ENVIRONMENTAL MICROBIOLOGY

# **Contrasting Patterns of Community Assembly** in the Stratified Water Column of Great Salt Lake, Utah

Jonathan E. Meuser • Bonnie K. Baxter • John R. Spear • John W. Peters • Matthew C. Posewitz • Eric S. Boyd

Received: 24 October 2012 / Accepted: 9 January 2013 / Published online: 25 January 2013 © Springer Science+Business Media New York 2013

Abstract Phylogenetic examinations of communities sampled along geochemical gradients provide a framework for inferring the relative importance of niche-based ecological interactions (competition, environmental filtering) and neutral-based evolutionary interactions in structuring biodiversity. Great Salt Lake (GSL) in Utah exhibits strong spatial gradients due to both seasonal variation in freshwater input into the watershed and restricted fluid flow within North America's largest saline terminal lake ecosystem. Here, we examine the phylogenetic structure and composition of archaeal, bacterial, and eukaryal small subunit (SSU) rRNA genes sampled along a stratified water column (DWR3) in the south arm of GSL in order to infer the underlying mechanism of community assembly. Communities sampled from the DWR3 epilimnion were phylogenetically clustered (i.e., coexistence of close relatives due to environmental filtering) whereas those sampled from the DWR3 hypolimnion were phylogenetically

**Electronic supplementary material** The online version of this article (doi:10.1007/s00248-013-0180-9) contains supplementary material, which is available to authorized users.

J. E. Meuser · J. R. Spear Department of Civil and Environmental Engineering, Colorado School of Mines, Golden, CO 80401, USA

B. K. Baxter

Department of Biology and the Great Salt Lake Institute, Westminster College, Salt Lake City, UT 84105, USA

J. W. Peters · E. S. Boyd (⊠)
Department of Chemistry and Biochemistry,
Montana State University, 103 Chemistry Research Building,
Bozeman, MT 59717, USA
e-mail: eboyd@montana.edu

M. C. Posewitz Department of Chemistry and Geochemistry, Colorado School of Mines, Golden, CO 80401, USA overdispersed (i.e., coexistence of distant relatives due to competitive interactions), with minimal evidence for a role for neutral processes in structuring any assemblage. The shift from phylogenetically clustered to overdispersed assemblages was associated with an increase in salinity and a decrease in dissolved O<sub>2</sub> (DO) concentration. Likewise, the phylogenetic diversity and phylogenetic similarity of assemblages was strongly associated with salinity or DO gradients. Thus, salinity and/or DO appeared to influence the mechanism of community assembly as well as the phylogenetic diversity and composition of communities. It is proposed that the observed patterns in the phylogenetic composition and structure of DWR3 assemblages are attributable to the meromictic nature of GSL, which prevents significant mixing between the epilimnion and the hypolimnion. This leads to strong physicochemical gradients at the halocline, which are capable of supporting a greater diversity. However, concomitant shifts in nutrient availability (e.g., DO) at and below the halocline drive competitive interactions leading to hypolimnion assemblages with minimal niche overlap.

#### Introduction

To understand the mechanisms that both underlie and control the composition and structure of communities is a central goal for ecologists [1–3]. Recent studies aimed at understanding such mechanisms have focused on how contemporary and historical biological interactions (i.e., competitive, facilitative interactions) and the physiological and ecological characteristics of a species (i.e., environmental filtering) have shaped the phylogenetic structure of microbial communities [4–8]. The competitive exclusion hypothesis states that competitive interactions between closely related species within overlapping fundamental niches limit their coexistence over the long term [9]. Given that closely related species tend to share similar ecological niches (i.e., niche conservatism [2, 10]), competitive interactions lead to communities that are comprised of more distantly related species than would be expected based on the species richness of an assemblage (i.e., phylogenetic overdispersion) [1]. In contrast, environmental filtering relates to constraints imposed by the environment on the physiology of a species, which often lead to communities that are comprised of more closely related species than would be expected based on the species richness of an assemblage (i.e., phylogenetic clustering) [1]. In addition to the deterministic processes described above, stochastic or neutral mechanisms of community assembly are also important in structuring the composition of microbial assemblages. Hubble [11] defined communities subject to neutral assembly mechanisms as those that are structured entirely by ecological drift, random migration, and random speciation abilities. An important distinction of the neutral theory of community assembly is that a community on a per individual level is identical in their probabilities of giving birth, dying, migrating, and speciating. Thus, neutral theory is often considered to be a null hypothesis to niche theory [12].

Both ecological (competitive interactions, habitat filtering) and evolutionary or neutral mechanisms are likely to influence the phylogenetic structure and composition of microbial communities. The extent that each of these factors shapes phylogenetic structure is likely to reflect differences in the system being examined, the scale of the study, and the taxa pool that is being analyzed [12–15]. The comparative analysis of the phylogenetic structure of microbial communities sampled across geochemical gradients has the potential to provide insight into the relative importance of these processes in community assembly and can be used to identify barriers that limit the relative importance of each of these mechanisms [1, 5, 7]. For example, the composition and structure of Acidobacteria lineages sampled across an alpine elevational gradient revealed strong patterns of phylogenetic clustering regardless of elevation [5]. Interestingly, Acidobacteria lineages sampled across freshwater lake environments with contrasting geochemistry indicate that the extent of phylogenetic clustering appeared to be related to the pH of the lake being examined [8]. Variable evidence for ecological and neutral mechanisms of assembly were observed for guilds of organisms involved in organic carbon fermentation [4], nitrogen fixation [6], and photosynthesis [16] sampled across spatial geochemical gradients in Yellowstone hydrothermal ecosystems. As an example, photosynthetic assemblages sampled from hydrothermal ecosystems exhibited evidence for both phylogenetic clustering and overdispersion; the extent to which the structure of each assemblage reflected these mechanisms of assembly was correlated with pH [16]. In contrast, strong evidence for both ecological and neutral mechanisms of community assembly were detected in fermentative bacteria [4] and nitrogen fixing organisms [6] along geochemical gradients in Yellowstone; the extent to which each of these mechanisms influenced community structure was correlated with fluid pH and conductivity, respectively [4, 6]. These findings suggest the existence of environmental barriers that influence the extent by which various mechanisms of community assembly structure the composition of communities, which may vary at different taxonomic or trophic ranks.

Great Salt Lake (GSL) is the largest lake in the western United States and the fourth largest terminal lake in the world (52,000 km<sup>2</sup>) [17]. GSL is a shallow, meromictic lake that exhibits a maximum and a mean depth of ~9.0 and 4.3 m, respectively. The construction of a rock and gravel railroad causeway in the late 1950s segregated the lake into a north and south arm, and the restricted flow of water between these two "arms" resulted in the development of a salinity gradient [18]. The north arm salinity is typically at saturation [~5 M, 270–300 g/L total dissolved solids (TDS)] [19], whereas the salinity in the south arm surface brine is substantially lower (~ 2.5 M, 140-150 g/L TDS) due to freshwater inputs via three rivers. Breaches and seeps under the causeway spanning GSL allow the greater density north arm brine to flow underneath the less dense south arm brine, resulting in the formation of a distinct halocline of moderately hypersaline brine above an almost saturated deep brine layer over hundreds of square kilometers of the lake. This halocline creates additional physical and chemical gradients, including temperature and pH gradients [20, 21], which are likely to influence the function of microbial communities. For example, community productivity associated with microbial communities collected from two sites in the south arm of GSL was shown to vary considerably with water column depth and over an annual cycle, with lower overall productivity during the summer months and in the hypolimnion, both of which were attributed to seasonal variation in influent resource abundance and availability [21].

Here, we examine the phylogenetic structure of archaeal, bacterial, and eukaryal small subunit (SSU) rRNA genes in the water column at one of the Utah Division of Wildlife Resources (DWR) regular GSL monitoring sites, the DWR3 site in the south arm of GSL, in an effort to understand the relative importance of competitive and ecological interactions that shape the assembly of microbial communities. However, because assemblages with similar phylogenetic community structure may differ in their species composition [22], we also quantified changes in the taxonomic (alpha diversity) and phylogenetic composition and diversity (beta diversity) along the vertical transect. The vertical depth profile at DWR3 exhibited significant gradients in salinity, dissolved O<sub>2</sub> (DO), photosynthetically active radiation (PAR), temperature and pH for use in assessing their role and influence on the mechanisms of community assembly and community composition.

#### **Materials and Methods**

## Site Description and Sample Collection

Samples were collected from one GSL north arm site (NA, latitude 41.437891 longitude -112.668843) and one GSL south arm site (DWR3, latitude 41.16746, longitude -112.6696117) (Fig. 1). For the NA sample, brine was collected by wading out to a depth of 0.5 m and sampling surface water in June, 2006. For the DWR3 samples, brine was collected from a DWR

research vessel, first in June, 2006 (0 and 8 m depths) for our initial survey and again in June, 2007 (0, 4, 6, 6.5, and 8 m depths) for the follow-up analyses. Here, a 2-L Kemmerer collection bottle (Wildlife Supply, Yulee, FL, USA) was lowered to each depth sampled, with deionized water rinses between each sampling. Samples were transferred to sterile collection bottles leaving minimal headspace volume, stored on ice and transported to the laboratory. Cells were then pelleted by centrifugation (4,000×g for 15 min at 3 °C) using a Sorvall centrifuge (Thermo Fisher, Waltham, MA,



Fig. 1 Satellite image of the GSL with sampling sites where further molecular and geochemical analyses were performed are indicated. The color distinction separating the north arm from the south arm

reflects dominance by halophilic archaea and algae, respectively, in the microbial communities of these two basins

USA), the supernatant decanted, and biomass pellets resuspended in 1 mL of supernatant and stored at -80 °C until DNA extraction.

## Physical and Chemical Analysis

Environmental parameters were measured concomitant to environmental sampling. Quantum scalar irradiance of total available PAR ( $\mu$ mol 400–700 nm photons m<sup>-2</sup>s<sup>-1</sup>) was determined using a Li-Cor LI-193 underwater spherical quantum sensor and LI-250A light meter (Li-Cor Biosciences, Lincoln, Nebraska, USA). A Troll 9500 multi-sensor (In-Situ Inc., Fort Collins, CO, USA) was used to simultaneously acquire salinity, DO, temperature and pH at each DWR3 site sampling depth. Filtered GSL DWR3 brine samples were subjected to refractometry to determine salinity. To accurately determine DO response at each depth, 0.2 µM filtered, air-saturated brine samples from each DWR3 depth and the appropriate O<sub>2</sub> solubility equations [23] for NaCl brine were used for probe calibration. pH and temperature values for the 6.5-m depth were interpolated using the variation in salinity observed at this depth, relative to the 6.0 and 8.0 m depth.

#### DNA Extraction, Cloning, and Sequencing

Total DNA was extracted from resuspended "pea-sized" (approximately 200 mg) pellets of frozen biomass using the PowerSoil<sup>TM</sup> DNA Isolation Kit (MoBio Inc., Carlsbad, CA, USA) following the manufacturer's instructions with 2 min of bead beating (Mini Beadbeater-8, Biospec Products, Bartlesville, OK, USA) to assist lysis. An initial survey of the NA and DWR3 sites was conducted using universal small subunit (SSU) ribosomal RNA (rRNA) primers. The amplification of SSU rRNA genes from the NA and DWR3 DNA samples were performed using 1 mM concentrations of the forward primer 515 F (5'-GTGCCAGCMGCCGCGGTAA-3') and reverse primer 1492R (5'-GGTTACCTTGTTACG ACTT-3') [24]. PCR thermal cycling conditions were as follows: initial denaturation at 94 °C for 2 min, followed by 30 cycles of denaturation (94 °C for 1 min), annealing (55 ° C for 1 min) and elongation (72 °C for 1 min). For the DWR3 sample, domain-specific sequence analyses were performed. SSU rRNA gene sequences (16S rRNA for bacteria and archaea; 18S rRNA for eukaryotes) from each environmental sample were amplified using the domain-specific forward primers for bacteria (8F-5'-AGAGTTTGATCCTGGC TCAG-3'), archaea (4F-5'-TCCGGTTGATCCTGCCRG-3'), and eukarya (360FE-5'-CGGAGARGGMGCMT GAGA-3') in conjunction with the universal reverse primer, 1492R (5'-CCGTCAATTCMTTTRAGTTT-3') using 1 µL aliquots of total DNA extractions as templates in 25 µL PCR Master Mix reactions (Promega, Madison, WI, USA) with previously described amplification protocols [25]. The resulting amplicons were Montage gel purified (Millipore, Billiceric, MA, USA), and TOPO TA (Invitrogen, Carlsbad, CA) cloned into electrocompetent *E. coli* cells. Three domainspecific libraries of 96 SSU rRNA gene clones were analyzed from each depth sampled at DWR3. Cloned SSU rRNA gene amplicons were sequenced using an ABI 3700 sequencer using the 515F (5'-GACGGCGGTGWGTRCAA-3') primer. All sequences obtained in this study have been deposited in the GenBank, DDBJ, and EMBL databases under accession numbers JQ952783–JQ953087 (*Archaea*), JQ953088– JQ953419 (*Bacteria*), and JQ953420–JQ953640 (*Eukarya*) (see Supplemental Online Materials).

#### Sequence Analysis

ClustalX (ver. 2.0.9) [26] was used to align nucleic acid sequences using the International Union of Biochemistry substitution matrix and default gap extension and opening penalties. Since the length of individual reads varied and could bias downstream phylogenetic and community ecological analyses, alignment blocks were first trimmed to an empirically defined length met by  $\sim 70$  % of the sequences or discarded if defined length requirements were not met. This approach led to a bacterial SSU rRNA gene alignment block containing 332 reads with a uniform length of 416 positions. Likewise, the archaeal SSU rRNA gene alignment block contained 307 reads with a uniform length of 212 positions. The eukaryote SSU rRNA gene alignment block contained 223 reads with a uniform length of 460 aligned positions. There was no observable pattern in the discarded sequences from the bacterial, archaeal, and eukaryote SSU rRNA gene libraries (data not shown). Sequences were checked for chimeric artifacts using Mallard (ver. 1.02) [27] and anomalous sequences were verified using Pintail (ver. 1.0) [28] and these were discarded without further consideration. DOTUR [29] was used to define operational taxonomic units (OTUs) at a sequence identity threshold of 97 % and a precision of 0.01. Rarefaction curves, generated with a sequence identity threshold of 97 %, were used to calculate Chao1 predicted phylotype richness and Simpsons index (D). The reciprocal of the Simpson index (1/D) enables direct comparison of assemblage diversity between communities [30], with higher values corresponding to a comparatively greater alpha diversity.

## Phylogenetic Analysis

The phylogenetic position of all archaeal, bacterial, and eukaryal SSU rRNA genes was evaluated by approximate likelihood-ratio tests [31] as implemented in PhyML (version 3.0) [32]. Bacterial 16S rRNA gene phylogenies were rooted with SSU rRNA genes from *Acidilobus sulfurireducens* str. 18D70 (EF057391) and *Caldisphaera draconis* str. 18U65 (EF057392). Archaeal 16S rRNA gene phylogenies were rooted with SSU rRNA genes from Clostridium acetobutylicum ATCC 824 (AE001437), and Caldicellulosiruptor saccharolyticus DSM 8903 (CP000679). Eukaryote SSU rRNA gene phylogenies were rooted with SSU rRNA genes from the protist Cryptosporidium hominis isolate W18958 (GQ983354) and the ascomycete Zygosaccharomyces rouxii str. CBS732 (CU928181). Phylogenies were constructed using the General Time Reversible substitution model with a proportion of invariable sites and gamma-distributed rate variation as recommended by Modeltest (ver. 3.8) [33]. Phylograms were rate-smoothed using the multidimensional version of Rambaut's parameterization as implemented in PAUP (ver. 4.0) [34]. Rate-smoothing for each phylogram was performed according to the parameters identified using Modeltest. This included the identification of the substitution model, the gamma distribution of rate variation across sites, the proportion of invariant sites, nucleobase frequencies, and the rate matrix for each phylogram.

#### Community Ecological Analysis

Rate-smoothed cladograms were used to calculate Rao's quadratic entropy  $(D_{\rm P})$  and the net relatedness index (NRI) specifying among individual abundances (- a parameter) and 999 iterations with the program Phylocom (ver. 4.0.1) [35].  $D_{\rm P}$  is an abundance-weighted metric that describes the pairwise phylogenetic distance between sequences in a community, when compared to the total sequence pool. Assemblages with higher  $D_{\rm P}$  indices exhibit a greater phylogenetic diversity relative to the total sequence pool. We tested whether NRI values significantly differed from that of a randomly assembled community (null model). Given that the conclusions of the predominant mechanisms influencing the assembly of a community drawn from NRI values can be biased based on the choice of null model for comparison [12], we report the results of NRI indices calculated using all four methods of null model testing available within Phylocom (Supp. Table 1). These include a null model produced by shuffling the phylogeny (null model 0), randomizing the draw of species in the sample pool (null model 1), randomizing the draw of species in the phylogeny pool (null model 2), and the independent swap method (null model 3). Readers are referred to the Phylocom manual for additional details on null models. One thousand permutations were performed and a two-tailed significance test was used to evaluate the rank of observed values. When >900 permutations supported the observed values rather than the random or null model (p < 0.10), the observed rank was deemed to be significant.

Phylocom was also used to construct Rao among community phylogenetic distance matrices for each cladogram as previously described [36]. Euclidean distance matrices derived from the six environmental variables (i.e., depth, salinity, DO, PAR, temperature, and pH) were constructed using the base package within R (version 2.10.1). With Rao phylogenetic distance as the response variable, model selection through Akaike Information Criteria adjusted for small sample size (AICc) and Mantel regressions were performed to examine relationships with matrices describing individual environmental parameters using the R packages pgirmess (version 1.4.3) (http://pagesperso-orange.fr/giraudoux/) and Ecodist [37], respectively. We considered the model with the lowest AICc value to be the best and evaluated the relative plausibility of each model by examining differences between the AICc value for the best model and values for every other model ( $\Delta$ AICc) [38].

#### Results

Screening of Great Salt Lake Biodiversity

An initial probe of microbial community biodiversity was performed at one north arm (NA, 0.5 m depth) and one south arm site (DWR3, surface and 8 m depths) (Fig. 1) to identify an environment with high phylogenetic diversity. Site selection was based on the premise that communities with higher phylogenetic diversity and/or better evidence for phylogenetic structure (assessed using "universal" SSU rRNA gene primers) would provide a better opportunity to identify the variation in phylogenetic composition and structure along the vertical depth gradient. The NA and DWR3 assemblages exhibited statistically significant and positive NRI (5.79 and 5.64, p < 0.01 and p < 0.01, respectively, using null model 0) values, suggesting that the surface communities at each site are phylogenetically clustered. Such phylogenetic clustering is indicative of ecological filtering by their local environment whereby closely related species share phenotypic traits that allow them to persist in a given habitat, but not adjacent habitats [7]. An examination of  $D_{\rm P}$  revealed a lower metric for the assemblage sampled from 0.5 m at NA (0.273), than assemblages sampled from the DWR3 surface (0.283) or deep brine (0.356) suggesting that the community inhabiting the DWR3 harbors a greater phylogenetic diversity. Thus, of the two sites, DWR3 was determined to have the best potential to uncover relationships between both the gradients in physicochemistry and the phylogenetic structure and composition of individual archaeal, bacterial, and eukaryal SSU rRNA gene assemblages.

### DWR3 Water Column Physicochemistry

Mid-day sampling of the DWR3 water column to a final depth of ~ 8 m revealed gradients in salinity (143 to 247 ppt), DO (0.98 to 5.45 mgL<sup>-1</sup>), PAR (0–1800  $\mu$ molm<sup>-2</sup>s<sup>-1</sup>), temperature (16.59 to 24.17 °C), and pH (5.95 to 8.07) (Fig. 2). PAR



Fig. 2 a Salinity and temperature as a function of water column depth. b PAR, pH, and DO as a function of water column depth. Gray points indicate data that were interpolated

decreased immediately within the first few meters of the DWR3 transect with near total attenuation at a depth of 8 m. A dramatic increase in salinity and decrease in temperature occurred at the deep brine layer at depths of 6.5 to 8 m (Fig. 2a). Additionally, dissolved O<sub>2</sub> levels decreased dramatically at the oxic/anoxic interface (~6 and 6.5 m). The pH increased slightly at 6 m, but was lowest at 8 m. A number of physicochemical parameters co-varied. For example, water column salinity varied inversely with water column temperature (Pearson R=-0.89, p=0.04) and DO (Pearson R=-0.99, p<0.01) (data not shown). Water column temperature varied with the pH of the water (Pearson R=0.87, p=0.05) whereas the DO concentration in the water column varied positively with temperature (Pearson R=-0.83, p=0.08) and inversely with salinity (Pearson R=-0.81, p=0.10).

# Archaeal, Bacterial, and Eukaryal SSU rDNA Sequencing at DWR3

The phylogenetic diversity and structure of archaeal, bacterial, and eukaryal assemblages were characterized along the covarying physicochemical gradients that make up the DWR3 water column. A total of 307 archaeal, 332 bacterial, and 223 eukaryal SSU rRNA gene sequences that met our length criteria (see "Materials and Methods") were obtained from 5 depths (Table 1). The average depth of sequence coverage was 73.4 % for archaeal assemblages, 49.5 % for bacterial assemblages, and 90.7 % for eukaryal assemblages.

# Assessing the Phylogenetic Structure of DWR3 Assemblages

The NRI metric describes the extent by which sequences that comprise an assemblage are clustered on an ultrameric phylogenetic tree. Positive NRI values indicate phylogenetic clustering and suggest that the community is shaped largely by physiological or ecological constraints imposed by the

environment (i.e., environmental filtering) whereas negative values indicate phylogenetic overdispersion and suggest that the community is shaped largely by competitive interactions [1]. NRI values that are not statistically significant imply weak competition or environmental filtering and may be suggestive of an important role for neutral processes in community assembly [12]. We first compared the results of NRI values obtained using the four null models available in Phylocom (for a complete description of Phylocom null models, see [35]). All of the NRI metrics revealed similar trends (Supp. Table 1), as indicated by positive and significant correlations when they were regressed against each other (Pearson R > 0.75for all comparisons) (data not shown). In particular, NRI metrics determined for archaeal, bacterial, and eukarval assemblages sampled from the epilimnion using each of the four null models were positive and generally statistically significant (Supp. Table 1), indicating that these assemblages are clustered phylogenetically. Regardless of the null model that is considered, the NRI decreased systematically with depth along DWR3. NRI calculated for archaeal, bacterial, and eukaryal assemblages using null models 0, 1, and 2 were negative in the hypolimnion, although not all were statistically significant (Supp. Table 1, Fig. 3). In contrast, NRI calculated for archaeal, bacterial, and eukaryal assemblages using null model 3 were positive, but not always statistically significant. The discrepancy in the NRI metrics and their statistical significance when calculated using the various null models is likely due to the sensitivity of the models to niche-based mechanisms of assembly versus neutral-based mechanisms of assembly. A previous metacommunity simulation conducted with these four null models found that null models 0, 1, and 2 tend to be more conservative toward identifying patterns in phylogenetic structure that could differentiate niche-based mechanisms of assembly (e.g., environmental filtering or competition) when multiple traits are likely involved in niche assembly in heterogeneous environments [12]. However, care must be exercised in that these same null

Table 1	Clone library statistics f	or archaeal and bacterial	165 rKNA g	genes and eukaryi	185 rkna g	ene assemblages	sampled from	i each of five
depths as	determined using DOT	UR and a percent identit	y threshold o	of 97 %				

Archaea					Bacteria					Eukarya			
Depth (m)	n <sup>a</sup>	Chao1 <sup>b</sup>	Unique <sup>c</sup>	$1/D^{\mathbf{b}}$	n <sup>a</sup>	Chao1 <sup>b</sup>	Unique <sup>c</sup>	$1/D^{b}$	n <sup>a</sup>	Chao1 <sup>b</sup>	Unique <sup>c</sup>	$1/D^{b}$	
0.0	62	7	6 (85.7)	2.68	66	43	21 (48.8)	6.60	28	2	2 (100.0)	1.08	
4.0	13	2	2 (100.0)	2.05	39	22	13 (58.2)	4.01	44	2	2 (100.0)	1.38	
6.0	75	36	18 (49.5)	3.61	34	58	26 (45.1)	51.00	68	3	3 (100.0)	1.69	
6.5	75	91	36 (39.5)	25.00	82	94	40 (42.5)	27.22	28	6	5 (90.9)	2.39	
8.0	82	27	25 (92.3)	17.03	111	109	58 (53.1)	27.75	53	8	5 (62.5)	1.43	

<sup>a</sup> Number of clones sequenced

<sup>b</sup> Predicted Chao1 richness and Simpson (D) indices for an assemblage comprising n sequences as determined by DOTUR at a sequence identity threshold of 97 %. The Simpson index D was converted to a diversity index by taking the reciprocal of D(1/D)

<sup>c</sup> Number of unique phylotypes sampled from a clone library comprising n sequences as determined by DOTUR at a sequence identity threshold of 97 %, with the coverage of the predicted Chao1 richness indicated in *parentheses* 

models are subject to type I errors (false positives) and can detect non-random patterns of phylogenetic structure in communities that are assembled according to neutral mechanisms [12]. Thus, the most conservative interpretation for these observations is that both niche-based competitive interactions and stochastic evolutionary processes are influencing the composition of hypolimnion assemblages.

NRI values observed for each assemblage decrease substantially and sometimes significantly at or below the halocline, where strong gradients in geochemistry are also observed (Fig. 2). Of the environmental parameters measured, NRI values for archaeal, bacterial, and eukaryal assemblages varied most strongly with DO and salinity in the same manner,



Fig. 3 Variation in archaeal (*blue*), bacterial (*red*), and eukaryal (*green*) phylogenetic relatedness as assessed using the NRI along the DWR3 depth gradient as assessed using null model 0 (see "Materials and Methods"). The *gray box* separates positive NRI values, which indicate phylogenetic clustering, and *negative values*, which indicate phylogenetic overdispersion. Observed community phylogenetic structures unlikely to arise by chance (p < 0.10) are depicted by *solid symbols*. The halocline, as inferred by salinity measurements at DWR3, is indicated by a *hashed line* 

regardless of the null model used to calculate NRI. For example, NRI associated with archaeal, bacterial, and eukaryal SSU rDNA assemblages calculated with null model 0 (Fig. 3) were inversely correlated with salinity (Pearson R=-0.79, -0.65, and -0.73, respectively; *p* values=0.11, 0.23, and 0.16) and positively correlated with DO (Pearson R=0.62, 0.86, and 0.78, respectively; *p* values=0.26, 0.06, and 0.12) (data not shown).

#### Assessing the Alpha and Beta Diversity of Assemblages

The predicted Chao1 phylotype richness and Simpson diversity indices for archaeal, bacterial, and eukaryal assemblages sampled from each depth generally followed the same trends and tend to co-vary (Fig. 4). The lowest predicted archaeal, bacterial, and eukaryal Simpson diversity was observed from the surface to a depth of 4 m. At depths ranging from 4 to 6 m, the Simpson diversity indices associated with the three assemblages begin to increase gradually, reaching a maximum at 6 m in the case of the bacterial assemblages, and reaching a maximum at 6.5 m in the case of archaeal and eukaryal assemblages. Intriguingly, the maximum predicted diversity metrics for each assemblage occurred as the halocline at DWR3 was traversed (Fig. 1), and with the exception of the eukaryal communities, remained comparatively high into the deep brine layer to a depth of 8 m (Fig. 4).

Individual phylogenetic reconstructions of the archaeal, bacterial, and eukaryal SSU rRNA genes sampled from the five water column depths yielded well-supported phylograms for use in examining the phylogenetic composition and structure of assemblages from these environments. We calculated Rao's index of phylogenetic diversity ( $D_P$ ), a  $\beta$ -diversity metric that incorporates abundance weights for phylogenetic branch lengths associated with each assemblage, for each domain.  $D_P$  values associated with archaeal and eukaryal



Fig. 4 Predicted Chaol richness, Simpson's Index of diversity, and Rao's phylogenetic diversity  $(D_P)$  associated with archaeal 16S rRNA (a), bacterial 16S rRNA (b), and eukaryl 18S rRNA (c) gene assemblages as a function of water column depth

assemblages were greatest at a depth of 6.5 m, whereas only a small increase in the  $D_P$  associated with the bacterial community was observed as the halocline was traversed, reaching a maximum in the hypolimnion (Fig. 4). The  $D_P$  associated with

archaeal assemblages exhibited a significant and inverse correlation with DO (Pearson  $R^2=0.84$ , p=0.03) whereas the  $D_P$  associated with eukaryal assemblages was most strongly correlated with PAR, although the relationship was not statistically significant (Pearson  $R^2=0.40$ , p=0.25) (data not shown). The  $D_P$  metric associated with bacterial assemblages was not strongly correlated with any measured variable.

Model selection and Mantel tests were used to quantify and rank the extent to which the phylogenetic relatedness of archaeal, bacterial, and eukaryal SSU rRNA gene assemblages reflected the characteristics of the environments from where they were sampled (Table 2). A dissimilarity matrix that describes the average Rao phylogenetic distance between lineages associated with one community when compared to lineages that comprise a second community served as the response variable. A model that describes all of the environmental parameters together (environmental matrix) was a strong predictor of the phylogenetic similarity of archaeal assemblages (Mantel  $R^2=0.74$ , p=0.02) but was a weak predictor of the similarity of bacterial and eukarval assemblages (Mantel  $R^2=0.01$  and 0.17, respectively; p=0.69 and 0.33, respectively) (Table 2). This observation suggests that bacterial and eukaryal lineages may be responding to individual environmental parameters that are masked when all parameters are considered together.

Of the individual parameters measured, the phylogenetic relatedness of archaeal SSU rRNA could best be predicted on the basis of the variation in temperature ( $\Delta AICc=0.00$ , Mantel  $R^2=0.74$ , p=0.03); this relationship was statistically indistinguishable from a model that included salinity  $(\Delta AICc=1.00, Mantel R^2=0.72, p=0.02)$  (Table 2). Given the covariance of temperature and salinity at DWR3, it is unclear which of these parameters, or both, is the true driver of community composition. The phylogenetic relatedness of bacterial communities could best be explained by variation in DO ( $\triangle$ AICc=0.00, Mantel  $R^2$ =0.79, p=0.05) while the phylogenetic relatedness of the eukaryal assemblages could not be explained by any individual environmental parameters with statistical significance. The lack of a significant relationship between eukaryal communities and environmental parameters may be due to the presence of a dominant and nearly identical assemblage comprised of a single dominant alga (see below) in each of the 5 water column depths (Fig. 5), a feature that would lead to low phylogenetic signal and which would render community ecology approaches to characterizing shifts in community phylogenetic diversity less effective. The lack of correspondence observed here may also be due to the settling of algal biomass, as suggested by the dominance of algal taxa in assemblages below the halocline where PAR values are low.

<b>Table 2</b> Model ranking using $\triangle$ AICc and Mantel correlation coefficients ( $R^2$ ) where SSU rRNA Rao among con-	mmunity phylogenetic distance is
the response variable. The p values were computed from 1000 Mantel regression permutations	

Archaeal 16S rDNA				Bacterial 1	Bacterial 16S rDNA				Eukaryal 18S rDNA			
Model	ΔAICc	$R^2$	р	Model	ΔAICc	$R^2$	р	Model	ΔAICc	$R^2$	р	
Temp	0.0	0.74	0.03	DO	0.0	0.79	0.05	Salinity	0.0	0.18	0.35	
ENV <sup>a</sup>	0.2	0.74	0.02	Depth	13.1	0.22	0.07	DO	0.1	0.17	0.10	
Salinity	1.0	0.72	0.02	PAR	15.0	0.05	0.36	ENV <sup>a</sup>	0.1	0.17	0.33	
pН	9.3	0.35	0.07	pН	15.3	0.02	0.76	PAR	0.6	0.13	0.56	
DO	10.2	0.29	0.12	Temp	15.5	0.01	0.76	Temp	1.1	0.08	0.47	
Depth	13.0	0.05	0.48	ENV <sup>a</sup>	15.5	0.01	0.69	Depth	1.6	0.03	0.73	
PAR	13.5	0.00	0.92	Salinity	15.5	0.00	0.80	pН	1.8	0.01	0.79	

Abbreviations:  $\Delta AICc$  difference in the Akaike Information Criterion for each model and the best model adjusted for small sample size;  $R^2$  Mantel correlations coefficient; p p value derived from Mantel regression

<sup>a</sup> ENV an explanatory model that describes the variation in all five of the measured parameters (depth measurement excluded).

# Taxonomic Composition of DWR3 Vertical Transect Microbial Communities

Both model selection and Mantel regression analyses indicate that the phylogenetic diversity of archaeal, bacterial, and eukaryal assemblages shift in response to environmental gradients, albeit to differing extents and in response to different factors. To identify specific lineages whose distribution is most influenced by environmental gradients, we examined the taxonomic composition of SSU rRNA gene assemblages as assessed by BLASTn analysis (Supp. Tables 2, 3 and 4; Fig. 5). In contrast to archaeal and eukaryal assemblages, which were dominated by a single taxonomic order (Supp. Tables 5 and 7), bacterial assemblages were more diverse (Supp. Table 6). Thus, order level assignments were chosen for this domain in attempt to simplify the analysis and identify the broader trends in the dataset.

## Archaea

Archaeal 16S rRNA gene sequences generated from the transect along the DWR3 vertical profile revealed a unique specieslevel biodiversity that is generally not reflected from culture collections, as indicated by an average 94 % sequence identities (minimum=84 %, maximum=100 %) to cultivated representatives (Supp. Table 2and 5, Fig. 5a). The archaeal SSU rRNA gene communities sampled along the vertical transect were dominated by sequences affiliated with the archaeal order Halobacteriales. Several archaeal taxa dominated at each depth and exhibited clear trends with respect to physical and geochemical measurements (Supp. Table 8). The abundance of sequences affiliated with Halogeometricum sp. (range of 4.9 to 100.0 % of total sequences) were inversely correlated with salinity (Pearson  $R^2=0.95$ , p<0.01) and positively correlated with temperature (Pearson  $R^2=0.92$ , p<0.01) (Supp. Table 8). In contrast, the abundance of sequences affiliated with *Halonotius* sp. (range of 0.0 to 28.0 % of total sequences) was positively correlated with salinity (Pearson  $R^2=0.97$ , p<0.01) and inversely correlated with temperature (Pearson  $R^2=0.96$ , p<0.01). The abundances of sequences affiliated with *Haloquadratum* sp. (0.0 to 15.9 % of total sequences) and *Halosimplex* sp. (0.0 to 15.9 % of total sequences) both varied positively with salinity and inversely with temperature and DO. In addition to sequences affiliated with the *Halobacteriales*, sequences affiliated with the methanogens *Methanobrevibacter* sp. and *Methanohalophilus* sp. were identified. The abundance of both organisms were inversely correlated with DO and positively correlated with salinity.

#### Bacteria

Like the archaeal characterization, bacterial 16S rRNA gene sequences generated from each transect along the DWR3 vertical profile revealed a unique biodiversity that is generally absent from culture collections at the species level, as indicated by an average 94 % sequence identities (minimum=84 %, maximum=100 %) to cultivated representatives (Supp Table 3and 6, Fig. 5b). The abundance of several dominant bacterial orders varied with physicochemical measurements (Supp. Table 9). For example, the abundance of sequences affiliated with the bacterial orders Chromatiales (1.3 to 54.3 % of total) and Rhodobacteriales (5.0 to 20.0 % of total), (Supp. Table 5) were positively correlated with DO (Pearson  $R^2$ = 0.87 and 0.75, respectively; p values=0.07 and 0.17, respectively) (Supp. Table 9). In contrast, the abundance of sequences affiliated with the Desulfobacterales (0.0 to 17.6 % of total), and the Uncharacterized CFB (Cytophaga-Flavobacteria-Bacteroides) Group (0.0 to 18.9 % of total) were inversely correlated with DO (Pearson  $R^2 = 0.82$  and 0.80, respectively; p=0.04 and 0.04, respectively). In addition to DO, the abundance of sequences affiliated with a number of bacterial orders exhibited strong correlations with other



Fig. 5 Composition of archaeal (a), bacterial (b), and eukaryal (c) SSU rRNA gene assemblages from 0.0-, 4.0-, 6.0-, 6.5-, and 8.0-m depths, when binned at the genus, order, and genus level of taxonomy, respectively. Archaeal genera and bacterial orders that comprised <2 and <3 %, respectively, of each assemblage were combined and depicted as "other". Full taxonomic information for each assemblage is provided in Supplemental Tables 1, 2, 3, 4, 5, 6

physical and chemical measurements that are consistent with their inferred physiologies (Supp. Table 9).

#### Eukarya

The eukaryotic 18S rRNA gene libraries from the transect along the vertical profile of DWR3 were the least diverse of the domains examined, exhibiting an average percent identity to known taxa of 98 % (minimum=90 %, maximum=100 %) (Supp. Table 4 and 7, Fig. 5c). All of the eukarval 18S rRNA gene assemblages sampled along the DWR3 vertical transect were dominated by algae affiliated with the taxonomic order Chlamydomonadales (range 78.6-100.0 % of total sequences). However, the composition of the algal component of the community shifted in response to environmental gradients. The abundance of sequences affiliated with the alga Dunaliella sp., the dominant alga in all transects of the water column (range 71.4 to 96.4 % of total sequences), was positively correlated with PAR (Pearson  $R^2=0.71$ ; p=0.07) (Supp. Table 10). Likewise, sequences affiliated with the alga Oogamochlamys were primarily identified from the 0 to 6 m depths, the abundance of which varied positively with pH and inversely with salinity (Pearson  $R^2=0.47$  and 0.33), albeit without strong statistical support. Sequences affiliated with Chlamydomonas sp. within the green algal class Chlorophyceae were identified at the 6.0 and 6.5 m depths, while sequences affiliated with Picochlorum within the algal class Trebouxiophyceae were only identified at the 8 m depth. In addition to algae, eukaryal assemblages from deeper depths ( $\geq 6$  m) in the vertical transect contained sub-dominant sequences (<18 % of total sequences) affiliated with the arthropod Artemia sp. (1.1 to 17.9 % of total) and the fungus Malassezia sp. (0.0 to 3.6 % of total); the abundance of these genera did not vary significantly with any of the parameters measured in this study (Supp. Table 10).

#### Discussion

The strong gradients in physical and chemical parameters present in the DWR3 vertical transect of the GSL provide the unique opportunity to examine patterns in the mechanism of archaeal, bacterial, and eukaryal community assembly as a function of environment. Here, using phylogenetic approaches applied to a Sanger sequenced SSU rRNA gene dataset [5, 7], we assessed the relative importance of physiological or ecological constraints imposed by the environment (i.e., environmental filtering) and interspecies competition as controls on the phylogenetic structure and composition of individual archaeal, bacterial, and eukaryal assemblages inhabiting DWR3. Importantly, we also examined the structure of communities for evidence for stochastic or neutral -based processes [11] in the assembly of DWR3 assemblages. While evidence for a role for neutral-based processes was observed, in particular in the hypolimnion when null model 3 was employed in NRI calculations, the multiple lines of evidence, most importantly the strong capacity to predict the composition of archaeal and

bacterial communities along the DWR3 gradient as a function of geochemistry, suggest that deterministic niche-based processes are likely the predominant influences on the assembly of communities along the DWR3 vertical transect. Nonetheless, the observation that p values for NRI were not all significant suggests an important, and likely secondary, role for stochastic processes in the assembly of DWR3 assemblages, in particular at or below the halocline.

A shift in the predominant mechanism of assembly from that of phylogenetically clustered communities to that of phylogenetically overdispersed assemblages along the DWR3 vertical transect was influenced by the characteristics of the environment. Here, the assembly of communities sampled from the epilimnion was found to be influenced primarily by environmental filters whereas the assembly of those sampled from the hypolimnion was influenced primarily by competitive interactions. The extent of phylogenetic overdispersion, as assessed by the net relatedness index (NRI), was positively correlated with salinity and inversely correlated with DO. It is not clear how salinity itself would directly lead to greater competitive interactions among populations comprising an assemblage. Rather, it is proposed that the strong association observed between the extent of phylogenetic overdispersion and salinity is due to the stratification of GSL due to differences in brine density which affects the rate of mixing between layers, imposes nutrient limitation in the hypolimnion, and creates strong gradients in other physical and chemical variables. In support of this model, a previous assessment of isopleths of water column temperature at a site in the south arm of GSL concluded that the differences in brine densities prevent significant mixing between the epilimnion and the hypolimnion, which creates gradients in nutrients such as phosphorus and nitrate [21]. In the present study, the concentration of DO in the south arm of GSL was also found to systematically decrease with depth, with the hypolimnion containing  $\sim 20$  % of the DO concentration present in the surface waters. Nutrient limitation would be expected to limit the coexistence of species with overlapping fundamental niches that relate to O<sub>2</sub> toxicity or utilization [9], leading to phenotypic repulsion [1] and communities comprised of more distantly related species than would be expected based on the species richness of an assemblage and the patterns identified here [9].

The diversity of archaeal, bacterial, and eukaryal SSU rRNA gene assemblages, as assessed using both alpha and beta metrics, increased systematically with depth, reaching a maximum at the halocline (6–6.5 m depth). In other interfacial ecosystems such as riparian zones [39] and soils [40], the strength and periodicity of mixing between adjacent ecological systems across spatial and temporal scales creates physical, chemical, and biological heterogeneity that is the source of a multitude of habitats supporting vast biological and functional diversity [41]. Thus, the interface between the epilimnion and the hypolimnion and the physical and

chemical heterogeneity that it creates at the DWR3 halocline may create additional ecological niches capable of supporting a greater diversity. Indeed, a recent study of mat communities in salterns in Guerrero Negro, Mexico which exhibit significant gradients and redox interfaces revealed significant shifts in community composition that were related to chemical gradients [42]. Likewise, a recent study found that the functional diversity of microbial communities inhabiting the interface between surface and deep brines in GSL is greater than that observed in the adjacent ecological systems [43]. Interestingly, this increase in functional diversity observed at the interface was not accompanied by an increased taxonomic phylogenetic diversity, an observation that the authors attribute to extensive horizontal gene transfer within the ecosystem [43].

The phylogenetic composition of archaeal, bacterial, and eukaryal communities inhabiting the DWR3 water column could be accurately predicted on the basis of environmental parameters, most notable salinity, DO, and temperature; both DO and temperature co-vary with salinity. These results are in agreement with previous reports which implicate salinity gradients as the primary driver of the phylogenetic similarity of bacterial assemblages [44] and bacterial/archaeal assemblages [45] in globally distributed microbiomes, including GSL. Since microorganisms inherit their ecological predilections from their ancestors [2, 10] with the exception of cases of horizontal gene transfer [46], this finding suggests that the populations that comprise the communities along the DWR3 gradient, characterized here by taxonomic genes, show conservatism in their habitat types. An examination of the inferred physiology of the dominant populations that comprise each assemblage in the DWR3 also supports this notion.

The abundance of 16S rRNA genes affiliated with the Halogeometricum decreased with increasing salinity whereas the abundance of sequences affiliated with several other genera (e.g., Halorubrum) increased with increasing salinity. Among the bacteria, the abundance of 16S rRNA genes affiliated with the Chromatiales decreased with increasing salinity and decreasing DO, whereas the abundance of Desulfobacterales and the uncharacterized CFB group increased systematically with increasing salinity and decreasing DO. The strain most closely affiliated with the Chromatiales identified in this study is Aquisalimonas asiatica, an aerobic halophile that prefers lower salinities [47], consistent with its distribution in the epilimnion. In contrast, the sequences that cluster with the Desulfobacterales, which were more prevalent in the low DO hypolimnion, are most closely related to a number of genera that are known to reduce sulfate [48] including Desulfohalobium utahense that was isolated from GSL[48]. Likewise, the predominant CFB sequence detected in the deeper depths of DWR3 is related to Prolixibacter bellariivorans, a facultative anaerobe that ferments sugars

and in the process generates mixed acids and likely H<sub>2</sub>, considering that the organism harbors a mixed acid fermentation pathway [49]. These inferences are consistent with previous reports of the detection of H<sub>2</sub>S, H<sub>2</sub>, and acetate in the hypolimnion of GSL, where anaerobic taxa such as those mentioned above are likely to thrive [21, 50–52]. The abundance of sequences affiliated with the alga *Dunaliella* spp., the dominant alga across all depths, were positively correlated with PAR (Pearson  $R^2$ =0.71; p=0.07) (Supp. Table 10). This is not a surprising result, as *Dunaliella* spp. have consistently been reported as the major contributor to photosynthetic primary productivity in GSL [53].

In conclusion, the results presented here provide compelling evidence that deterministic processes have played an important role in defining the composition of microbial assemblages along the DWR3 vertical transect, in particular in the epilimnion. The non-random distribution of lineages along the DWR3 vertical profile, coupled with evidence of increasing phylogenetic diversity with depth and a transition in the mechanism of community assembly at the halocline suggests strong conservatism in their habitat types. Conservatism in habitat type is facilitated by conservatism in physiological traits, which enable biodiversity to persist in a given environmental context. Thus, one would expect to observe significant shifts in the functional diversity and metabolic potentials (e.g., shift from primarily aerobic to anaerobic taxa at halocline) as one transcends the DWR3 vertical transect. Indeed, recent evidence suggests that the distribution of a biomarker gene for anoxic bacterial organic carbon fermentation [i.e., [FeFe]-hydrogenase structural gene hvdA responsible for the production of H<sub>2</sub> in many environments [54] are absent from the epilimnion, but are abundant in the hypolimnion (E.S. Boyd, unpublished data). Thus, the results of this paper further underscore the utility of phylogenetic tools in ecological research aimed at improving understanding into the mechanisms that both underlie and control the composition and structure of communities in natural environments [1-3].

Acknowledgments The authors express their sincere gratitude to John Luft and colleagues at the Utah Division of Wildlife Resources, Great Salt Lake Ecosystem Project, for boat access, sampling help, and GIS expertise. The authors of this work gratefully acknowledge the United States Air Force Office of Scientific Research under grant FA9550-05-1-0365 and FA9550-11-1-0211 (to JEM, JWP, MCP, and ESB) and R-8196-G1 to JRS. We would also like to acknowledge the technical assistance of Devin Karns and Alex Trujillo as well as Shannon Ulrich and Dave Vuono for their careful review of a previous version of this manuscript.

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