $\delta^{15}N$  depletion in N<sub>2</sub> ( $\delta^{15}N_{AIR} = -1\%$ ) observed in this sample (*SI Appendix*, Table S1) are consistent with canonical denitrification as the principal N pathway (Fig. 2) (29). The  $NO_3^-$  may originate from radio-lytic oxidation of  $NH_3/NH_4^+$  in the rock formation pore water (29) and/or from paleometeoric recharge (as for the DIC). The denitrifiers appear to have reduced  $NO_3^-$  to trace levels (0.3  $\mu$ M).

**Sulfur Metabolisms.** For sulfur-driven autotrophic denitrification to take place, *Sulfuritalea*- and *Sulfuricella*-like taxa need the electron donors  $S^0$  and  $S_2O_3^{2-}$  (30, 31), whereas *Thiobacillus*- and



**Fig. 1.** Metabolic pathways expressed in the deep subsurface. Pathways of N, S, and C metabolisms are enclosed in blue, yellow, and brown envelopes, respectively. Black and gray solid lines indicate reactions mediated by enzymes, whereas black dotted lines in the N cycle indicate abiotic reactions. PEG transcripts and the encoded enzymes detected in this study are denoted by ellipses, appended with coverage (mapped read counted normalized to PEG transcript length) and, if detected, the number of peptide spectral matches in metaproteome. Green-outlined enzymes are encoded by PEG transcripts related to *Sulfuritalea* and *Thauera*. Enzymes in gray operate in both autotrophic and heterotrophic C metabolisms, and the PEG transcripts detected in this study were closely related to those of autotrophs and heterotrophs. *NifH* gene, encoding for dinitrogenase reductase subunit H, was detected by RT-PCR cloning (*SI Appendix, SI Materials and Methods,* Table S4). A complete list of proteins detected in the PEG transcriptome and metaproteome is provided in *SI Appendix,* Table S6. ANAMMOX, anaerobic methane oxidation (upward direction); CBB, Calvin–Benson–Bassham cycle or reductive pentose phosphate cycle; DNRA, dissimilatory nitrate reduction to ammonia; EMP, Embden–Meyerhof–Parnas glycolysis (downward direction); GLUCO, gluconeogenesis (upward direction); 3-HP/4-HB, 3-hydroxyporpionate/4-hydroxybutyrate (3-HP/4-HB) cycle; MEGEN, methanogenesis (downward direction); nd, not detected; 3PG, 3-phosphoglycerate; rTCA, reverse tricarboxylic acid cycle; SERINE, formaldehyde assimilation via serine pathway; WL, Wood–Ljundahl or reductive acetyl-CoA pathway.

*Thauera*-like taxa can also use  $HS^-$ .  $SO_4^{2-}$  is known to be generated in the deep terrestrial subsurface by oxidation of sulfide-containing minerals in the host rocks by radiolytically produced oxidants (3, 32). Sulfate reduction mediated by sulfate-reducing bacteria (SRB) is then anticipated to provide the reduced S species for sulfur oxidation. Our results reveal a complete sulfuretum, or co-occurrence of sulfur oxidation and sulfate reduction (Fig. 2); yet three lines of evidence support a dominance of sulfur-oxidizing activity. First, multiple sulfur-oxidizing systems were detected, with the key enzymes being expressed at relatively higher levels in both the metatranscriptome and the metaproteome than those for sulfate reduction (Fig. 1). Second, apr and sat PEGs of sulfur-oxidizing bacteria (SOB) had coverage sixfold and fivefold higher, and the respective proteins APR and SAT of SOB were nine and six times higher, than those belonging to SRB (Fig. 1; SI Appendix, Table S5). Third, the dominance of sulfur-oxidizing activity over sulfate-reducing activity is consistent with the observed  $\delta^{34}$ S-depletion in SO<sub>4</sub><sup>2-</sup> relative to HS<sup>-</sup> ( $\delta^{34}$ S<sub>VCDT</sub> = +4.5% vs. +5.9%) (Fig. 2; SI Appendix, Table S1). In an earlier

study of fracture water from this same mine, the  $\delta^{34}$ S values of SO<sub>4</sub><sup>2–</sup> ranged from +11.1% to +20.6% and for HS<sup>–</sup> from -14.2% to -8.4%, suggesting that sulfate reduction was dominating over sulfur oxidation at that time (33). HS<sup>–</sup> concentrations were also ~100 times greater than that of the present study, although the 16S rRNA gene clone libraries indicated that the SRB were a relatively minor portion of the total bacterial population (33). However, in the present study, the 1.4% depletion in the  $\delta_{34}$ S value SO<sub>4</sub><sup>2–</sup> falls in the range of 1.3% to 4.3% observed in laboratory cultures that couple nitrate reduction and sulfide oxidation (34). S flux through SRB must be much lower than that through SOB, thereby supporting the dominance of sulfur-oxidizing activity. All of these results aligned very well with the fact that the SOB (28.3%<sub>rp</sub>), of which 98% are sulfur-driven autotrophic denitrifiers) comprised a larger component of the active microbial community compared with SRB (3%<sub>rRNA</sub> and 5%<sub>rp</sub>).

**Carbon Metabolisms.** As described earlier, sulfur-driven autotrophic denitrifiers fix  $CO_2$  via the CBB cycle (green-outlined in Fig. 1;

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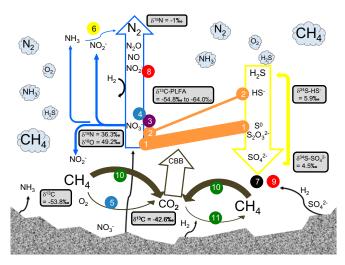


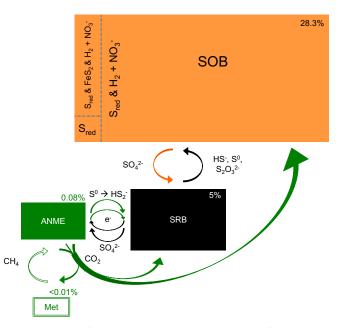
Fig. 2. Metabolic landscape in the deep subsurface. Bubbles represent the gas in the fracture head space, with font size representing the relative abundance of the species. Radiolytic species are originated from the rock. Blue, yellow, and brown arrows, respectively, represent the N, S, and C metabolic pathways detected, with the large arrows representing the principal pathways and the smaller arrows representing the less expressed. CBB stands for Calvin-Benson-Bassham cycle, the dominant CO<sub>2</sub> fixation pathway. Circles are numbered to show various microbial taxa and are colored based on their phylogenetic origins: 1 for Sulfuritalea- and Sulfuricella-like taxa, 2 for Thio*bacillus*- and *Thauera*-like taxa (class  $\beta$ -proteobacteria); 3 for Rhodospirillaceae (class α-proteobacteria); 4 for Ectothiorhodospiraceae, 5 for Methylococcaceae (class γ-proteobacteria); 6 for Brocadiaceae (phylum Planctomycetes); 7 for Desulfobulbaceae and Desulfovibrionaceae (class δ-proteobacteria); 8 for Bacillaceae, 9 for Peptococcaceae including Candidatus Desulforudis (phylum Firmicutes); 10 for ANME, 11 for methanogenic Methanosarcinaceae (phylum Euryarchaeota). Orange bars indicate S-N coupling due to the abundant autotrophic, sulfur-oxidizing, denitrifiers Sulfuritalea, Thauera, Thiobacillus, and Sulfuricella. Isotopic data (SI Appendix, Table S1) are given in rectangles.

SI Appendix, Table S3). In addition to the CBB cycle, multiple  $CO_2$  fixation pathways detected in the metagenome (23) were expressed, namely, reverse tricarboxylic acid cycle (rTCA), 3-hydroxypropionate/4-hydroxybutyrate (3-HP/4-HB) pathway, and Wood-Ljundahl (WL) pathway. The ribulose-1,5-bisphosphate carboxylase/oxygenase (RuBisCo) of the CBB cycle is the most abundant (Fig. 1) and closely related to the abundant  $\alpha$ - and β-Proteobacteria (SI Appendix, Fig. S1). A complete set of the PEGs and encoded enzymes along the methyl branch of the WL pathway was detected (Fig. 1). These are related to those of  $\delta$ -proteobacterial sulfate reducers rather than homoacetogenic bacteria or methanogens. Sulfate reducers may fix CO or  $CO_2$  (autotrophy), or run the WL pathway in reverse direction to oxidize acetate (heterotrophy), or do both (mixotrophy). Based on  $\Delta^{14}C$  and  $\delta^{13}C$ analyses of DIC, CH<sub>4</sub>, DOC, and bacterial phospholipid fatty acids (PLFAs) from this same fracture fluid, Simkus et al. (23) concluded that  $\delta^{13}C_{VPDB}$  values of -54.8% to -64.0% for bacterial PLFAs were due to carbon uptake of DIC (-43%) or of methanogenic  $CH_4$  (-54‰), rather than utilization of the DOC pool. Enzymes involved in heterotrophic pathways, such as Embden-Meyerhof-Parnas glycolysis and gluconeogenesis, and in fermentation occurred at much lower abundances compared with those of autotrophic enzymes (Fig. 1), which is consistent with the isotopic data (Fig. 2).

The low abundance of <sup>14</sup>C in the DIC indicates that some portion of the DIC is derived from paleometeoric recharge (23, 35). The very low  $\delta^{13}$ C values of DIC and their correlation with the  $\delta^{13}$ C values of CH<sub>4</sub> demonstrate that the bulk of the DIC was supplied by oxidation of CH<sub>4</sub> generated by hydrogenotrophic methanogenesis (23). This interpretation is supported by the detection of active methanogens and ANMEs (1.8%<sub>rRNA</sub> and 0.08%<sub>rp</sub>) in the present study (Figs. 2 and 3). PEGs and proteins corresponding to tetrahydromethanopterin *S*-methyltransferases (MTR) and methyl coenzyme M reductases (MCR) were both expressed (Fig. 1). Except for one *mtr* PEG related to methanogens, all others are related to ANME-1 and *Candidatus Methanoperedens nitroreducens*, which have been proposed to be autotrophic (36, 37). PEGs related to methane monooxygenase of Methylococcaceae were also detected, but at very low abundance (Fig. 1). The metabolic gene expression profiles indicate that the majority of the active community used the CBB cycle to derive its carbon from DIC, which had been recycled through the active CH<sub>4</sub>-cycling community (38).

**Microbial Syntrophy.** We constructed a map of C1 carbon flow among the various chemolithoautotrophic groups, highlighting three pairs of electron-shuttling systems (Fig. 3). One is between ANME and SRB. ANME-2 produce intracellular S<sup>0</sup> from SO<sub>4</sub><sup>2-</sup> by an unknown pathway (17). The authors proposed that the produced S<sup>0</sup> then reacts with HS<sup>-</sup> outside the cells to form polysulfides, which are taken up by the syntrophic SRB and are disproportionated to SO<sub>4</sub><sup>2-</sup> and HS<sup>-</sup>. The resultant SO<sub>4</sub><sup>2-</sup> may be reused by ANME-2. More recent studies showed that nanowires are synthesized to enable interspecies electron transfer between ANME-1 and ANME-2 and their associated SRB (18, 19). The other two pairs are between ANME and methanogens, and between SOB and SRB.

Methanogenesis (reactions #31–33) and hydrogenotrophic sulfate reduction (reaction #28) clearly represent the thermodynamic bottlenecks in the studied SLiME. On the contrary, the antagonistic reactions  $CH_4$  and S oxidation, respectively, yield two orders of magnitude more power per mole of reactants (*SI Appendix*, Fig. S3). We propose that the most thermodynamically disadvantaged microorganisms, that is, methanogens and SRB in this case, have



**Fig. 3.** C1 carbon flow map in the oligotrophic deep subsurface. Microbial groups are represented by rectangles. Rectangle sizes are not scaled to their relative abundances derived from ribosomal proteins in the PEG transcriptome, which are indicated to the top right corners. The color scheme for sulfur oxidizers (SOB), sulfate reducers (SRB), anaerobic methane oxidizers (ANME), and methanogens (Met) is the same as in Fig. 2. Arrows indicate the direction of metabolic transfers between microbial groups and do not imply that direct physical contact is involved. Three electron-shuttling systems occur between the microbial groups, which resulted in three pairs of syntrophic partners. The C in CO<sub>2</sub> is cycled through the syntrophic pair of methanogens and ANME. The CO<sub>2</sub> from anaerobic methane oxidation is being incorporated into the more abundant SRB and SOB. The metabolic versatility of denitrifying SOB to use various electron donors enables them to outnumber their syntrophic partner SRB and become the most dominant chemolithoautotroph in the studied SLIME.

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the need to develop a metabolically closely coupled relationship with syntrophic partners. As a result of such partnerships, the thermodynamically difficult reactions, namely, methanogenesis and hydrogenotrophic sulfate reduction, by methanogens and SRB, respectively, can be pulled forward upon the demand of ANME and SOB, respectively. As a result, the fitness of methanogens and SRB should increase. Recycling of metabolic products between syntrophic partners should enable them to maintain their metabolic activities, further resulting in increasing population size over time. Population growth should further strengthen the metabolic exchanges, especially when syntrophic partners are in close physical proximity and/or directly connected (18, 19, 39). This positive relationship between fitness and population size is referred as a positive Allee effect (40, 41). Microbial syntrophy is potentially an influential attribute to a subsurface ecosystem's stability and community dynamics, which has not been previously recognized. Here, we discuss the probable syntrophic interactions in each of the pairs of microbial groups that recycle  $CH_4$  and S.

The millimolar level of methanogenic  $CH_4$  is ample to support growth of ANME and to permit its metabolic independence of ANME from methanogens. However, ANMEs do not thrive but remain as a minority population in the total RNA (*SI Appendix*, Fig. S1), even though  $CH_4$  oxidation by  $NO_3^-$  and  $SO_4^{2-}$  are among the most thermodynamically highly favored reactions (*SI Appendix*, Fig. S3). Between the two electron acceptors  $NO_3^$ and  $SO_4^{2-}$  that are being used by ANMEs,  $NO_3^-$  appears to be limiting, whereas  $SO_4^{2-}$  is more readily available. To explain the low abundance of ANME, we consider that ANME is syntrophically coupled with methanogens. Although the demand of ANME for  $CH_4$  drives methanogenesis forward and thus maintains the methanogenic population, the ANME's population is indirectly controlled by methanogenesis.

It is less straightforward to deduce the syntrophic partnership between SOB and SRB because reduced S species and SO42- may come from nonlocal and/or nonmicrobially mediated processes; consequently, SOB and SRB could live independently. Thiobacillus denitrificans is the only species known to obtain S directly from pyrite nanoparticles, but not from large crystals of pyrite (42) such as those found in the Witwatersrand Supergroup (43). The relatively small population of Thiobacillus (3.3%<sub>rp</sub>) is more likely to obtain its S from nanoparticles of pyrite generated by SRB as has been shown to be occurring in anaerobic biofilms of South Africa boreholes that contain both SRB and SOB (44, 45). If the reduced S species came from other mechanisms, for example, as intermediates produced during radiolytic oxidation of pyrite, or from other unidentified sources, then these alternative inputs would have to occur at a rate low enough that no excess HS<sup>-</sup> concentration is observed, as evidenced by the low level of measured HS<sup>-</sup> (SI *Appendix*, Table S1). The capacity for SOB to couple with SRB therefore has an obvious ecophysiological advantage over foraging the reduced S species from the environment. In exchange, proactive removal of HS<sup>-</sup> products from sulfate reduction pulls the reaction in the forward direction.

 $\rm HS^-$  produced by SRB may react with Fe(II) ions to form nanoparticle FeS or pyrite and these could either be oxidized by *Thiobacillus*, as discussed, or be radiolytically oxidized to SO<sub>4</sub><sup>2-</sup>, suggesting that SRB could live independently from SOB in the latter case. S oxidation catalyzed by SOB is, however, more efficient than the chemical process. Hence, the dependence of SRB on SOB for the removal of their HS<sup>-</sup> products and the regeneration of SO<sub>4</sub><sup>2-</sup> should enhance the metabolic conditions for SRB.

Interestingly, the C1 carbon flow map also showed that one member of the syntrophic partners is more abundant than the other (SOB > SRB; SRB > ANME; ANME > methanogens) (Fig. 3). As a matter of fact, the C in CO<sub>2</sub> that has gone through the CO<sub>2</sub>-CH<sub>4</sub> cycle by the syntrophic pair of methanogens and ANMEs ("trophic 1") is being incorporated into the more abundant SRB and SOB ("trophic 2"), which emerged as an "inverted biomass pyramid" that is composed of exclusively autotrophs. In a typical food chain (e.g., a large fish feeds on a medium fish, which in turn feeds on a small fish), carbon and energy are derived from the same organic compounds, with less than 10% of the energy being used to generate new biomass and the remaining being dissipated as heat. The consumers are therefore not expected to outnumber the producers or the prey, except during the occurrence of inverted biomass pyramids in oligotrophic lakes due to the fast turnover rate of primary producers, allochthonous DOC inputs, or the presence of refugia (40, 46, 47). On the contrary, as chemoautotrophs derive carbon and energy from different substrates, the CO<sub>2</sub> leaked from the CH<sub>4</sub> cycle becomes available for the greater productivity of SRB and SOB, whereby the carbon fixation process has no direct chemical coupling with the redox reactions. Due to the decoupling of energy and carbon acquisition, differential population sizes between the syntrophic partners and the apparent inverted biomass pyramid would be determined by the relative difference in the amounts of electron donors and acceptors available to various microbial groups. To test this hypothesis, we examined the bioenergetics of SOB and SRB based on the aqueous chemistry of the sample. Population dynamics of SOB and SRB were modeled over a 35-ky period to reproduce the observed geochemistry. All models were constrained by measured growth yields and kinetics of cultivated bacterial strains (Materials and Methods).

The model results showed that the autotrophic SRB are consistently less abundant than the SOB (SI Appendix, Fig. S4), which is consistent with the metatranscriptomic and metaproteomic results discussed above. Thermodynamic calculations also indicated that the sulfur-oxidation/nitrate-respiration coupling is energetically more productive than hydrogenotrophic sulfate reduction (reaction #28 in SI Appendix, Fig. S3). Decreasing the NO<sub>3</sub><sup>-</sup> flux reduces the cell concentration of denitrifying SOB to a lower level (SI Appendix, Fig. S4 A and B). In hydrothermal vents, thermodynamic modeling suggested that H<sub>2</sub> and S oxidation contributed 20% and 80%, respectively, of the energy budget in the ubiquitously distributed SOB SUP05 (48). Because SOB Sulfuritalea hydrogenivorans has been demonstrated to oxidize H<sub>2</sub> (30), evidence of SOB expressing hydrogenase was sought. Among the hydrogenase-encoding transcripts detected, about 47% are related to Sulfuritalea hydrogenivorans. Metabolic versatility could thus contribute to the dominance of SOB in the studied system.

The addition of H<sub>2</sub> oxidation reactions to the thermodynamic models of SOB and SRB, however, caused the SRB population to decline (SI Appendix, Fig. S5), likely due to competition for H<sub>2</sub>. This prediction implies that the SRB could have been outcompeted and eventually eliminated from the community, which did not happen, as indicated by the detection of SRB and their expression of sulfatereducing genes and enzymes. Although the underlying mechanism that has prevented SRB from elimination by  $H_2$  competition is not clear at this moment; possible explanations are discussed here. As some portions of hydrogenases and sulfur-oxidizing enzymes were coexpressed within SOB denitrifiers, their intracellular regulatory systems would control in part the amount and rate of H<sub>2</sub> being taken from the environment. Recently, the aerobic SOB Thiomicrospira sp. strain SP-41 isolated from low-temperature hydrothermal fluids showed that co-oxidation of millimolar  $S_2O_3^{2-}$  and micromolar  $H_2$ yielded 10 times more cells than the micromolar H<sub>2</sub>-only experiment did, although the H<sub>2</sub> consumption rate was four times lower in the  $S_2O_3^{2-}/H_2$  experiment (49). However, no empirical data on the relative contribution of  $H_2$  and S oxidation to the energy budget in SOB denitrifiers are available to constrain the model, which currently treated H<sub>2</sub> and S oxidation coupled to NO<sub>3</sub><sup>-</sup> reduction as two independent reactions. As the H<sub>2</sub> consumption rates by aerobic SOB vary under different conditions, the idea of  $H_2$  uptake by SOB denitrifiers being a negative feedback in this syntrophic relationship is plausible but it needs to be tested. Another possibility is that H<sub>2</sub>-utilizing microorganisms may be spatially separated (on a notyet-known scale) to reduce the competition, which then suggests that the H<sub>2</sub>-oxidizing SOB individuals may be physically distant from SRB. Additional experiments will be required to resolve the factors influencing syntrophy and competition (or the "love-andhate relationship") between these SOB and SRB.

Under the oligotrophic conditions that SLiMEs occur, their community structure will likely change in response to changes in

nutrient availability and environmental conditions. Consequently, the relative abundance of the syntrophic partners may shift and the apparent inverted biomass pyramid may become upright. The spatial and temporal scales over which syntrophic SLiMEs migrate and evolve require further investigation because these two processes ultimately control the distribution of SLiMEs in the deep subsurface.

#### **Concluding Remark**

The approach described in this study provides a comprehensive portrait of the active metabolic landscape of a SLiME enabled by syntrophic metabolic interactions. The fluxes of energy sources and the capability of using multiple electron donors explain the occurrence of an apparent inverted biomass pyramid of chemolithoautotrophs at the deep subsurface. Unlike previously described deep subsurface ecosystems, H2-driven autotrophic processes (sulfate reduction, methanogenesis, and subsequent anaerobic CH4 oxidation) are not the dominant metabolisms but instead support the predominant sulfur-driven denitrification. The metabolic capability of the predominant sulfur-driven autotrophic denitrifiers drives the links between the N, S, and C cycles. Previous studies have reported the high energetic potential of S-N reactions in other deep continental sites (50), and expression of mRNA coding for nitrate reductase in marine subseafloor sediment cores where  $NO_3^-$  was not detectable (51), indicating that the role of nitrate reduction and/or denitrification in the deep subsurface has been overlooked. Active subsurface metabolic landscapes that intertwine H2-driven processes, S-N coupling, and dissimilatory NO3dependent reactions may be more prevalent in both continental and marine subsurface systems than previously thought. This study expands the range of metabolic landscapes, which should be considered when exploring the potential of extinct and extant life elsewhere in the solar system on terrestrial planets and moons.

### **Materials and Methods**

**Microbial Biomass Collection.** The RNA and protein samples used in this study were coextracted with DNA from the filter, BE326FW270712 Bh2. The detailed description of the study site (BE326 BH2), sample collection, and extraction protocol of this sample has been published in Lau et al. (21) and Magnabosco et al. (8). Briefly, fracture fluid at 1.34 km below land surface was filtered onsite at Beatrix gold mine shaft no. 3, level 26, which is situated at southwest of the 2.9-Ga Witwatersrand Basin (quartzite and shale), using a sterile stainless-steel manifold that was installed onto the stainless-steel borehole casing. Approximately 86,400 L of water was filtered over 15 d, at an initial water flow rate set at 4 L·min<sup>-1</sup>. Biomass captured on the preautoclaved Memtrex NY filter (MNY-91-1-AAS; pore size of 0.1  $\mu$ m; General Electric) was preserved in RNA-preservation solution [20 mM EDTA, 0.3 M sodium citrate, and 4.3 M ammonium sulfate; pH adjusted to 5.2 using concentrated H<sub>2</sub>SO<sub>4</sub> (21)] and stored at -20 °C until extraction.

**RNA and Protein Extraction.** Total RNA and protein, together with total DNA, were extracted using 2× CTAB lysis buffer and phenol/chloroform (pH 6.5–6.9). Total RNA was resuspended in 1× TE-buffer (Tris-EDTA, pH 8) and stored in 1.5-mL Eppendorf tubes at -20 °C (21). To reduce RNA degradation during the extraction process, all extraction tubes were kept on ice between steps. An aliquot of the nucleic acid sample was treated with DNase I (catalog #AMPD1; Sigma-Aldrich) following the manufacturer's instructions, which included a 15-min incubation at room temperature and an inactivation step at 70 °C for 10 min. PCR amplification of the treated RNA yielded no PCR products after 35 cycles, indicating the sample was DNA-free.

Total protein was purified from the organic fraction by standard methanol/ acetone purification. In brief, debris at the interface layer was removed before adding five volumes of chilled methanol and ammonium acetate (100 mM final concentration). The mixture was incubated overnight at -20 °C. Protein was pelleted at 17,000 × g for 20 min with supernatant discarded afterward. Protein pellets were washed with chilled HPLC-grade methanol and collected by centrifugation at 17,000 × g for 10 min. Methanol was discarded. The wash step finished with two additional rounds of HPLC-grade acetone. The protein pellets were air-dried for 5–10 min and stored in 1.5-mL Eppendorf tubes at -20 °C.

**Directional RNA-Sequencing.** Before sequencing, the total RNA sample was analyzed on the Agilent 2100 BioAnalyzer system using RNA 6000 Nano kit. The size distribution plot showed that the sample quality was good for RNA sequencing for the following reasons: fragments as long as ~3,000 bp (the size of intact large subunit of rRNA gene) were present, fragment intensity peaked at

size of ~750 bp, and a visible, discrete peak at ~1,500 bp, which is indicative of intact small subunit of rRNA genes. The high-quality RNA was treated using RNase III (0.5 mM final concentration) and resulted in a majority of 500-bp-long fragments. The RNA products from the controlled fragmentation step were used to prepare the strand-specific metatranscriptomic library, following the manufacturer's instruction of Apollo 324 PrepX mRNA library protocol (IntegenX), which is based on directional RNA adaptor ligation. Library concentration was quantified on Agilent 2100 BioAnalyzer DNA HS chip using Qubit DNA HS assay (Life Technologies). The library of this sample was pooled in equal molar ratio with three others. Absolute quantitative PCR assay using SYBR FAST ABI Prism QPCR Mast Mix (Kapa Bio Systems) was performed to confirm amplification efficiency and to determine the library loading concentration for sequencing. Sequencing of 141-nt single-end reads was performed on one lane of Illumina 2500 HiSeq platform with Illumina's Truseq Rapid SBS chemistry. This protocol generated sequences that are in the same orientation as the actual transcripts.

**Quality Control of RNA-Seq Data.** A total of 29,980,240 single-end reads were generated from total RNA. The fastq data were filtered for high-quality reads using the tools on https://galaxy.princeton.edu. The quality control (QC) was run in the following order: (*i*) removed reads that contain 90% of bases with Phred quality score (Q score) lower than 30 (i.e., error probability of base calling, 0.001); (*ii*) screened for reads that matched the first 30 bp of the 3'-end adapter sequence (5'-AGATCGGAAGAGCACACGTCTGAACTCCAG-3') anywhere along the read length, with search criteria set to maximum error rate of 0.1, match times of 1, minimum overlap length of 20, allow "Ns" in the read over aligned region as matches, then clipped off the portion following the adapter sequence; (*iii*) clip from the 3'-end of the reads that contained Ns and that were shorter than 50 nt. The QC-run resulted in 21,577,391 reads (average read length of 123 ± 21 nt) that had an average Q score higher than 30 at each nucleotide position.

**De Novo Metatranscriptome Assembly.** The high-quality RNA reads were organized into two subsets, protein-coding RNA (cRNA) sequences and noncoding RNA (ncRNA) sequences. First, all high-quality RNA reads were searched against four databases using USEARCH (52). The four databases (DBs) were transfer RNA DB (53, 54) (872,667 sequences), 55 rRNA DB (55) (last updated in September 2005; 1,379 sequences), small and large rRNA DBs (56) (version 119.1; 4,346,329 sequences in SSUParc\_tax\_silva.fasta.gz and 446,998 sequences in LSUParc\_tax\_silva.fasta.gz). Then, RNA reads were assigned into the ncRNA subset when they shared at least 80% of identity in global alignment with any of references in the four DBs, regardless of the orientation. The options used were "-usearch\_global," "-uid 0.8," "-strand both," and "-threads" for multithreading. The remaining RNA reads were assigned into the cRNA subset. RNA reads were parsed into cRNA and ncRNA subsets, containing 1,498,563 (7%) and 20,078,828 (93%) reads, respectively, by a Python script.

The cRNA and ncRNA subsets were assembled separately using de Bruijn graph-based de novo transcriptomic assemblers. The "strand-specific" option was indicated in the execution commands. Transcript contigs in the final assemblies have minimum length of 200 nt. The cRNA subset was assembled using Trinity (57), version r20131110, with the default settings, whereas the ncRNA subset was assembled using Trans-ABySS (58) (version 1.5.2). To run Trans-ABySS, contigs were first constructed from 61 to 101 *k*-mers, with an incremental step of 4 mers, as separate assemblies using ABySS (event) 1.5.2) (59). These assemblies were then merged by Trans-ABySS.

Annotation of Transcript Contigs. Transcript contigs were clustered using the CD-HIT package, version 4.6.4 (60). The mRNA transcript contigs generated from the cRNA assembly were first subjected to gene prediction. Prodigal, version 2.6.1 (61), was used to identify open reading frames using the option "-p" for metagenome and translation table 11. Because the orientation of our RNA-seq reads was known and all of the transcript contigs ran in the sense direction, any predictions made for the antisense orientation were discarded. A Python script was used to extract the amino acid sequences translated from the sense strands. The protein-encoding genes (PEGs) generated from the mRNA transcript contigs were clustered using the CD-HIT algorithm. Peptides were clustered at 90% of identity (word size, "-n" = 5) in local alignment ("-G" = 0), using a slow mode ("-g'' = 1) such that the query sequence would be clustered into the most similar cluster that meet the threshold of 80% of the shorter sequence was aligned ("-aS'' = 0.8). The longest sequence in each cluster was searched against the National Center for Biotechnology Information (NCBI) nonredundant protein (nr) database for the best ten hits using BLASTp. Using a Python script, the 10 hits were first evaluated based on an alignment of >50% of the query sequence, an e-value <1e-5, and a bit score >50, and then the query sequence was assigned with the consensus protein identity by majority rule based on the description of each NCBI entry. Representative sequences that resulted in no and low-confident BLASTp hits, and all mRNA transcript contigs in the represented clusters, were omitted from further analysis. Phylogenetic origins of these PEG transcripts were inferred from the BLASTp hits that passed the quality thresholds as a means to validate that the microorganisms expressing the metabolic functions generally matched with what would be expected from the PEG transcriptome of ribosomal proteins and the rRNA transcriptome. However, expression levels of rRNA and ribosomal protein transcripts were the preferred choice for showing taxonomic abundances and were presented in the paper.

Transcript contigs of ncRNA, primarily rRNA genes, were clustered using the CD-HIT-EST algorithm at an identity cutoff level of 95% (word size, "-n" = 10). The longest sequence in each cluster was searched against the rRNA database that comprised of SILVA SSU and LSU sequences (version 119) for the best 10 hits using BLASTn. Using a Python script, the 10 hits were first evaluated based on an alignment of >50% of the query sequence, an e-value <1e-5, and a bit score >50, and then the query sequence was assigned with the consensus rRNA identity by majority rule, and taxonomic rankings were assigned by the lowest common ancestor (LCA) principle (threshold = 80%). The same rRNA database was used to identify chimeric rRNA gene sequences using UCHIME (62). The rRNA transcript contigs in clusters that were represented by a chimeric sequence were omitted from further analysis. Also, representative sequences that resulted in no and low-confident BLASTn hits, and all rRNA transcript contigs in the represented clusters, were omitted from further analysis.

Abundance of Transcript Contigs. The cRNA and ncRNA datasets were mapped to the cRNA and ncRNA assemblies, respectively using Bowtie 2, version 2.2.5 (63), options "-end-to-end" for global alignment, "-norc" for known strand specificity, and "-very-sensitive" mode for higher accuracy. Coverage was calculated for each contig by normalizing the number of reads mapped to the contig to its length:

#### Number of mapped reads × Average read length (nt) Contig length (nt)

Abundance of each PEG cluster and each consensus protein was computed by summing the coverage of constituent mRNA transcript contigs. Relative abundance was calculated with respect to the total coverage of mRNA transcript contigs that met the quality criteria. For PEG clusters identified as ribosomal proteins, the taxonomic classifications of the best BLASTp hit were assigned to the cluster as one of the proxies to describe the taxonomic diversity in the studied sample. Similar to the PEG transcriptome, abundance of each rRNA cluster was computed by summing the coverage of constituent rRNA transcript contigs. Relative abundance was calculated with respect to the total coverage of rRNA transcript contigs.

Relative Abundance within Rhodocyclaceae. Because the rRNA transcriptome and the mRNA transcriptome of ribosomal proteins showed different genera composition structure within the most dominant  $\beta$ -proteobacterial family Rhodocyclaceae, a reciprocal best-hit BLAST search was performed using the representative PEGs of the CD-HIT clusters to provide an additional, independent view. Reciprocal best-hits BLAST approach is a more restrictive annotation method commonly used in comparative genomic analyses. As of November 29, 2015, 21 genomes of Rhodocyclaceae were published on NCBI and the PEG sequences were downloaded. The PEGs in our PEG transcriptome and the Rhocyclaceae PEGs were compiled separately into two searchable databases using the "makeblastdb" tool in the ncbi-blast-2.2.29+ package (64). The representative PEG sequences and Rhocyclaceae amino acid sequences were then searched reciprocally to obtain the best BLASTp hit using the option "-max\_target\_seqs 1." The best hits with an e-value <1e-5 and a bit score >50 were considered valid. The representative PEG sequences that formed pairs of best hits with Rhodocyclaceae genome PEGs in both searches were considered to be Rhodocyclaceae and were assigned with a functional and a taxonomic identity. Relative abundance of Rhodocyclaceae PEGs identified in our PEG transcriptome was calculated as mentioned above.

UltraHigh-Performance Liquid Chromatography–Tandem Mass Spectrometry Analysis. Total protein pellet, extracted as mentioned above, was dissolved in hot 7 M urea/2 M thiourea/100 mM Tris solution (pH 8.0), which was subjected to thiol reduction alkylation using DTT and iodoacetamide, followed by in-solution trypsin proteolysis using the FASP procedure (65). The digested peptides were fractionated into 10 fractions by strong cation exchange chromatography using a Dionex Ultimate NanoLC capillary HPLC system (Dionex) using a gradient from a 75%/25% (vol/vol) mix of buffers A:B to 100% buffer B (buffer A: 7 mM KH<sub>2</sub>PO<sub>4</sub>, pH 2.65, 30% (vol/vol) acetonitrile; buffer B: 7 mM KH<sub>2</sub>PO<sub>4</sub>, 350 mM KCl, pH 2.65, 30% (vol/vol) acetonitrile). Each of these fractions was analyzed by high-resolution nano-ultrahigh-performance liquid chromatography (UPLC)tandem mass spectrometry (MS/MS) analysis on an accurate-mass linear trap quadropole (LTQ) OrbiTrap Elite platform (Thermo Fisher Scientific), outfitted with an Easy nLC 1000 UPLC system (Thermo Fisher Scientific) and a Flex ion source (Thermo Fisher Scientific). Separations were performed using a trapping capillary column (150  $\mu m \times$  ~40 mm, packed with 3  $\mu m$ , 100 Å Magic AQ C18 resin; Michrom) at a flow rate of 4  $\mu$ L·min<sup>-1</sup> for 4 min, followed by an analytical capillary column (75  $\mu$ m  $\times$  ~50 cm, packed with 3- $\mu$ m, 100-Å Magic AQ C18 resin; Michrom) under a linear gradient of A and B solutions (solution A: 3% acetonitrile/0.1% formic acid (vol/vol); solution B: 97% acetonitrile/0.1% formic acid) from 5-35% (vol/vol) B over 180 min at a flow rate of 300 nL·min<sup>-1</sup> Nanospray was achieved using commercial sprayer tips (New Objective) at a voltage of 2.4 kV, with the Elite heated capillary at 275 °C. Full-scan (m/z 335-1,800) positive-ion mass spectra were acquired in the LTQ Orbitrap at a resolution setting of 120,000. MS/MS spectra were simultaneously acquired using collision-induced dissociation method (CID) in the LTQ OrbiTrap for the top 20 most abundant multiply charged species in the full-scan spectrum having signal intensities of >1000 NL. Lock mass was used, maintaining calibration to 2-3 ppm of accurate mass. All samples were analyzed in technical duplicates.

**Protein Identification from UPLC-MS/MS Data.** MS/MS data were analyzed in aggregate using the SEQUEST HT search engine in ProteomeDiscoverer, version 1.4 (Thermo Fisher Scientific), to search against a sample-specific metaproteome database (66), which was created by compiling the in silico translation of the PEG sequences. Search parameters included trypsin digestion with up to one missed cleavage, methionine oxidation, and cysteine carbamidomethylation. A peptide-level false-discovery rate of 5% was achieved by using the Percolator node in ProteomeDiscoverer, which uses the frequency of matching against a decoy database as a rigorous model of the probability of error in the forward matches at given score thresholds. Numbers of peptide-spectral match (PSM) were used as a surrogate measure of protein abundance.

A PEG was considered positively validated as an expressed protein if one of the following criteria were met: (*i*) the PEG was identified by matches to two unique peptides in replicated UPLC-MS/MS runs; (*ii*) if it was identified only in one run, but at least two unique peptides in the PEG were matched; or (*iii*) if it was identified only in one run and by a single unique peptide, but at least five PSMs were assigned to the PEG.

**Geochemical Sample Collection and Analyses.** Procedures for the collection and preservation of dissolved gas and aqueous species of the fracture fluid followed established protocols for underground sampling. Filtered water samples for anion and cation measurements were collected following the methods described in Moser et al. (67). Fracture water was filtered through Whatman polycap 36 TC filter (which was later used for RT-PCR cloning; *SI Appendix, SI Materials and Methods*) into 50-mL Nalgene bottles. Dissolved cation samples were preserved with 200  $\mu$ L of concentrated HNO<sub>3</sub>. A gas stripper was connected to the manifold for gas sampling. Dissolved gases were then transferred into prevacuated 160-mL vials using a 50-mL gas-tight syringe following the procedure described in Ward et al. (68). Noble gas samples were collected according to Lippmann et al. (25), the 20-mL copper tube was flushed with sample water, and while water was flowing, the copper tube was sealed by crimping it with stainless-steel damps on the effluent end and then the influent end.

For sulfur isotopic analyses, fracture fluid was filtered through a 0.2- $\mu$ m filter paper and collected in a 1-L Nalgene bottle. HS<sup>-</sup> in the water was fixed as CdS by preadded excess amount of CdCl<sub>2</sub> in the sample bottle. The water sample was then stored and shipped to the laboratory while cold and stored cold for the following further processing. HS<sup>-</sup> was extracted from the CdS residues collected after filtration. SO<sub>4</sub><sup>2-</sup> was extracted subsequently by adding an excess amount of BaCl<sub>2</sub> into the filtered water followed by filtration of BaSO<sub>4</sub> precipitates. Both CdS and BaSO<sub>4</sub> were converted into Ag<sub>2</sub>S, which was then dried and put into a nickel bomb to react with F<sub>2</sub>. The SF<sub>6</sub> product was finally released from the nickel bomb, purified, and sent to an isotope-ratio mass spectrometer for sulfur isotope analysis. All data are reported relative to the Vienna Cañon Diablo troilite (VCDT) standard. Analytical precision for  $\delta^{34}$ S is 0.2‰ (2c).

For stable isotopic analysis of N<sub>2</sub>, gas samples collected in July 2011 were first characterized by a mass spectrometer coupled with gas chromatography for concentrations of all major gas components (hydrocarbons, CO<sub>2</sub>, noble gases, H<sub>2</sub>, O<sub>2</sub>, and N<sub>2</sub>). Only the samples with little or no air contamination were used for subsequent N isotope analysis. The gas samples were injected into a gas chromatographic to separate then carried in a helium continuous flow stream to an isotope ratio mass spectrometer (Thermo Finnigan DeltaPlus) for N isotope masurements. The  $\delta^{15}$ N values were reported relative to the Air standard, and analytical precision was 0.2‰ (2 $\sigma$ ).

For stable isotopic analysis of NO $_3^-$ , fracture fluid was filtered through a 0.2-µm filter paper and collected in a 100-mL Nalgene bottle that was previously

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rinsed with 10% (vol/vol) HCl and MilliQ water. The water sample was kept in a cooler of reusable ice packs immediately upon reaching the surface and during transport, and stored at -20 °C until processing. The  $\delta^{15}N$  and  $\delta^{18}O$  of  $NO_3^{-1}$ were measured by the "denitrifier method" (69, 70), wherein a denitrifying bacterial strain lacking nitrous-oxide reductase quantitatively converts sample NO3<sup>-</sup> and NO2<sup>-</sup> to N2O. The isotopic composition of N2O was measured by GC-IRMS using a Thermo MAT253 mass spectrometer (Thermo Finnigan DeltaPlus) and a purpose-built on-line N<sub>2</sub>O extraction and purification system. The international reference materials, IAEA-N3 and USGS-34, were used for calibration to the air N<sub>2</sub> and Vienna standard mean ocean water (VSMOW) scales. An in-house N2O standard was run in parallel to monitor mass spectrometry. Analytical precision for the system used has been characterized as  $\leq 0.1\%$  for  $\delta^{15}N$ and  $\leq$ 0.2‰ for  $\delta^{18}$ O (2 $\sigma$ ) for the NO<sub>3</sub><sup>-</sup> concentration analyzed here. Because NO<sub>2</sub><sup>-</sup> is included in the isotopic analysis (70), before isotopic analysis, NO<sub>2</sub><sup>-</sup> was removed by a sulfamic acid protocol described in Granger and Sigman (71). Measurements were made in three technical replicates. Due to an unidentified problem of N<sub>2</sub>O conversion in the 2012 sample, isotopic values of NO<sub>2</sub><sup>-</sup>-removed sample collected in 2011 were reported.

The concentrations of the atmospheric noble gas isotopes (72) (<sup>36</sup>Ar, <sup>84</sup>Kr, <sup>86</sup>Kr, and <sup>129</sup>Xe) are a fraction of those for groundwater in equilibrium with the atmosphere at the mean annual temperature for central South Africa. This indicates that the fracture water has lost some of its dissolved gas, presumably to the head space of the fractures during dewatering of the fractures by the mining operations. We used the diffusion model of Lippmann et al. (25) and the concentrations of <sup>36</sup>Ar, <sup>84</sup>Kr, <sup>86</sup>Kr, and <sup>129</sup>Xe to correct the concentrations of all of the noble gases as well as the concentrations of dissolved gase, H<sub>2</sub>, O<sub>2</sub>, N<sub>2</sub>, N<sub>2</sub>O, CH<sub>4</sub>, CO, NH<sub>3</sub>, and H<sub>2</sub>S. The diffusion coefficient of N<sub>2</sub>O the experimental data of Tamimi et al. (74) was used.

**Calculation of Subsurface Residence Times.** The subsurface residence times for the bulk water were calculated from the diffusion-corrected concentrations of <sup>40</sup>Ar, <sup>134</sup>Xe, and <sup>136</sup>Xe [determined by Purtschert et al. (72)] using the flux model equations and parameters of Lippmann et al. (25). The age estimates range from 3 to 14 my, consistent with previous analyses of subsurface fracture water reported by Lippmann et al. (25).

**Calculation of Free Energy Fluxes.** Steady-state free energy fluxes of 37 energyyielding redox reactions for autotrophy, heterotrophy, methanotrophy, and methanogenesis were estimated as described in Onstott (75) and Magnabosco et al. (4). The Gibbs free energy of each reaction was calculated using the measured cation, anion, and dissolved gas concentrations (*SI Appendix*, Table S1) and The Geochemist's Workbench (GWB), version 8.0 (76) (Rockware). The free energy flux was calculated using the following equation from Onstott (75):

Free Energy Flux 
$$(kJ \cdot cell^{-1} \cdot s^{-1}) = 4\pi r D C \Delta G$$
, [1]

where *r* is the average radius of a cell (in centimeters) and assumed to be  $7.5 \times 10^{-5}$  cm, *D* is the diffusion constant (in square centimeters per second) of the limiting reactant corrected for the in situ temperature, *C* is the concentration of the limiting reactant (in moles per cubic centimeter), and  $\Delta G$  is the in situ Gibbs free energy per mole of the limiting reactant (in kilojoules per mole).

This expression assumes that the measured concentrations represent a steady-state dynamic equilibrium of a planktonic microorganism.

For microbial redox reactions that involve sessile microorganisms that are bound to a mineral surface and are using a mineral phase [for example, FeS<sub>2</sub>, Fe(OH)<sub>3</sub>, and pyrolusite] as electron acceptor, the effective diffusion constant ( $D_{eff}$ ) of the electron donor was adjusted according to the following equation:

$$D_{\rm eff} = D \frac{\phi \cdot \delta}{\tau^2},$$
 [2]

where  $\phi$  is porosity of the hard mineral phase,  $\delta$  is constrictivity, and  $\tau$  is tortuosity. For the purpose of this study, the porosity of the Witwatersrand Basin rock units was assumed to be 0.005 (29),  $\delta = 1$ , and  $\tau = 3$  (77).

For the reactions containing gaseous species, the Gibbs free energy and the free energy flux were calculated for both the measured concentrations and for the diffusion-corrected gas concentrations. The difference in the Gibbs free energy for the measured concentrations and the diffusioncorrected gas concentrations was the greatest for those reactions using H<sub>2</sub> and NH<sub>3</sub>. H<sub>2</sub> has the highest diffusion rate of all gas species and as a result will be the most readily depleted in a fracture where head space is present. Because the pH is elevated, NH<sub>3</sub> is more abundant than NH<sub>4</sub><sup>+</sup> and will also preferentially partition into any head space. For example, the Gibbs free energy for the reactions for autotrophic acetogenesis and methanogenesis by  $CO_2$  reduction (#34 and #32 in *SI Appendix*, Fig. S3, respectively) were both slightly positive for the measured concentrations, but were slightly negative for the diffusion-corrected gas concentrations. The only microbial reaction impacted by the loss of NH<sub>3</sub> to the head space is the ANAMMOX reaction (#10 in *SI Appendix*, Fig. S3).

**Biogeochemical Model.** GWB was used to model the mixing between an ancient, saline end member and young, low-salinity, recharge water, the radiolytic generation of H<sub>2</sub>, O<sub>2</sub>, and H<sub>2</sub>O<sub>2</sub> and microbial chemolithotrophic reactions. The chemistry for the saline end member of the Witwatersrand Supergroup was derived from the average of fluid inclusion extracts (29) and the young, low-salinity, recharge water was derived from the average ground water analyses published by Abiye et al. (78). The rate of mixing of the pore water in the Witwatersrand quartzite with the meteoric recharge water until the composition of the borehole BE326 Bh2 water chemistry was attained was assumed to be ~1 My based upon the noble gas data. Given that the Cl<sup>-</sup> and NO<sub>3</sub><sup>-</sup> concentration in the saline end member are 1.5 M and 6 mM, respectively, and the Cl<sup>-</sup> concentration of the borehole BE326 Bh2 water derived from simple mixing would be 300  $\mu$ M. If this mixing occurred uniformly over the 1 My of groundwater migration, then the mixing rate for NO<sub>3</sub><sup>-</sup> would be ~0.3 nM·y<sup>-1</sup>.

The radiolytic production rates, based upon the average U, Th, and K content of the Witwatersrand quartzite and measured porosities (29), are 0.4 nM·y<sup>-1</sup> for H<sub>2</sub> and 0.2 nM·y<sup>-1</sup> for O<sub>2</sub>. The production rate of H<sub>2</sub>O<sub>2</sub> was 0.05 nM·y<sup>-1</sup>, and it was assumed that this H<sub>2</sub>O<sub>2</sub> reacted immediately with pyrite to generate sulfate. Based upon the stoichiometry of the reaction, FeS<sub>2</sub> + 7.5 H<sub>2</sub>O<sub>2</sub>  $\rightarrow$  5.5H<sub>2</sub>O + 0.5Fe<sub>2</sub>O<sub>3</sub> + 4H<sup>+</sup> + 2SO<sub>4</sub><sup>2-</sup>, this rate of H<sub>2</sub>O<sub>2</sub> production is equivalent to a SO<sub>4</sub><sup>2-</sup> production rate of ~0.02 nM·y<sup>-1</sup>. These fluxes for O<sub>2</sub>, H<sub>2</sub>, SO<sub>4</sub><sup>2-</sup>, NO<sub>3</sub><sup>-</sup>, and NH<sub>4</sub><sup>+</sup> were used to sustain chemolithorphic microbial reactions.

The microbial respiration rates for methanogenesis,  $SO_4^{-2}$  reduction,  $HS^-$  oxidation, and  $H_2$  oxidation were based upon published laboratory culture experiments that provided minimum free energy estimates or threshold concentrations ( $\Delta G$ ), kinetic rate constants, such as  $V_{max}$ , and the half-saturation Michaelis–Menten constants,  $K_m$ , and growth yields when available. The following expression was used for calculating the microbial respiration rate of planktonic microorganisms in the fracture water:

$$k = V_{\max} \cdot [X] \cdot F_D \cdot F_A \cdot F_T, \qquad [3]$$

where the reaction rate, k, is in moles-(kilogram of water)<sup>-1</sup>. second<sup>-1</sup>,  $V_{max}$  is the intrinsic rate constant of the electron donating and accepting reactions in moles-(milligram of biomass)<sup>-1</sup>.second<sup>-1</sup>, [X] is the concentration of cells in milligrams of biomass-(kilogram of water)<sup>-1</sup> (79, 80).  $F_D$  is the parameter controlling the electron-donating reaction and is defined by Eq. **4**, and the electron-accepting reaction, which is controlled by the parameter,  $F_{A_i}$  is defined by Eq. **5**:

$$F_D = m_D / (m_D + K_D),$$
 [4]

$$F_A = m_A / (m_A + K_A),$$
<sup>[5]</sup>

where  $m_D$  is the electron donor concentration,  $m_A$  is the electron acceptor concentration, and  $K_D$  and  $K_A$  are Michaelis-Menten constants in units of molar. The thermodynamic potential factor,  $F_T$  is defined as follows:

$$F_T = 1 - e^{-f/(xRT)}$$
, [6]

where *R* is the universal gas constant 8.314 J·K<sup>-1</sup>·mol<sup>-1</sup>, *T* is the temperature in Kelvin, *x* is the average stoichiometric number (81), or the ratio of the free energy change of the overall reaction to the sum of the free energy changes for each elementary step, and *f* is the net thermodynamic driving force of the reaction defined by the following:

$$f = -\Delta G - m \cdot \Delta G_{p}, \qquad [7]$$

where  $\Delta G$  is the free energy change of the redox reaction, *m* is the number of moles of ATP generated per mole of reactant, and  $\Delta G_p$  is the free energy for the phosphorylation reaction (82). The  $\Delta G_p$  for the phosphorylation reaction, ADP + P  $\rightarrow$  ATP, can vary from about 40–70 kJ-(mol of ATP)<sup>-1</sup> depending upon the temperature, pH, and concentrations of ADP and ATP in the cell (83, 84) and ranges from 50 to 88 kJ-(mol of ATP)<sup>-1</sup> if a thermodynamic efficiency of 80% is assumed. However, the  $m \cdot \Delta G_p$  was assumed to be 60 kJ-(mol of ATP)<sup>-1</sup> except in the case of H<sub>2</sub> oxidation reactions for which experimental data were used to constrain the threshold energy. The parameters used in GWB simulation are listed in *SI Appendix*, Table S7.

Simulations were then run incorporating microbial growth and maintenance energy demand rates to determine a microbial community composition based upon the reactant fluxes and microbial respiration rates calculated from the above Eqs. 3–7. The sustainable cellular concentrations within the fracture water were calculated in the GWB by assuming that the growth rate will be proportional to the relative magnitude in the difference between the maintenance energy demand and the rate of energy delivery of a metabolic redox equation defined as  $\Delta P$ :

$$\Delta P = -0.8\Delta G_r k - m_E \cdot \frac{g_c}{3,600'}$$
[8]

where  $\Delta P$  is in kilojoules-(milligram of biomass)<sup>-1</sup>-second<sup>-1</sup>,  $\Delta G_r$  is the free energy of the metabolic redox reaction at in situ temperature, activities, and fugacities, which is usually negative, in kilojoules-(mole of reactant)<sup>-1</sup>, k is the metabolic redox reaction rate in moles of reactant-(milligram of biomass)<sup>-1</sup>-second<sup>-1</sup>,  $g_c$  equals to 4.2 × 10<sup>-5</sup> moles of carbon per 1-mg dry weight of cell, and  $m_E$  is the maintenance energy demand in kilojoules-(mole of C biomass)<sup>-1</sup>-hour<sup>-1</sup>. k is dependent upon  $\Delta G_r$  such that when the  $\Delta G_r$  becomes less negative than a threshold energy, then k will be zero. We also assume that only 80% of the free energy is available for metabolism and the rest is lost as heat.  $m_E$  is defined by the following equation from Tijhuis et al. (85):

$$m_E = 4.5 \cdot e^{\left[-69,400 / R\left(\frac{1}{1 - 238}\right)\right]},$$
 [9]

where *R* is the universal gas constant 8.314 J·K<sup>-1</sup>·mol<sup>-1</sup>, and *T* is temperature in Kelvin. The rate of increase or decrease of the biomass is governed by the fraction of the  $\Delta G_r$  that is directed to maintenance and the growth yield, so the biomass, [X], increases according to the following relationship:

$$[X]_{i} = [X]_{i-1} + \frac{Y \cdot [X]_{i-1} \cdot \Delta P}{-\Delta G_{r}},$$
[10]

where  $[X]_i$  is the biomass concentration in milligrams of biomass-(kilogram of water)<sup>-1</sup> at time step *i*, and *Y* is the growth yield in milligrams of biomass-(mole of reactant)<sup>-1</sup>.

The  $m_{\rm E}$  relationship is based upon chemostat experimental data across a range of temperatures and is consistent with aerobic and anaerobic microorganisms having similar maintenance requirements dependent only upon the ambient temperature. For simplicity, we make the same assumption in our model. Onstott et al. (86) and Hoehler and Jørgensen (87) point out that the maintenance energy values from Eq. 9 appear to be two to three orders of magnitude greater than retentostat measurement of the maintenance energy rate (88), but to match the observed cellular abundance calculated from our

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model with the observed cellular concentration we only had to decrease the preexponential term from 4.5 to  $4.5 \times 10^{-1}$ . The addition of the maintenance energy rate to the GWB microbial kinetic function using a custom rate law enabled stabilization of the biomass as the concentrations of reactants and products change during the course of reaction progress and more accurately simulates subsurface populations existing in oligotrophic environments.

The growth yields for HS<sup>-</sup> oxidation by  $O_2$  and  $NO_3^-$  reduction were based on experimental observations of  $S_2O_3^{2-}$  oxidation by *Thiobacillus* species (89– 91) (*SI Appendix*, Table S7). The growth yields, kinetic parameters, and threshold values for the H<sub>2</sub> oxidation by  $O_2$  reduction, and H<sub>2</sub> oxidation coupled to denitrification were derived using GWB based on the experiments performed on *Thiobacillus plumbophilus* (92) and *Parococcus denitrificans* (93, 94), respectively (*SI Appendix*, Table S7).

The growth kinetics for autotrophic sulfate reducers are derived from Kristjansson et al. (95) and Sonne-Hansen et al. (96). The growth yields for autotrophic sulfate reducers are more difficult to constrain. In coculture experiments where acetogenic *Acetobacterium* growing on H<sub>2</sub> and CO<sub>2</sub> was supplying acetate to *Desulfovibrio*, the *Acetobacterium* comprised only 5% of the mixed culture (97). The doubling times for *Desulfovibrio* are twice as long when grown autotrophically as when grown on acetate (97). As a growth yield of 4.8 g (mol of reactant)<sup>-1</sup> has been published for *Desulfobacter postgatei* by Widdel and Pfennig (98), we have used a growth yield of 2.4 g (mol of reactant)<sup>-1</sup> for autotrophic growth of an sulfate reducer (*SI Appendix*, Table S7).

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