Long term trends in diatom diversity and palaeoproductivity: a 16,000-1 vear multidecadal study from Lake Baikal, southern Siberia 2 3 4 5 6 Anson W. Mackay^{1*}, Vivian A. Felde², David W. Morley¹, Natalia Piotrowska³, Patrick 7 Rioual⁴, Alistair W.R. Seddon², George E.A. Swann⁵ 8 9 ¹Anson W. Mackay* 10 Environmental Change Research Centre, Department of Geography, UCL, London UK, 11 WC1E 6BT. 12 ans.mackay@ucl.ac.uk 13 *Corresponding Author 14 15 ²Vivian Astrup Felde 16 Department of Biological Sciences, and Bjerknes Centre of Climate Research, University of Bergen, PO Box 7803, Bergen N-5020, Norway 17 18 Vivian.Felde@uib.no 19 20 ¹David W. Morley 21 Environmental Change Research Centre, Department of Geography, UCL, London UK, 22 WC1E 6BT. 23 d.w.morley@gmail.com 24 25 ³Natalia Piotrowska 26 Department of Radioisotopes, Institute of Physics - CSE, Silesian University of Technology, 27 Konarskiego 22B, 44-100 Gliwice, Poland 28 Natalia.Piotrowska@polsl.pl 29 30 ⁴Patrick Rioual 31 Key Laboratory of Cenozoic Geology and Environment, Institute of Geology & Geophysics, 32 Chinese Academy of Sciences, P.O. box 9825, Beijing 100029, China 33 prioual@mail.igcas.ac.cn 34 35 ²Alistair W. R. Seddon 36 Department of Biological Sciences, and Bjerknes Centre of Climate Research, University of 37 Bergen, PO Box 7803, Bergen N-5020, Norway 38 alistair.seddon@uib.no 39 40 ⁵George E. A. Swann 41 School of Geography, University of Nottingham, University Park, Nottingham, NG7 2RD, 42 UK 43 George.Swann@nottingham.ac.uk 44 45 46 Correspondence to: Anson W. Mackay (ans.mackay@ucl.ac.uk)

Abstract

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Biological diversity is inextricably linked to community stability and ecosystem functioning, but our understanding of these relationships in freshwater ecosystems is largely based on short-term observational, experimental, and modelling approaches. Using a multidecadal diatom record for the past c. 16,000 years from Lake Baikal, we investigate how diversity and palaeoproductivity have responded to climate change during periods of both rapid climate fluctuation, and relative climate stability. Here we show dynamic changes in diatom communities during the past 16,000 years, with decadal shifts in species dominance punctuating millennial-scale seasonal trends. We describe for the first time in Lake Baikal a gradual shift from spring to autumnal diatom communities that started during the Younger Dryas and peaked during the Late Holocene, and likely represent orbitally-driven ecosystem responses to long-term changes in seasonality. Using a multivariate classification tree, we show that trends in planktonic and tychoplanktonic diatoms broadly reflect both long-term climatic changes associated with the demise of Northern Hemisphere ice sheets, and abrupt climatic changes associated with, for example, the Younger Dryas stadial. Indeed, diatom communities are most different before and after the boundary between the Early and Middle Holocene periods c. 8.2 cal kyr BP, associated with the presence and demise of northern hemisphere ice sheets respectively. Diatom richness and diversity, estimated using Hill's species numbers, are also shown to be very responsive to periods characterised by abrupt climate change, and using knowledge of diatom autecologies in Lake Baikal, diversity trends are interpreted in terms of resource availability. Using diatom biovolume accumulation rates (BVAR; µm³ cm⁻² yr⁻¹), we show that spring diatom crops dominate palaeoproductivity for nearly all of our record, apart from a short period during the late Holocene, when autumnal productivity dominated between 1.8–1.4 cal kyr BP. Palaeoproductivity was especially unstable during the Younger Dryas, reaching peak rates of 18.3 x 10³ µm³ cm⁻² yr⁻¹ at c. 12.3 cal kyr BP. Generalized additive models (GAM) to explore productivity-diversity relationships (PDR) during pre-defined climate periods, reveal complex relationships. Strongest statistical evidence for GAMs were found during the Younger Dryas, the Early Holocene and the Late Holocene, i.e. periods of rapid climate change. We account for these differences in terms of climate-mediated resource availability, and the ability of endemic diatom species in Lake Baikal to adapt to extreme forms of living in this unique ecosystem. Our analyses offer insight into how productivity—diversity relationships may develop in the

future under a warming climate. **Key words:** palaeoproductivity, abrupt climate change, palaeolimnology, Holocene, Late glacial, productivity—diversity relationship, generalized additive models, multivariate classification trees

classification trees

90 **1. Introduction**

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92 Understanding the role that biological diversity plays in ecosystem stability and function is an 93 important challenge in ecological research (Tilman et al. 1997; McCann 2000; Loreau et al. 94 2001; Isbell et al. 2015; Hagen et al. 2021). An ecosystem with higher biodiversity is 95 assumed to be more stable, due to a number of factors, including the presence of species 96 which have considerable plasticity, such that they have wide responses to disturbances 97 (McCann 2000; Luethje and Snyder 2021), and the "insurance effect" (Yachi and Loreau 98 1999) where species redundancy plays an important stabilizing role. Biodiversity loss can 99 lead to reduced ecosystem functioning (Cardinale et al. 2012), which poses serious threats to 100 ecosystem health in general, and human well-being in particular (e.g. Chivian 2003). While 101 the mechanisms behind how diversity controls functioning are not completely understood, 102 dominant species with distinct functional roles are important (Winfree et al. 2015). For 103 example, primary production, a key ecosystem function which helps regulate the global 104 carbon cycle, is tied to species diversity (Tilman et al. 1997; Cardinale et al. 2009; Tilman et 105 al. 2012). However, our understanding of productivity-diversity relationships (PDR) is 106 largely based on short-term observational (Dodson et al. 2000; Ptacnik et al. 2008; Korhonen 107 et al. 2011), experimental (McGrady-Steed et al. 1997; Interlandi & Kilham 2001; Winfree et 108 al. 2015) and modelling approaches (Aoki 2003), with very few long-term studies undertaken 109 (Rusak et al. 2004). This constitutes an important gap in our knowledge because in terms of 110 climate change, productivity-diversity relationships and resource use efficiency (Gross and 111 Cardinale 2007; Ptacnik et al. 2008) will be fundamentally different over long (e.g. climate 112 and landscape evolution) and short (e.g. pulse disturbances such as climate disturbance 113 events (Kéfi et al. 2019)) timescales.

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Palaeoecological approaches provide a potential solution to this challenge, since they can reveal ecological dynamics in response to environmental change which unfold only over very long timescales (National Research Council 2005; Seddon et al. 2014). For example, diatoms are some of the most important primary producers in lake ecosystems, and their subfossilised remains provide a record of community variations through time. In addition, because the species composition, biovolume and concentration of diatom valves can be directly measured on sediment sequences, there is a unique opportunity to investigate how community dynamics, diversity and the stability of ecosystem functions such as productivity

change over long-timescales. In particular, because the last 16,000 years have been punctuated by a series of large-scale and abrupt climatic shifts, such records open the door for an investigation into the links between biodiversity and the stability of ecosystem functioning associated with climate disturbance events. Here we investigate the relationship between diatom diversity and ecosystem functioning in Lake Baikal, an ancient lake with a long continuous record with evidence of only very recent human perturbation (Izmest'eva et al. 2016; Roberts et al. 2018) restricted to its coastline (Kravtsova et al. 2014; Timoshkin et al. 2016). We focus on aquatic productivity as a measure of ecosystem function, because of the direct link between diatoms and primary production in the modern lake (Kozhova and Izmest'eva 1998). As yet we do not assume to know the precise nature of the potential productivity–diversity relationships that may have occurred in Lake Baikal over such long timescales. We do know however, that local diversity will be influenced by a range of chemical, biological and physical factors such as nutrient availability, species interactions, and disturbance events such as rapid climate change. Our approach therefore is to explore productivity–diversity relationships over specific timescales independently determined from palaeoclimate studies. We might hypothesise for example, that productivity and diversity will co-vary linearly during rapid warming because increased energy results in increased metabolic rates in the system, but that this relationship might change during periods of relative climate stability. We investigate the range of possible response functions based on those identified by Smith (2007), whether they be negative or positive, whether they be humped or U-shaped, flat or just random (Smith 2007). One of the most relevant independent climate studies for this time period is by Tarasov et al. (2009), who modelled pollen-inferred palaeotemperature for neighbouring Lake Kotokel (Fig. 1) for the past 15,000 years. Their reconstructions indicate a period of rapid warming (during the Bølling–Allerød interstadial), rapid cooling (during the Younger Dryas stadial) and relative temperature stability of the Holocene in southern Siberia. However, given that the Holocene has recently been formally subdivided into three ages/subepochs (Walker et al. 2018), it is possible to compare productivity—diversity relationships during the Younger Dyras and the Bølling-Allerød, with the Greenlandian/Early, Northgrippian/Middle, and

Meghalayan/Late ages/subepochs of the Holocene (henceforth referred to as Early, Middle,

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- and Late Holocene). Our approach is to coax history to conduct experiments (Deevey 1969)
 in order to deepen our understanding of (very) long-term biodiversity–ecosystem functioning
 (Loreau 2001) through the exploration of relationships between diatom diversity and
 productivity, and to test hypotheses related to how rapid climate change may disrupt these
 relationships on sub-orbital timescales. We do this by:
 - reconstructing trends in diatom communities, diatom diversity and palaeoproductivity in Lake Baikal at a multidecadal resolution for the past c. 16,000 years.
 - hypothesizing that relationships between productivity—diversity will differ during periods of rapid climate change and periods of relative climate stability.

2. Methods

Study site

Lake Baikal is situated in southern Siberia at the forest – steppe ecotone (Fig. 1), and is the world's oldest, deepest, and most voluminous lake. The lake is a World Heritage Site, due to its diverse flora and fauna; it contains over 2,500 species of which over 75% are thought to be endemic (Galazii 1989). Its sediments have accumulated for over 25 million years, and decades of research have exploited this sedimentary record to reconstruct environmental change (Williams et al. 2001; Mackay 2007). Sedimentary cores were obtained in 2001 from the research vessel *Vereschagin*, from the Vydrino Shoulder (51.585° N, 104.855° E; water depth 675 m), an underwater high (between 500 – 800 m) off the south-eastern coast of Lake Baikal (Fig. 1). The Vydrino Shoulder was selected because it is an area of stable, finegrained sedimentation relatively undisturbed by tectonic activity and reworking (Charlet et al. 2005). The cores obtained included a 1.73 m trigger core (CON01–605–3a), a 10.45 m piston core (CON01–605–3), and a 2.50 m box core (CON01–605–5). These records were supplemented with a short gravity core taken from an ice platform in 2001 (CON01–105–6)

<u>Dating</u>

from the same region.

Radiocarbon dates for the Vydrino sequence were obtained by accelerated mass spectrometry (AMS) from pollen and spore concentrates (Piotrowska et al. 2004; Demske et al. 2005). The age model is based upon twelve AMS ¹⁴C pollen dates from the box core (CON01–605–5) (Piotrowska et al. 2004) and an additional five AMS ¹⁴C pollen dates from the piston core

190 (CON01–605–3) (Demske et al. 2005). Full details are given in Mackay et al. (2011). 191 Radiocarbon dates were calibrated using IntCal20 radiocarbon calibration curve (Reimer et 192 al., 2020), and age-depth modelling was done using 'Bacon2.2' (Blaauw & Christen, 2011). 193 No reservoir effect was applied to the calibration because the organic material used for 194 dating, i.e. pollen and spore concentrates, is assumed to be uncontaminated by old carbon. 195 196 Diatom analysis 197 Diatoms amount to between 50-90% of the phytoplankton biomass during spring bloom 198 under ice and after ice break-up (Popovskaya et al. 2015; Panizzo et al. 2017). Spring bloom contributes a significant proportion of overall annual primary productivity (Popovskaya 199 2000). With the onset of summer warming and surface water stratification, diatoms are 200 201 succeeded by non-siliceous autotrophic picoplankton and other green algae (Fietz et al. 2005; 202 Belykh et al. 2006). During autumn turnover, a smaller diatom bloom dominates primary 203 production. Nitrogen and phosphorus co-limit photic zone productivity in Lake Baikal (Satoh 204 et al. 2006; O'Donnell et al. 2017), with rates of deep-water nutrient supply increasing markedly since the mid 19th century (Swann et al. 2020). 205 206 207 Diatoms are siliceous, so they generally preserve well in sedimentary environments. We 208 prepared diatom samples for microscopy from sediments sampled every 5mm from the 209 composite sequence derived from the gravity / trigger / piston cores detailed above. Unlike 210 standard diatom preparation analyses (Battarbee et al. 2001), no chemical treatments were 211 needed, although we enabled diatom concentrations to be calculated through the addition of 212 divinylbenzene microspheres (Mackay et al. 1998). Diatom taxa were identified to species 213 level or lower using a range of Russian and other floras, detailed in Mackay et al. (1998). 214 With few exceptions, at least 300 valves from each sample were counted using oil immersion 215 phase-contrast light microscopy at x1000 magnification. Planktonic and tychoplanktonic 216 diatoms account for on average, c. 90 % of all diatoms counted, and here we detail diatom 217 compositional change for planktonic and tychoplanktonic species only, as these were used to 218 determine palaeoproductivity estimates below. The diatom taxonomical nomenclature was 219 updated according to the global online database AlgaeBase https://www.algaebase.org/. 220 221 Detrended correspondence analysis (DCA) and canonical correspondence analysis (CCA) 222 were used to investigate the total amount of turnover, variation, and compositional changes of 223 the diatom assemblages over time. The analyses were performed on Hellinger transformed

224	data to dampen the effects of highly abundant taxa (Legendre and Gallagher 2001).				
225	Multivariate classification tree (MCT) analyses was used to explore how much of the				
226	variation the different climatic periods identified above can be explained by the diatom				
227	assemblages. MCT is considered a powerful method when there is a non-linear relationship				
228	between response and explanatory variables, when there are missing values in the data, or				
229	there are higher level interactions between explanatory variables (Borcard et al. 2018). The				
230	minimum sized tree was chosen based on the 1se rule, which is the minimum sized tree when				
231	the cross-validated relative error (CVRE) is the minimum CVRE value plus 1 standard error				
232	(SE) of all the CVRE values (Borcard et al. 2018). The number of multiple cross-validations				
233	was set to 100, and the number of k groups was set to the number of rows in the dataset. The				
234	counts were normalized prior to the analysis and since MCT is in Euclidean space it				
235	transforms into the chord distances (sensu the original chord distances proposed by Orloci				
236	1967) between samples. Ordination analyses were done using the R package vegan and				
237	results plotted using ggvegan. The MCT was done using the R package mvpart.				
238	Stratigraphical profiles were constructed using C2 Data Analysis Version 1.7.7 (Juggins				
239	2014).				
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include benthic taxa because they represent a different habitat, far from the core location. Their persistent presence in the core (average 10 %) is caused by secondary transport processes rather than species competing for the same resources as the planktonic diatoms themselves. Hill's species numbers give easily interpretable numbers by maintaining the doubling effect, and provide information on three levels as to how rare and abundant taxa are weighted in each sample (Hill, 1973; Jost, 2010; Gotelli and Ellison, 2013; Chao et al., 2014). Species richness is estimated using Hill's NO, the expected number of taxa where rare and abundant taxa have similar weights. Species diversity is estimated using Hill's N1, which is the expected number of equally common taxa, with less weight on rare taxa, and N2, which provides the expected number of equally abundant taxa but puts weight on the numerically dominant taxa. The estimates are represented as the expected number of diatoms based on the smallest sample size (n = 150) to avoid biases related to different sample sizes. To take account of variable sediment accumulation rates (SAR), Hill's measures of richness and diversity were further divided by accumulation rates over time, so these measures become estimated Hill's numbers per cm² yr⁻¹. To detect variation in abundance changes over time (evenness) we also include the ratio of N2/N1 (Birks et al. 2018), i.e. the proportion of very abundant species to the number of common species identified. When the ratio is 1, it indicates that all taxa were equally abundant. The ratio is calculated based on the Hill's numbers after taking account of SAR.

<u>Palaeoproductivity – Diversity relationships</u>

Relationships between palaeoproductivity and *N*2 diversity were investigated during preidentified time–intervals (Tarasov et al. 2009; Walker et al. 2018) to test the hypothesis that PDR will differ during periods of rapid climate change and periods of relative climate stability. Defined climate periods are the pre– Bølling–Allerød (15.9–14.7 cal kyr BP), the Bølling–Allerød (14.7–12.9 cal kyr BP), the Younger Dryas (12.9–11.7 cal kyr BP), and the three recently designated sub-epochs of the Holocene (Early (11.7–8.2 cal kyr BP), Middle (8.2–4.2 cal kyr BP) and Late (4.2–0 cal kyr BP). We used generalized additive models (GAM) to explore PDR because we have no prior knowledge of the expected relationships, and the likelihood that the relationships were non-linear or showing different complex patterns within the different time periods. We used *N*2 diversity as the response variable and diatom BVAR as the explanatory variable. *N*2 is a continuous variable so we used a gamma distribution with a log link. Diatom BVAR as a variable was skewed so it was log transformed prior to the analyses, and climatic period was included as a factor variable that

allowed for different smooths for each period. The smooths were fitted using thin-plate regression splines, and the model was fitted using the restricted maximum likelihood approach. Prior to analyses, extreme outliers (BVAR_{log} µm³ cm⁻² yr⁻¹) < 6 were removed to reveal more clearly GAM relationships. This led to only 8 out of 521 samples being removed in total: three, two and one samples removed from the Late, Middle and Early Holocene subepochs respectively, and a further two from the pre–BA period. Models were then refitted.

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The model is specified as follows:

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$$\log([N2_{ij}]) = a_1 + f_1(Productivity_i, Period_i) + \varepsilon_i \quad N2_i \sim Gamma$$

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where i represents each sample, j is each climate period and a_1 is the intercept term for the periods. Since the data are time ordered, the data points may not be independent and we added a correlation term to the model attempting to reduce effects of potential temporal autocorrelation. However, adding different correlation structures did not improve the model or affect the residual variation, and we therefore removed them to keep the simplest model.

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3. Results

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Chronology

- The calibrated ages for our profile span the last 15.91 cal kyr BP (where kyr = thousands of years, BP = before present, i.e. 1950 CE (common era)) (Figure 2). Sediment accumulation
- rates ranged between 32–184 yr cm⁻¹ (mean 62 yr cm⁻¹).

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315 <u>Diatoms</u>

- The temporal resolution of species compositional change was c. 30 years for the past c.
- 317 16,000 years (Fig. 3). DCA axis 1 sample scores show a strong, largely unidirectional trend
- since the start of the Holocene. Turnover in the planktonic/tychoplanktonic assemblages over
- 319 the whole time period is 2.71 standard deviation units, reflecting the observation that several
- 320 species present during the early part of our record are also present during the latter part of our
- record. The total inertia (variation) measured by CCA is 1.82, and of this the constraining
- time variable explains 10.6% of the variation (eigenvalue = 0.193). The ratio of eigenvalues

323 of the constrained axis 1 over the unconstrained axis 2 is 1.29 indicating that the time 324 gradient is explaining an important component of the variation. 325 326 During the early stages of the pre–Bølling–Allerød period, NO and N2 values were initially 327 relatively high (Fig. 4), before declining as the tychoplanktonic Aulacoseira skvortzowii 328 dominated the assemblage (Fig. 3). Dominance by A. skvortzowii persists into the Bølling, 329 but is gradually reduced by increasing abundances of the planktonic Aulacoseira baicalensis 330 during the later Allerød. DCA axis 1 ordination scores show very little change during the 331 pre–Bølling–Allerød and Bølling–Allerød interstadial, indicative of a rather stable 332 assemblage, with few equally abundant species reflected in low evenness scores (N2/N1). 333 MCT is not able to discriminate well between diatom assemblages of the pre-Bølling-Allerød 334 and Bølling–Allerød interstadial (Fig. 5). 335 336 The Younger Dryas stadial is characterised by major changes in the diatom assemblage – 337 abundances of Aulacoseira (especially A. skvortzowii) decline, concomitant with a rapid 338 succession of *Ulnaria acus* and *Crateriportula inconspicua*, that bloom in spring and autumn 339 respectively (Fig. 3). These taxa give way to a short-lived peak in A. baicalensis dominance, 340 before A. skvortzowii once again asserts its dominance by the end of the Younger Dryas, 341 alongside notable increases in C. inconspicua and L. minuta, resulting in increasing richness 342 (N0) and diversity (N2) scores (Fig. 4). These changes are reflected in a rapid change in DCA 343 axis 1 scores at the start of the Younger Dryas, with discernible changes in the evenness ratio 344 indicative of increasing importance of different species. The Early Holocene is characterised 345 in the main by declining dominance of A. skvortzowii and increasing importance of autumn 346 blooming crops of C. inconspicua and Lindavia minuta. U. acus shows considerable 347 fluctuations, with *Hannaea baicalensis* and *Cyclostephanos dubius* increasing in importance 348 from c. 10 cal kyr BP, driving increases in diatom N2 diversity and evenness ratio. 349 350 Where the climatic periods are used as a supervised classification technique, MCT analysis 351 reveals the highest variation between the Early and the Middle Holocene subepochs (Fig. 5). 352 This transition also marks the time when the evenness ratio peaks, that then declines to 353 lowest values found in our study during the Middle and Late Holocene (Fig. 4). During the 354 Middle Holocene, several diatom species largely disappear from the stratigraphical record 355 including Stephanodiscus flabellatus, Stephanodiscus skabitchevskii, H. baicalensis, and C. 356 dubius, while C. inconspicua drops to low values for the remainder of the record (Fig. 3). In

their place, *U. acus* and *L. minuta* increase in importance. The loss and gain of species through the Middle Holocene has resulted in a relatively high but stable N2 diversity, with peak diversity occurring at the boundary between the Middle and Late Holocene, c. 4.2 cal kyr BP (Fig. 4). Despite relatively high abundances for the first time of *Stephanodiscus* parvus and Stephanodiscus meyerii, the Late Holocene sees L. minuta increasing to almost complete dominance of the diatom assemblage between 1.8–1.4 cal kyr BP, resulting in some of the lowest diatom diversity values for the study. During the most recent 500 years of our record, the assemblage is characterised by species commonly found in the modern-day lake communities, co-dominated by A. baicalensis, U. acus and L. minuta (Fig. 3). **Palaeoproductivity** Diatom biovolume accumulate rate (BVAR) data show that spring diatom crops have dominated palaeoproductivity for much of the past c. 16,000 years, apart from a short period during the late Holocene, 1.8–1.4 cal kyr BP, when autumnal diatom production increases to more than ten times that of spring production (Fig. 6). BVAR were substantially higher and more unstable during the Younger Dryas stadial than the warm periods before and after it (Fig. 6). Peak palaeoproductivity for the whole study (18.3 x 10³ µm³ cm⁻² yr⁻¹) was associated with successive peaks in *U. acus* then *A. baicalensis* at c. 12.3 cal kyr BP. BVAR then declined rapidly and remained relatively low for the remainder of the Younger Dryas and the start of the Holocene. Palaeoproductivity increased during the Early and Middle Holocene, before declining to lowest rates during the Late Holocene (mean, $1.3 \times 10^3 \, \mu m^3$ cm⁻² yr⁻¹). The shapes of the productivity—diversity relationships differ among the pre-defined climate periods, with some being negative (e.g. the Younger Dryas and the Middle Holocene periods), positive (e.g. the pre-BA and the Early Holocene periods), and others more complex such as the Late Holocene, dependent on palaeoproductivity rates (Fig. 7). The relationship between palaeoproductivity and diversity during the Bølling-Allerød was flat (Smith 2007). GAMs with very low p-values suggest that we have higher confidence that PDR relationships existed during the Younger Dryas, the Early Holocene, and the Late Holocene in comparison to the other time periods (Table 1).

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4. Discussion

Over the past 16,000 years diatom trends in Lake Baikal have been dynamic, with decadal shifts in species dominance punctuating millennial-scale trends in seasonal communities. MCT analyses show that the main split in diatom composition occurs between assemblages associated with the Last Glacial – Interglacial Transition (LGIT; 16–8.2 cal kyr BP), and the Middle– Late– Holocene subepochs (8.2 cal kyr–present) (Fig. 5). This suggests that trends in community shifts in diatoms in Lake Baikal broadly reflect climatic changes associated with the demise of Northern Hemisphere ice sheets as the planet transgressed from glacial to interglacial environments (Denton et al. 2010). Here we focus on interpreting trends in diatom communities and diversity through time, before focussing on how productivity–diversity relationships (PDR) vary over long-timescales, including during periods of rapid climate change and periods of relative climate stability.

4.1 Last Glacial – Interglacial Transition

Due to high obliquity (Fig. 8j), the LGIT in the Lake Baikal region was intensely seasonal, resulting in very cold winters but relatively warm, moist summers (Bush, 2005). Cold winters during the late glacial resulted in substantially longer annual ice cover on Lake Baikal of up to 8-9 months, reduced hydrological input by as much as 40 % than the modern day, and restricted inputs of key nutrients such as P, N and Si (Shimaraev & Mizandrontsev 2006). Up to the Bølling-Allerød, diatom assemblages were dominated by spores of the endemic Aulacoseira skvortzowii (Fig. 3). A. skvortzowii is tychoplanktonic, having evolved a life cycle which utilizes both pelagic and littoral habitats; viable spores remain in littoral sediments down to a depth of 25 m, where they can be resuspended by strong autumn storms back into the pelagic zone (Jewson et al., 2008) in time to bloom the following spring. A. skvortzowii grows best in water temperatures below 5 °C, and to avoid lethal increasing surface water temperatures, spore formation is triggered after ice break-up when phosphate concentrations fall below a threshold level of 15–23 µg L⁻¹ (Jewson et al., 2008). Declining phosphate concentrations are caused by P uptake by other algae (e.g. green algae and picoplankton) as surface waters start of stratify. Pigment analyses have shown that green algae were abundant at this time in the south basin of Lake Baikal (Tani et al. 2002; Soma et al. 2007). Relatively low N2 plankton diversity and evenness values during much of the late

423 glacial likely reflect P and Si limitation, resulting from overall lower nutrient concentrations 424 due to colder climate (Shimaraev & Mizandrontsev 2006) but possibly also competition from 425 other algae. 426 427 The major shift to warmer temperatures during the LGIT occurred with the onset of the 428 Bølling–Allerød interstadial, c. 14.7 cal kyr BP, linked to heat release from warm waters 429 deep in the North Atlantic ocean (Thiagarajan et al. 2014) which led to the resumption of the 430 Atlantic meridional overturning circulation (AMOC) (McManus et al. 2004) (Fig. 8g). Mean 431 pollen-inferred temperatures of the warmest month from neighbouring Lake Kotokel 432 however (Fig. 8b), reveal a 5 °C increase only during the latter stages of the Bølling-Allerød (Tarasov et al. 2009). At the same time, pollen-inferred mean annual precipitation records 433 434 show that rainfall increased from c. 300 mm yr⁻¹ to c. 460 mm yr⁻¹ (Fig. 8c). This warmer, 435 wetter Allerød led to extensive melting of glaciers along the shores of Lake Baikal (Horiuchi 436 et al. 2004; Osipov and Khlystov 2010), major expansion of boreal vegetation (Tarasov et al. 437 2009; Bezrukova et al. 2010; Reshetova et al. 2013), reduced ice duration on the lake and 438 increased nutrient transport (Shimaraev & Mizandrontsev 2006). The impacts on diatom 439 communities however were subtle, with diatom composition between the pre-Bølling-440 Allerød and Bølling–Allerød not distinguishable through MCT analyses (Fig. 5). Diversity 441 and evenness show little variability, although relative abundances of a few species show 442 distinct changes. For example, the heavily silicified endemic Aulacoseira baicalensis will 443 have benefited from increased Si availability (Jewson et al. 2010) while the endemic 444 Stephanodiscus flabellatus may have benefited from elevated concentrations of phosphorus 445 (Bradbury et al. 1994). The observed decline in A. skvortzowii spore formation may also be 446 attributable to general increased P availability in the south basin (Jewson et al. 2008). 447 The Younger Dryas stadial (12.9 – 11.7 cal kyr BP), is probably the most studied climate 448 449 disturbance event of the late Quaternary (Broecker et al. 2010). It was caused by an influx of 450 freshwater from Lake Agassiz into the Arctic Ocean (Tarasov & Peltier 2005; Murton et al. 451 2010) which led to the decline in AMOC (Fig. 8g) (Bond et al. 2001; McManus et al. 2004), 452 and concomitant cooler temperatures across the Northern Hemisphere (Stuiver et al. 1995) 453 (Fig. 8h). Increased GISP2 K⁺ concentrations (Fig. 8f) indicate that the Siberian High 454 intensified at the start of the Younger Dryas (Mayewski et al. 1997), which accounts for both 455 an attenuated Asian summer monsoon (Fig. 8e) (Dykoski et al. 2005) and cooler and more

456 arid climate conditions in the Lake Baikal region (Tarasov et al. 2009) (Fig. 8 b, c). These 457 cooler, more arid conditions led to a decline in hydrological input into Lake Baikal itself 458 Mackay et al. 2011), and a short-lived expansion of the tundra biome (Tarasov et al. 2009; 459 Bezrukova et al. 2010). 460 461 Diatom responses to climate change within the Younger Dryas were instantaneous but 462 complex, kick-started by the first appearance and rapid growth of *Ulnaria acus* (Fig. 3) 463 (indicative of higher dissolved silica concentrations in the water column (Bradbury et al. 464 1994)), and increasing abundance of *C. inconspicua*. However, the decline in *N*2 diversity 465 only from c. 12.6 cal kyr BP (Fig. 4), suggests that resources for diatom growth were not 466 initially limiting. Occupying different seasonal niches, spring blooming U. acus and 467 autumnal blooming C. inconspicua (Ryves et al. 2003) are unlikely to be directly competing 468 for the same resources, in part because small centric diatoms do not utilise a lot of silica 469 (Bradbury et al. 1994). Having several co-dominant species is reflected in the relatively high 470 evenness scores for the Younger Dryas (Fig. 4), related to few resources being limiting 471 (Interlandi & Kilham 2001). 472 473 The decline in N2 diversity is linked to peak values for A. baicalensis (Fig. 3), competing 474 directly with *U. acus* for dissolved silica. Diatom population changes in Lake Baikal play an 475 important role in controlling availability of silicic acid for other species (Callender & Granina 476 1995; Jewson et al., 2010; Shimaraev and Domysheva, 2013; Jewson et al., 2015). In 477 particular, when populations of A. baicalensis are very high, the availability of silicic acid 478 uptake for other species declines, leading to a drop in their populations (Jewson et al., 2010; 479 2015). Being a heavily silicified species, A. baicalensis needs a strong period of mixing 480 (Huisman et al. 2004), which suggests that when abundant, turnover is strong, allowing the 481 recycling of nutrients needed for peak palaeoproductivity (Fig. 6). Our diatom records 482 demonstrate that species specially adapted to grow under the ice of Lake Baikal (Bondarenko 483 et al. 2012) have flourished alongside autumnal blooming species during this cold stadial, 484 with, initially at least, few limiting resources. 485 486 The latter stages of the Younger Dryas are characterised by a marked increase in diatom 487 richness and diversity associated with both increases in spring and autumn diatoms, and a 488 rapid decline in palaeoproductivity. Given that regional temperatures remain low and 489 unchanged at this time (Demske et al. 2009), internal dynamics in the lake may be driving

observed changes in diatom communities, mediating resource availability. Contemporary monitoring studies have shown that populations of *A. baicalensis* can undergo dramatic changes in population size linked to complex interactions including silica availability (Izmest'eva et al. 2006); after populations peak, cells are transported to the bottom sediments, taking with them silica that then becomes unavailable for new diatom growth (Jewson and Granin 2015). But autumnal diatoms are still able to grow, as nutrients including Si become available once more during autumnal turnover.

As detailed above, MCT analyses is unable to distinguish Younger Dryas and Early Holocene diatom communities (Fig. 5), two time periods characterised by significant millennial scale variability (Bond et al., 2001; Fisher *et al.*, 2002; Mayewski et al. 2004; Nesje et al. 2005; Wanner et al. 2014). Overall, the diatom flora is characterised by persistent spring-blooming species that need lots of Si, but also increasing abundance of autumnal blooming diatoms. A decline in species richness and diversity at the start of the Early Holocene may be indicative of fewer resources (Interlandi & Kilham 2001), coincident at least with the widely expressed cool Preboreal Oscillation (Fisher et al. 2002) and lower river flow into Baikal's south basin (Mackay et al. 2011). After c. 11.3 cal kyr BP diatom diversity and evenness increase for the next few thousand years, indicative of increasingly abundant resources, linked to regional warmer and wetter climates (Tarasov et al. 2009), and generally stronger seasonality. Co—limitation by several nutrients and light allow for greater numbers of planktonic species to co-exist (Burson et al. 2018), leading to highest evenness scores at the Early / Middle Holocene boundary.

4.2 Middle – Late Holocene

Northern Hemisphere cooling, especially from c. 5 cal kyr BP, is linked to declining summer insolation (Marcott et al. 2013) in conjunction with vegetation and snow/ice feedbacks on Earth's surface albedo. This cooling culminated in the neoglacial, which in central Asia resulted in increased aridity (Ganopolski et al. 1998) expressed in the Lake Baikal region as declining mean annual precipitation (Tarasov et al. 2009). The neoglacial also resulted in increased Siberian permafrost formation (Anisimov et al. 2002). Within Lake Baikal, we document a shift from spring to autumnal diatom communities that started during the Early Holocene, concomitant with the first decline in insolation, but then continues to get stronger during the Middle and Late Holocene as both precession and obliquity decline (Fig. 8). The

slow unfolding of an increasingly important autumnal diatom community has relatively little impact on palaeoproductivity during much of the Holocene, although autumnal production after 10 cal kyr BP is slightly higher than it was before 10 cal kyr BP, and continues to proportionally increase especially during the Late Holocene. This long-term change in diversity and palaeoproductivity likely represents an orbitally-driven ecosystem response to long-term climate change, possibly linked to changes in seasonality and its impact on, for example, ice cover dynamics and length of summer stratification on the lake. L. minuta is currently the only pelagic diatom to bloom during the autumn in Lake Baikal in substantial numbers (although it can also grow in smaller numbers during spring turnover). Because L. minuta can tolerate surface water temperatures up to 11 °C, cells persist higher in the surface waters for longer during summer stratification, so that when stratification breaks down in the autumn and nutrients are regenerated, cells of L. minuta are retrained into the photic zone first, giving them a strong competitive advantage, leading to their dominance during autumn turnover (Jewson et al., 2015). Winter ice cover is a major force driving interseasonal connections in lakes that freeze over every year (Sommer et al. 2012; O'Reilly et al. 2015; Hampton et al. 2017), and Lake Baikal is no exception. The gradual decline in proportion of spring diatoms may have resulted in increased resource availability for other diatoms (Interlandi & Kilham 2001; Jewson et al., 2010; 2015). For example, monitoring studies have shown large autumnal populations of L. minuta during the 1950s CE when spring populations of A. baicalensis were very low (Antipova & Kozhov in Kozhov 1963). The build-up to peak dominance in L. minuta during the Late Holocene is accompanied by the successive decline in spring blooming species, starting with *U. acus* followed by *A.* baicalensis, species that both rely on availability of dissolved silica (Jewson et al. 2010) and under-ice turbulence to remain in the photic zone (Granin et al. 2000). These shifts are reflected in rapidly declining N2 diversity scores since their peak at the Middle / Late Holocene boundary to their lowest values for the Holocene (Fig. 4). This decline is also coincident with a major shift in carbon dynamics in Lake Baikal, linked to increasing regional cooling and aridity (Mackay et al. 2017). The almost monospecific Late Holocene assemblage of L. minuta and resultant low N2 diatom diversity in the lake is concurrent with the Dark Ages Cold Period (DCAP) (1.8–1.4 cal kyr BP; CE 400–765) (Helama et al. 2017), a climatically cool period, linked to changes in ocean circulation (Bond et al. 2001), and solar

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and volcanic activity (Helama et al. 2017). The near complete disappearance of A. baicalensis makes this period unique in our Lake Baikal record. However, we are not yet able to say conclusively why growth of A. baicalensis was so inhibited during the DCAP, leading to the dominance of *L. minuta* for several centuries. This period almost certainly represents an ecosystem response to abrupt extrinsic change occurring elsewhere in the northern hemisphere, super-imposed on longer-term changes in orbital parameters (Williams et al. 2011). It is possible that the smaller biovolume of L. minuta in comparison to A. baicalensis and *U. acus*, may have conferred it a competitive advantage as resources became increasingly limited (Burson et al. 2018). Alternatively, persistent deeper snow cover on the frozen lake could have acted to reduce light penetration through the ice, (i.e. light as a resource is severely limited) resulting in a decline in sub-surface turbulence and loss of spring diatom crops to deeper waters (Granin et al., 2000). It is possible that these responses are linked to orbitally driven seasonal changes such as cooler summers (Fig. 8). It's notable that the ecosystem function of primary production did not decline overall during this period, just the timing of peak production, with autumnal palaeoproductivity far exceeding spring productivity for the only time in our record during the DCAP (Fig. 6).

4.3 Palaeoproductivity–diversity relationships

Productivity—diversity relationships (PDR) in aquatic ecosystems are complex (Aoki 2003; Smith 2007), while also being scale (Chase and Leibold 2002; Korhonen et al. 2011) and time (Rusak et al. 2004) dependent. Our initial hypotheses set out to test if these relationships differ between periods of relative climate stability and periods of rapid climate change. This is borne out, as the shapes of the relationships are very different across the different climate periods (Fig. 7). The strongest evidence for GAMs (with lowest *p* values; (Table 1)) were found during both the Younger Dryas and Early Holocene, periods punctuated by pervasive millennial-scale variability, and the Late Holocene period, characterised by cold events linked to overlapping drivers such as solar minima and volcanic eruptions (Helama et al. 2017), amplified by centennial-scale oceanic variability (Renssen et al. 2006). PDR were different during each of the pre—Bølling—Allerød, the Bølling—Allerød and the Middle Holocene periods, but statistical support for GAMs were much weaker during these periods of relative climate stability (Table 1). During the Bølling—Allerød the PDR is effectively flat (sensu Smith 2007), because *N*2 diversity is restricted to very low values and changes little across the magnitude of the productivity gradient, perhaps due to as yet few available

591 resources for several species to co-exist. During the Middle Holocene, N2 diversity values are 592 again more restricted than during either the Early or Late Holocene periods, N2 are rarely low 593 (Fig. 7), likely linked to optimal resource availability allowing several species to co-exist 594 (Burson et al. 2018) at similar abundances (Fig. 4) during both spring and autumn (Fig. 3). 595 596 The negative PDR during the Younger Dryas likely reflects a complex set of processes linked 597 to both ecosystem responses to abrupt cooling (e.g. increased ice duration but stronger 598 overturn in the lake (Shimaraev & Mizandrontsev 2006), and a reduction in resource 599 heterogeneity due to severe limitation by a few or even single resource (Interlandi & Kilham 600 2001). Productivity in Lake Baikal is dependent on a sustained supply of nutrients from 601 deeper waters to the photic zone, stimulated by shifting wind dynamics and enhanced deep 602 ventilation (Swann et al. 2020). While increased supply of Si ensured initial resources for 603 Ulnaria and Aulacoseira growth, Si will ultimately have become unavailable to most other 604 diatoms, due to massive increases in the abundances of A. baicalensis (Fig. 3) (Jewson et al., 605 2010; 2015), leading to declines in diversity while productivity peaked. During the Early 606 Holocene however, there is a positive PDR, especially when palaeoproductivity levels are 607 initially lower. We suggest that rapid melting of glaciers and increased fluvial input (Osipov 608 and Khlystov 2010), and opening up of new habitats as ice-cover duration on the lake 609 declined, contributed to an increased supply of nutrients and habitat availability, such that 610 both diversity and productivity were able to increase from the very low values at the start of 611 the Holocene period. It's notable that during the Early Holocene the ratio of autumnal to 612 spring species increases markedly, indicative of autumnal overturn niches opening up, 613 allowing increased growth of *C. inconspicua* and *L. minuta* (Fig. 3). 614 615 During the Late Holocene however, a negative PDR is apparent only when 616 palaeoproductivity is very low at the transition between the Middle and Late Holocene 617 periods (Fig. 7). Low palaeoproductivity at c. 4.2 cal kyr may be linked to a period of 618 regional cooling and aridity (Mackay et al. 2017) concurrent with weaker Asian summer 619 monsoons (Dixit et al. 2014). It is at this time that new *Stephanodiscus* species become 620 established in the lake (S. meyeri and S. parvus) alongside existing diatom communities, 621 hence higher N2 diversity. Stephanodiscus species tend to reflect higher phosphorus than 622 silicon loading rates (Kilham et al. 1986), and may be a community response to cooler, more 623 arid climate (Bradbury et al. 1994) as experienced during the Late Holocene neoglacial. 624 However for the majority of the Late Holocene there is little relationship between

palaeoproductivity and diversity, indicative of abundant resources allowing for many planktonic species to co-exist.

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4.4 Comparisons to other studies within Lake Baikal

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It has long been recognised that Quaternary biogenic silica and diatom concentrations in Lake Baikal sediments mirror changes in insolation (Khursevich et al. 2001), such that very low concentrations characterise glacial periods, likely due to a number of factors including lower productivity and higher rates of diatom dissolution, as well as dilution due to increased inputs of clastic material (Mackay 2007). The Vydrino LGIT record has an almost identical diatom assemblage to those identified for the same time period in long cores extracted from elsewhere in the lake, including both the Posolskaya Bank (BDP-99) and Academician Ridge (BDP-96-2) (Khursevich et al. 2005) (Fig. 1). In another study of Quaternary Lake Baikal diatoms, this time from the Buguldieka Saddle (Fig. 1), Edlund (2006) found that although earlier glaciations also contained few diatoms, the 'Sartan glaciation', i.e. Marine Isotope Stage 2, still contained at least 10 species of planktonic diatoms, and an assemblage again very similar to our Vydrino sequence. Bradbury et al. (1994) produced a similar but much lower resolution record for diatom changes spanning the past 15,000 years from station 305 off the southern margins of the Selenga Delta (Fig. 1), where both the assemblage and sequence of diatoms are similar to Vydrino. However, while observations and conclusions drawn in this study related to PDR are likely applicable to other regions of this vast lake, one of the reasons why Lake Baikal contains a diverse endemic diatom flora is down to its size and heterogeneity of habitats (Jewson et al. 2015). Thus while species declines may be evident in one region, those same species may well persist in other regions of the lake.

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Conclusions

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This study provides important insights into our understanding of productivity—diversity relationships (PDR) in aquatic ecosystems. We show that diatom communities and palaeoproductivity are sensitive to extrinsic drivers of climate change. These drivers operate at different time scales, from abrupt events during the Younger Dryas resulting in (negative) coupling between palaeoproductivity and diversity, to slower changes in boreal insolation and seasonality, leading to varied PDR relationships. These differences are likely related to resource availability and limitation (or not) of specific nutrients, linked to climate and surface

659 water overturn. We therefore provide important perspective to complement existing shortterm observational (Dodson et al. 2000) and experimental (Winfree et al. 2015) approaches. 660 PDR in aquatic systems should not be expected to occur in one direction (Smith 2007), but 661 are very much dependent on other factors such as external disturbances, resource availability, 662 species interactions and abiotic constraints on ecosystem function. Even given the sheer 663 664 volume of Lake Baikal, diatom responses to abrupt events can be almost instantaneous, 665 showing how tightly coupled ecology and climate have been in the past. 666 667 Over sub-orbital timescales, our records suggest that ecosystem function in Lake Baikal is 668 rather resilient to natural disturbance. Following the concept of operation criteria as defined 669 by Jovanovska et al. (2016), after disturbance or "press" events like the Younger Dryas, 670 diatom communities and palaeoproductivity return to pre-disturbance states. Moreover, rather 671 than leading to the demise of certain species, new species are actually ushered into the palaeo 672 record, likely due to increased resources (Fig. 3). And even when a regime shift looks 673 possible with respect to the increasing dominance of an autumnal flora as the Holocene 674 unfolded, in the past 1000 years a spring-dominated flora has returned. These observations 675 may hold insights into observed diversity changes occurring in recent decades, linked to 676 global warming (Roberts et al., 2018). However, what our record cannot provide information 677 on is the resilience of the lake's flora to multiple stressors such as human driven climate 678 change and anthropogenic nutrient enrichment, which is currently impacting the lake's 679 littoral communities. 680 681 **Author Contributions:** 682 Study was conceived by AWM and PR. Diatom counting was undertaken by DWM. Age 683 modelling was done by NP. Data analyses was undertaken by VAF, AWRS and AWM. 684 AWM led the paper writing with significant contributions from AWRS and GEAS. All 685 authors made comments on earlier drafts of the paper. 686 687 688 **Acknowledgements:** 689 We wish to acknowledge the various agencies who helped to fund this work, especially the 690 EU FPV programme (EVK2-CT-2000-0057), UK NERC (NE/J010227/1), and the 691 Norwegian Research Council (IGNEX ref: 249894/F20). We thank UCL Geography 692 Cartography Unit who helped prepare the figures. And we especially thank the three

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Table 1: GAMs to investigate PDR trends during pre-defined climate periods. edf = effective degrees of freedom, and ref.df = reference degrees of freedom. The goodness-of-fit statistics show the adjusted r^2 = 0.462 and the deviance explained is 53.2 %.

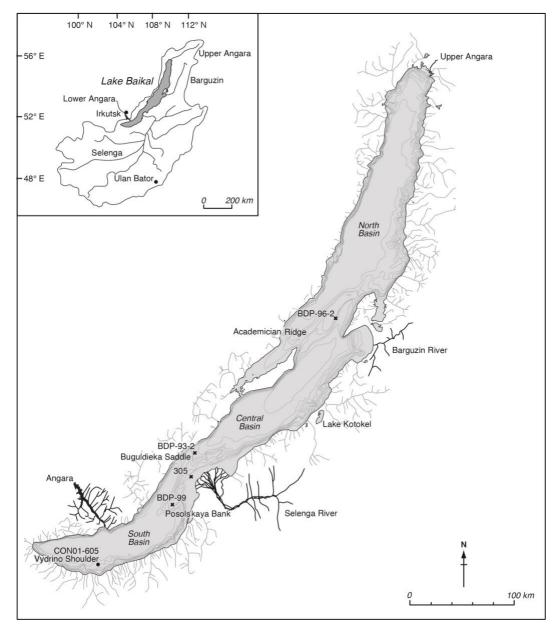
Climate period	edf	ref.df	F	<i>p</i> –value
Late Holocene	3.719	4.481	5.242	0.0002 ***
Middle Holocene	1.001	1.002	6.672	0.0100 *
Early Holocene	2.291	2.916	7.183	0.0001 ***
Younger Dryas	1.001	1.001	20.168	9.18e-06 ***
Bølling–Allerød	1.105	1.203	0.652	0.4030
pre-BA	2.562	3.167	2.760	0.0443 *

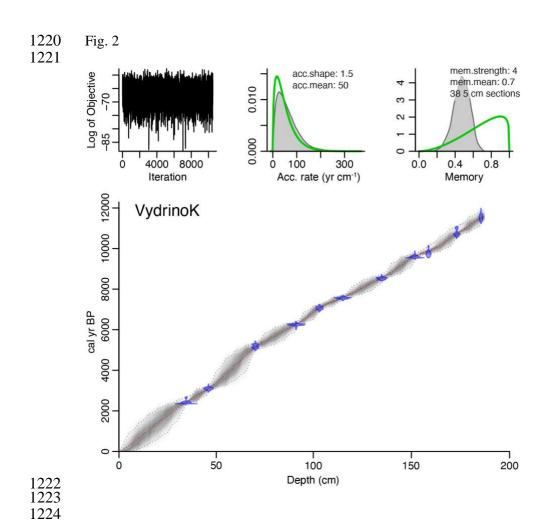
Significance codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1

1159 1160 **Figure Legends:** 1161 1162 Fig. 1: Map of Lake Baikal and its catchment, with locations of the different cores used or mentioned 1163 in this paper, including the coring location on the Vydrino Shoulder, where our study was undertaken. 1164 Also shown is Lake Kotokel that has provided independent climate reconstructions used in this study 1165 (Tarasov et al. 2009). 1166 1167 Fig. 2: 'Bacon' Age-depth model (Blaauw & Christen, 2011) for Vydrino box (CON01-605-05) and 1168 piston cores (CON01-605-03) of radiocarbon AMS dates calibrated using IntCal20 radiocarbon 1169 calibration curve (Reimer et al., 2020). 1170 1171 Fig. 3: Relative abundances of sub-fossil planktonic and tychoplanktonic diatoms spanning the past c. 1172 16,000 years from Vydrino Shoulder. Diatoms which grow mainly before summer stratification are 1173 shown in blue, while those that mainly grow after summer stratification are shown in green. DCA axis 1174 1 sample scores summarize the major trend in species turnover. 1175 1176 Fig. 4: Comparison of Hill's richness (N0), diversity (N1 and N2) and evenness (N2/N1 ratio) trends 1177 over the past c. 16,000 years. Richness and diversity values were further divided by sediment 1178 accumulation rates over time, so these measures become estimated Hill's numbers per cm⁻² yr⁻¹ 1179 1180 Fig. 5: Multivariate classification tree (MCT) for Lake Baikal planktonic and tychoplanktonic diatoms 1181 over the past c. 16,000 years. Time periods used in multivariate classification tree analyses are: the 1182 pre Bølling-Allerød (pre-BA), the Bølling-Allerød (B-A) interstadial, the Younger Dryas stadial and 1183 the three recently ratified Early, Middle and Late Holocene subepochs (Walker et al. 2018). The 1184 histograms show the transformed abundances of the discriminating taxa within each leaf. These are 1185 listed in decreasing order. The numbers under the histograms represent the relative error within each 1186 leaf, and n =the total number of samples. At the bottom is the summary of the residual error (RE), 1187 cross-validated error (CVRE), and standard error (SE). The r^2 will be 1-RE. 1188 1189 Fig. 6: Stratigraphical profile showing trends in palaeoproductivity over the past c. 16,000 years: the 1190 proportion of diatoms that bloom in the autumn versus those that bloom in the spring; estimates of 1191 palaeoproductivity derived from spring (orange) and autumn (dark brown) diatom biovolume 1192 accumulate rates (BVAR µm³ cm⁻² yr⁻¹); and log-transformed ratio of autumnal / spring 1193 palaeoproductivity.

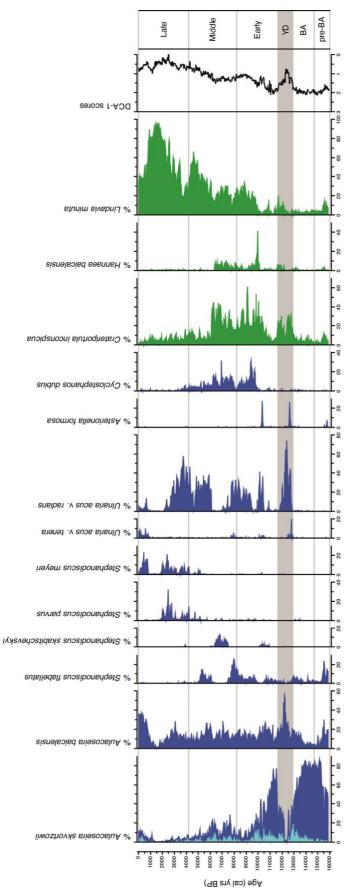
1195 Fig. 7: Palaeoproductivity-diversity relationships explored using generalized additive models 1196 (GAMs) that allow different smooths for the pre-defined climatic periods: pre Bølling-Allerød, 1197 (Bølling-Allerød), Younger Dryas, Early Holocene, Middle Holocene, and Late Holocene. The dots 1198 represent the data points, the thick line is the fitted GAM response for each period, and the shaded 1199 areas represent the 95 % confidence intervals around the mean fitted response. 1200 1201 Fig. 8: Multi-archive data plotted alongside (a) DCA axis 1 sample scores of Lake Baikal diatoms, as 1202 a measure of turnover over the past c. 16,000 years; (b) mean pollen-inferred annual precipitation 1203 from Lake Kotokel, with smooth line representing the mean 3-point moving average (Tarasov et al. 1204 2009); (c) mean pollen-inferred temperature of the warmest month from Lake Kotokel, with smooth 1205 line representing the mean 3-point moving average (Tarasov et al. 2009); (d) mean Northern 1206 Hemisphere temperature stack records for 60° latitude bands (30° N – 90° N; Marcott et al. 2013); (e) 1207 δ¹⁸O values of Dongge Cave stalagmite D4 (Dykoski et al. 2005); (f) K⁺ ion concentrations (ppb) from GISP2 D core (Mayewski et al. 1997); (g) North Atlantic core GGC5 ²³¹Pa/²³⁰Th meridional 1208 1209 circulation data; (h) δ¹⁸O values of NGRIP ice core (Rasmussen et al. 2006); (i) June insolation 60° N 1210 (W m⁻²; Berger & Loutre, 1991); (j) obliquity (ε). 1211

1213 Fig. 1





1227 Fig. 3



1231 Fig. 4

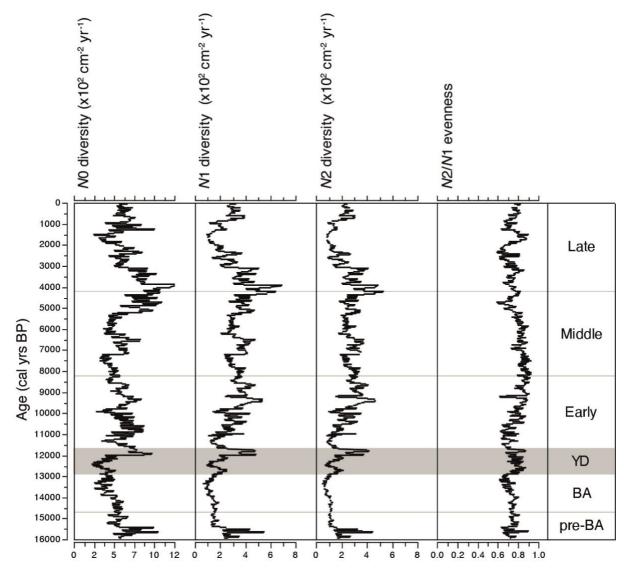
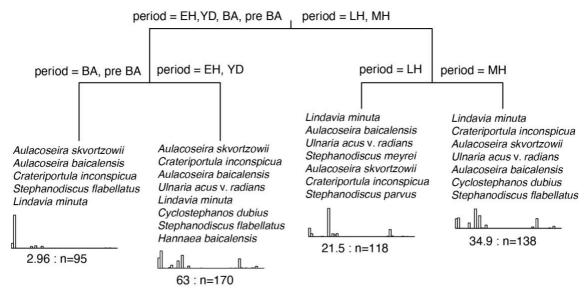
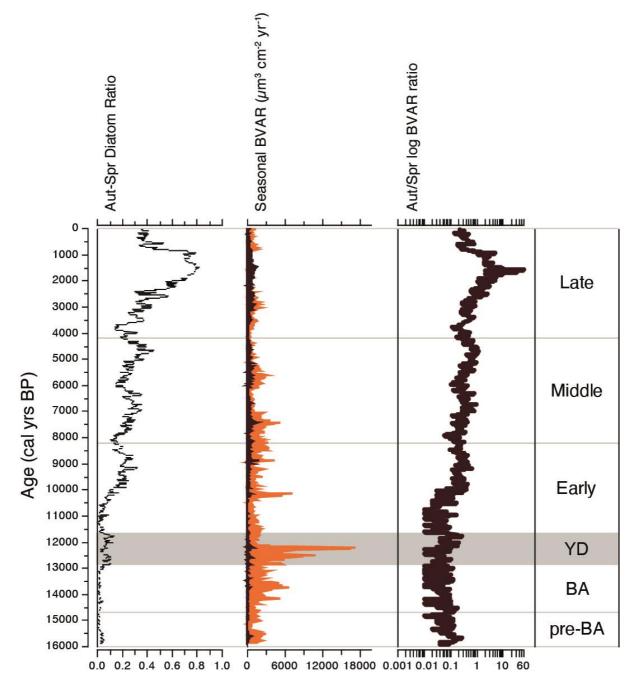


Fig. 5



Error: 0.525 CV Error: 0.533 SE: 0.0183

1243 Fig. 6



1249 Fig. 7

