1 Anoxia decreases the magnitude of the carbon, nitrogen, and phosphorus sink in freshwaters

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30   **Running title**: Anoxia disrupts freshwater C, N, and P cycles

35

36   **Abstract**

37   Oxygen availability is decreasing in many lakes and reservoirs worldwide, raising the urgency

38   for understanding how anoxia (low oxygen) affects coupled biogeochemical cycling, which has

39   major implications for water quality, food webs, and ecosystem functioning. Although the

40   increasing magnitude and prevalence of anoxia has been documented in freshwaters globally, the

41   challenges of disentangling oxygen and temperature responses have hindered assessment of

42   the effects of anoxia on carbon, nitrogen, and phosphorus concentrations, stoichiometry

43   (chemical ratios), and retention in freshwaters. The consequences of anoxia are likely severe and

44   may be irreversible, necessitating ecosystem-scale experimental investigation of decreasing

45   freshwater oxygen availability. To address this gap, we devised and conducted REDOX (the

46   Reservoir Ecosystem Dynamic Oxygenation eXperiment), an unprecedented, seven-year

experiment in which we manipulated and modeled bottom-water (hypolimnetic) oxygen

availability at the whole-ecosystem scale in a eutrophic reservoir. Seven years of data reveal that

anoxia significantly increased hypolimnetic carbon, nitrogen, and phosphorus concentrations and

altered elemental stoichiometry by factors of 2-5× relative to oxic periods. Importantly,

prolonged summer anoxia increased nitrogen export from the reservoir by six-fold and changed

the reservoir from a net sink to a net source of phosphorus and organic carbon downstream.

While low oxygen in freshwaters is thought of as a response to land use and climate change,

results from REDOX demonstrate that low oxygen can also be a *driver* of major changes to

freshwater biogeochemical cycling, which may serve as an intensifying feedback that increases

anoxia in downstream waterbodies. Consequently, as climate and land use change continue to

increase the prevalence of anoxia in lakes and reservoirs globally, it is likely that anoxia will

have major effects on freshwater carbon, nitrogen, and phosphorus budgets as well as water

quality and ecosystem functioning.

Introduction

Oxygen concentrations in lakes and reservoirs around the world are decreasing, which

has the potential to substantially alter freshwater ecosystem functioning and water quality. As a

result of climate and land use change, low oxygen availability (anoxia) is becoming more

common in the hypolimnion, or bottom waters, of many lakes and reservoirs (Jenny et al. 2016a,

Jane et al. 2021, Woolway et al. 2021). An increase in both the occurrence and duration of

70   hypolimnetic anoxia in freshwaters is likely to substantially alter the cycles of carbon (C),

71   nitrogen (N), and phosphorus (P), three fundamental elements that determine freshwater food

72   web structure, water quality, and ecosystem functioning (Sterner and Elser 2002, Kortelainen et

73   al. 2013). In particular, anoxia could disrupt the critical role of freshwater ecosystems as C, N,

74   and P sinks in global biogeochemical cycles. Freshwaters retain 72% of the organic C, 56% of

75   the total N, and 56% of the total P exported from land via sediment burial or release to the

76   atmosphere, preventing these elements from being transported to downstream freshwater

77   ecosystems or the oceans (Maranger et al. 2018). Altogether, the consequences of anoxia for C,

78   N, and P concentrations, stoichiometry (chemical ratios), and retention in freshwaters are likely

79   severe and may be irreversible (Nürnberg 1988, Søndergaard et al. 2003, Brothers et al. 2014,

80   North et al. 2014), necessitating ecosystem-scale investigation of how hypolimnetic anoxia

81   affects freshwaters.

82   Biogeochemical cycles of dissolved and total C, N, and P will likely respond differently

83   to hypolimnetic anoxia (Fig. 1). In the bottom waters of lakes and reservoirs, we expect

84   dissolved organic C (DOC) concentrations to be higher in anoxic than oxic conditions, as DOC is

85   mineralized much more efficiently by oxygen than by alternate terminal electron acceptors

86   (Walker and Snodgrass 1986, Beutel 2003). Moreover, anoxia has been shown to stimulate the

87   release of DOC from sediments to the water column (Fig. 1; Brothers et al. 2014, Peter et al.

88   2017), as well as increase hypolimnetic methane concentrations and subsequent greenhouse gas

89   emissions (Bartosiewicz et al. 2019, Vachon et al. 2019, Hounshell et al. 2021). DOC generally

90   dominates the total OC (TOC) pool in lakes (Toming et al. 2020), thus we would expect TOC to

91   exhibit similar responses as DOC to anoxia. For hypolimnetic dissolved inorganic nitrogen

92   (DIN), ammonium (NH_4^+) concentrations would be expected to be higher in anoxic conditions

93   due to ammonification and release from sediments (Fig. 1; Rysgaard et al. 1994, Beutel et al.

94   2006). In contrast, nitrate (NO_3^-) would be lower in anoxic than oxic conditions, as

95   denitrification decreases NO_3^- in the absence of oxygen while nitrification increases NO_3^- in the

96   presence of oxygen (Fig. 1; Sharma and Ahlert 1977, Downes 1987). Total nitrogen (TN) in the

97   hypolimnion could either increase or decrease in anoxic conditions, depending on the balance of

98   NH_4^+ vs. NO_3^- within the DIN pool, as the inorganic fraction of hypolimnetic dissolved N is

99   generally greater than the organic fraction (Kim et al. 2006). For hypolimnetic phosphorus (P),

100   we would expect that dissolved reactive phosphorus (DRP) concentrations would be higher in

101   anoxic conditions as DRP is released into the water column during iron reduction and particulate

102   organic matter mineralization (Fig. 1; Mortimer 1971, Boström et al. 1988, Nürnberg 1988,

103   Rydin 2000). Total P (TP) concentrations would likely exhibit a similar but more muted response

104   to anoxia than DRP, as DRP is usually a small fraction of the TP pool (Wetzel 2001).

105   While these different C, N, and P processes have been well-studied individually, there

106   have been no studies on the net effect of anoxia on all of these cycles operating concurrently at

107   the ecosystem scale, likely due to the challenges of disentangling complex coupled

108   biogeochemical cycling with observational field studies or laboratory experiments. Explicitly

109   considering interconnected elemental cycles and their stoichiometry (following Sterner and Elser

110   2002) is essential to understanding the effects of anoxia on ecosystem functioning.

111   Increases in hypolimnetic anoxia have substantial implications for the fate of C, N, and P

112   in freshwater ecosystems. There are two primary fates for C, N, and P entering into a waterbody:

113   1) retention, by either remaining in the water column, burial in the sediments, or emission to the

114   atmosphere (for C and N only); or 2) export downstream (following the ecosystem retention

115   definition used by Dillon and Molot 1997, Harrison et al. 2009, Powers et al. 2015, Maranger et

116　　al. 2018, and many others). Anoxia may decrease the ability of lakes and reservoirs to retain

117　　NH_4^+ and DRP by reducing their burial in sediments (Rysgaard et al. 1994, North et al. 2014,

118　　Powers et al. 2015), thereby increasing their downstream export. Conversely, anoxia could

119　　increase the retention of NO_3^- by increasing its emission to the atmosphere via denitrification,

120　　thereby decreasing its downstream export (Fig. 1; Beaulieu et al. 2014). For C, the ecosystem-

121　　scale effects of anoxia are likely complex. The TOC pool includes dissolved and particulate

122　　fractions of OC that may respond to oxygen differently and are mediated by ambient

123　　environmental conditions, such as external loading, temperature, nutrients, and light (Hanson et

124　　al. 2015). For example, anoxia could increase the retention of particulate OC (POC) by

125　　decreasing its mineralization, thereby potentially increasing its burial in sediments (Walker and

126　　Snodgrass 1986, Beutel 2003). Simultaneously, anoxia could decrease the retention of DOC by

127　　stimulating fluxes of DOC from the sediments into the water column (e.g., by reductive

128　　dissolution of iron-bound DOC complexes; Skoog and Arias-Esquivel 2009), thereby potentially

129　　decreasing burial in sediments (Brothers et al. 2014, Peter et al. 2017), and increasing DOC

130　　export downstream. Consequently, quantifying the effect of anoxia on C, N, and P retention vs.

131　　downstream export (and thus determining if a waterbody is a sink or source of C, N, and P

132　　downstream) is needed to improve our understanding of the changing role of lakes and reservoirs

133　　in global biogeochemical cycles.

134　　　　In particular, human-made reservoirs, which retain substantially more inflowing C, N,

135　　and P per unit area than naturally formed lakes globally via either sediment burial or emissions to

136　　the atmosphere (Harrison et al. 2009, Powers et al. 2016, Maranger et al. 2018), may be very

137　　sensitive to the effects of hypolimnetic anoxia. Despite only covering 6-11% of the global lentic

138　　surface (Downing et al. 2006, Lehner et al. 2011, Verpoorter et al. 2014), reservoirs alone are

6

139   estimated to account for ~40% of total annual global OC burial (Mendonça et al. 2017) and 26%

140   of total annual global P burial (Maranger et al. 2018). Moreover, reservoirs globally emit 6.5 Tg

141   N yr^{-1} to the atmosphere, primarily via denitrification (Harrison et al. 2009, Beusen et al. 2016).

142   In an analysis of ~1000 lakes and reservoirs sampled once across the U.S., reservoirs were found

143   to have lower organic C:P and N:P ratios than naturally formed lakes, which was attributed in

144   part to a greater incidence of hypolimnetic anoxia in reservoirs than naturally formed lakes

145   (Maranger et al. 2018). However, that study lacked accompanying oxygen data to examine how

146   C, N, and P varied across a gradient of oxygen availability. Moreover, the amalgamation of data

147   from waterbodies with different climate and catchment land use makes it challenging to quantify

148   how changing oxygen alters water column C, N, and P concentrations, stoichiometry, and export.

149   We need new approaches that embrace the dynamic nature of reservoirs over time and allow us

150   to disentangle the effects of hypolimnetic anoxia on these waterbodies, especially as their

151   construction is increasing globally (Zarfl et al. 2015).

152   To mechanistically quantify the effects of anoxia on C, N, and P cycling, we devised and

153   conducted REDOX (the Reservoir Ecosystem Dynamic Oxygenation eXperiment), an

154   unprecedented, seven-year study that integrated a long-term hypolimnetic oxygenation

155   manipulation with ecosystem modeling in a eutrophic reservoir. Coupled whole-ecosystem

156   manipulations and ecosystem modeling provide a powerful approach for both quantifying the

157   effects of hypolimnetic anoxia on C, N, and P cycling and testing the mechanisms underlying

158   continental-scale patterns derived from thousands of waterbodies (e.g., Helton et al. 2015,

159   Maranger et al. 2018). Foundational work based on sediment core incubations in the laboratory

160   and small chambers placed *in situ* on the sediments of lakes and reservoirs (e.g., Frindte et al.

161   2015, Lau et al. 2016) have yet to be tested at the ecosystem scale, which is needed to overcome

162   the limitations of small volumes of water and mesocosm fouling. Studies that manipulate an

163   entire ecosystem are able to disentangle the effects of oxygen availability from other

164   environmental drivers, such as water temperature and biological activity, on C, N, and P cycling

165   (Cole 2013). However, it is logistically challenging to replicate these intensive experiments

166   under different meteorological and environmental conditions over time to assess robustness and

167   repeatability of ecosystem responses. Consequently, data from whole-ecosystem manipulations

168   can be used to calibrate ecosystem models (following Medlyn et al. 2015) that can simulate

169   complex ecosystem responses under a range of oxygen scenarios and weather conditions over

170   multiple years, thereby overcoming the constraints of separate empirical and model

171   investigations.

172   The purpose of REDOX was to study ecosystem-scale functioning under contrasting

173   oxygen conditions over multiple years in the same reservoir. First, we intensively monitored

174   dissolved oxygen and total and dissolved C, N, and P chemistry, as well as a suite of

175   accompanying water quality variables, in the reservoir during the seven-year field manipulation.

176   Second, we used the empirical data to calibrate a coupled hydrodynamic-ecosystem model,

177   which was used to quantify the effects of varying oxygen conditions over the seven years. To

178   further investigate changes in reservoir C, N, and P cycling due to anoxia, we used the calibrated

179   model to test hypolimnetic oxygen scenarios under a range of seasonal and meteorological

180   conditions. We focused on two contrasting model scenarios: one in which there was oxygenation

181   throughout the stratified summer periods in all seven years, resulting in continuous oxic

182   conditions, and one in which there was no oxygenation, resulting in hypolimnetic anoxia every

183   summer. We used the model output to address the following questions: 1) How does

184   hypolimnetic oxygen availability affect total and dissolved C, N, and P concentrations and

185 stoichiometry?, and 2) How does hypolimnetic anoxia affect reservoir retention and downstream

186 export of C, N, and P?

187

188 **Materials and Methods**

189 *Site description*

190   We studied the effect of changing oxygen conditions on C, N, and P dynamics in Falling

191 Creek Reservoir (FCR), a small eutrophic reservoir located in Vinton, Virginia, USA

192 (37.303479,-79.837371; Fig. 2). FCR has a maximum depth of 9.3 m and surface area of 0.119

193 km^2 and is a drinking water source operated by the Western Virginia Water Authority (WVWA;

194 Gerling et al. 2014). FCR's watershed was farmland at the time of reservoir construction in 1898

195 and is almost completely deciduous forest today following agricultural abandonment in the

196 1930s (Gerling et al. 2016). The reservoir has never been dredged (Gerling et al. 2016), and had

197 a mean hydraulic residence time of 281 days (±12 days, 1 S.E.) during our study. FCR has

198 hypolimnetic outtake valves from which water can be withdrawn for treatment.

199

200 *Whole-ecosystem manipulations*

201   We manipulated hypolimnetic oxygen availability in FCR using an engineered

202 hypolimnetic oxygenation system (HOx) deployed by the WVWA in 2012, which allowed us to

203 generate contrasting summer oxic and anoxic conditions (Gerling et al. 2014). The HOx system

204 withdraws hypolimnetic water from 8 m depth, injects dissolved oxygen into the water at super-

205 saturated concentrations onshore, and returns the oxygenated water back to the hypolimnion at 8

206 m without altering thermal stratification or water temperature (Gerling et al. 2014).

207   During the summers of 2013-2019, the HOx system was operated at variable oxygen

208   addition levels and durations in collaboration with the WVWA (Carey et al. 2022a). Some

209   summers experienced intermittent 4-week periods of oxygenation (2013, 2014); some summers

210   had near-continuous oxygenation (2015, 2016, 2017), one summer had approximately half

211   oxygenation (2018), and one summer experienced intermittent 2-week periods of oxygenation

212   (2019; Carey et al. 2022a). These wide-ranging oxygenation conditions, which occurred because

213   the reservoir was an actively managed drinking water source, provided an ideal dataset for

214   calibrating the biogeochemical rates in the ecosystem model to variable hypolimnetic oxygen

215   conditions, as described below.

216

217   *Monitoring data*

218   FCR's physics, chemistry, and biology were intensively monitored throughout the

219   REDOX manipulations (see Supporting Information Text 1 for detailed field sampling methods).

220   On every sampling day, depth profiles of water temperature and dissolved oxygen were collected

221   at the deepest site of the reservoir, near the dam (Carey et al. 2021b). We collected water

222   samples for total and dissolved N, P, and organic C (hereafter, C) analyses from the reservoir's

223   water treatment extraction depths (0.1, 1.6, 2.8, 3.8, 5.0, 6.2, 8.0, and 9.0 m) using a Van Dorn

224   sampler. Water was filtered through glass-fiber 0.7-micron filters into acid-washed bottles and

225   immediately frozen until analysis for dissolved C, N, and P samples (Carey et al. 2021c).

226   Unfiltered water was frozen in separate acid-washed bottles for total samples (Carey et al.

227   2021c). We focused our sampling and analysis on organic C, rather than inorganic C, because of

228   the important role of reservoirs in burying this pool in the global C cycle (Mendonça et al. 2017),

229   and because previous work indicates that most terrestrial dissolved inorganic C loads are rapidly

230 emitted to the atmosphere (McDonald et al. 2013).

231   We used standard methods for biogeochemical analyses (see Supporting Information

232 Text 2 for detailed laboratory methods). We used flow injection analysis to determine

233 concentrations of N and P colorimetrically (APHA 2017), with an alkaline persulfate digestion

234 for TN and TP fractions. DOC and TOC were determined by either heated persulfate digestion or

235 high-temperature combustion followed by infrared absorbance (APHA 2017; see Table S1). All

236 field and laboratory data are available with detailed metadata in the Environmental Data

237 Initiative (EDI) repository (Carey et al. 2019, Carey et al. 2020, Carey et al. 2021a, Carey et al.

238 2021b, Carey et al. 2021c, Carey et al. 2021d).

239

240 *Model description and driver data*

241   We used the empirical data to calibrate and validate the General Lake Model coupled to

242 Aquatic EcoDynamics modules (GLM-AED, v.3.2.0a3) configured for FCR (see Supporting

243 Information Text 3 for detailed modeling methods). GLM-AED is an open-source, 1-D

244 numerical simulation model that is widely used in the freshwater research community to model

245 lakes and reservoirs (e.g., Bruce et al. 2018, Hipsey et al. 2019, Farrell et al. 2020, Ward et al.

246 2020, Hipsey 2022). GLM-AED requires meteorological, inflow, and outflow driver data and

247 simulates water balance and thermal layers using a Lagrangian strategy (Hipsey et al. 2019,

248 Hipsey 2022). GLM-AED has a flexible structure in which modules representing different

249 ecosystem components can be turned on or off to recreate varying levels of ecosystem

250 complexity; our configuration for FCR included modules for oxygen, C, silica (Si), N, P, organic

251 matter, and phytoplankton (Carey et al. 2022a, Carey et al. 2022b).

11

252   GLM-AED simulates the dominant processes controlling freshwater oxygen and C, N,

253   and P cycling (see Supporting Information Text 3; Hipsey 2022). Biogeochemical processes

254   (e.g., sediment fluxes, mineralization) were modeled as a function of both oxygen following

255   Michaelis-Menten dynamics and temperature following Arrhenius coefficients (Farrell et al.

256   2020). Consequently, processes that are favored in anoxic conditions (e.g., sediment fluxes of

257   DOC, NH_4^+, and DRP into the hypolimnion) were still simulated in oxic conditions, but at much

258   lower rates.

259   The ecosystem model provided important insight on the effects of anoxia that would have

260   been impossible to obtain from the field manipulation alone. First, while we do report on the

261   biogeochemical responses to the field manipulation to provide complementary data to the model

262   output, ecosystems rarely experience such rapid shifting of redox conditions at sub-seasonal

263   scales, as were created by abrupt additions of oxygen via the HOx system. Thus, to understand

264   how our FCR results applied to other waterbodies, we used the seven-year field manipulation as

265   a proxy to contrast the consequences of seasonally oxic vs. anoxic hypolimnia for

266   biogeochemical cycling in an ecosystem model. These highly contrasting scenarios were

267   achieved in the model by manipulating hypolimnetic oxygen injection (described below).

268   Second, to determine the cumulative fate of C, N, and P over an entire summer in response to

269   oxygen dynamics, it is important to track these elements at a high temporal resolution. Because

270   our field data were collected weekly to monthly, we used numerical modeling of hydrodynamics

271   and ecosystem processes to capture daily dynamics. Third, the field manipulation included a

272   variable oxygenation schedule which occurred against a backdrop of changing meteorology and

273   hydrology. Consequently, the model enabled us to isolate the effects of oxygen availability on

274   the reservoir's biogeochemistry and evaluate the robustness of ecosystem responses across

275   varying environmental conditions.

276

277   *Model configuration and calibration*

278   All GLM-AED model configuration files, parameters, and driver data for FCR are

279   available in the EDI repository (Carey et al. 2022a). GLM-AED driver data included hourly

280   meteorological data from NASA's North American Land Data Assimilation System (NLDAS-2;

281   Xia et al. 2012), stream inflow data, and outflow data. We developed stream inflow driver

282   datasets – which consisted of daily discharge, water temperature, and chemistry – for the two

283   primary streams entering FCR from observational data (Supporting Information Text 3). To

284   simulate the HOx system in the model, we added a submerged inflow that injected oxygenated

285   water into the reservoir at 8 m, the same depth as in the reservoir. As the reservoir was managed

286   to keep constant water level, outflow volume was set to equal inflow volume; the physical and

287   chemical properties of the outflow were determined by the state of the modeled reservoir

288   (Supporting Information Text 3).

289   We ran the model from 15 May 2013 to 31 December 2019, divided into calibration (15

290   May 2013 - 31 December 2018) and validation (1 January 2019 - 31 December 2019) periods for

291   model verification. GLM-AED was run on an hourly time step throughout the total simulation

292   period (Carey et al. 2022a).

293   We calibrated GLM-AED to observed conditions (Supporting Information Text 3). First,

294   we conducted a global sensitivity analysis to identify the most important parameters for

295   simulating water temperature, dissolved oxygen, NH_4^+, NO_3^-, DRP, and DOC following Morris

296   (1991). Second, we calibrated the identified sensitive parameters (Table S2) using the covariance

13

297   matrix adaptation evolution strategy for automated numerical optimization (Hansen 2016) to

298   minimize root mean square error (RMSE) between observations and model output for all

299   sampling depths in the water column.

300   We calculated multiple goodness-of-fit metrics to assess the model's performance during

301   the calibration period, validation period, and total simulation period, including RMSE, the

302   coefficient of determination (R^2), percent bias, and normalized mean absolute error (NMAE)

303   (e.g., Kara et al. 2012, Ward et al. 2020, Ladwig et al. 2021). We calculated these goodness-of-

304   fit metrics following the most common approaches used in 328 recent freshwater modeling

305   studies (reviewed by Soares and Calijuri 2021; described in Supporting Information Text 3).

306

307   *Model scenarios*

308   Following model calibration, we examined the effects of two different oxygen scenarios

309   on FCR's biogeochemistry using the GLM-AED model: 1) an "oxic" scenario in which the

310   model was forced with a high level of oxygenation to keep the hypolimnion oxic throughout

311   summer thermal stratification (May 15 - Oct 15) during 2013-2019; and 2) an "anoxic" scenario

312   in which zero oxygen was added to the hypolimnion, so hypolimnetic anoxia quickly set up after

313   the onset of thermal stratification each summer. All other driver data (meteorology, stream

314   inflows, outflow) were held constant.

315

316   *Statistical analysis*

317   We used several approaches to answer the two research questions. For Q1, we first

318   compared observed data from the oxygenated vs. non-oxygenated periods of our field

319   manipulation to determine if oxygenation had an effect on empirical total and dissolved C, N,

320   and P concentrations. We pooled all hypolimnetic C, N, and P samples from the two summers

321   with the least oxygenation (July 15 - October 1 in 2018, 2019) when the HOx was deactivated

322   and compared them with concentrations measured during the two summers with the most

323   continuous oxygenation (July 15 - October 1 in 2016, 2017) when the HOx was activated

324   (Supporting Information Text 4). We also used the FCR field data to validate the model's ability

325   to simulate the field manipulation. Second, because our goal was to compare completely oxic vs.

326   completely anoxic summers and every summer had at least some oxygenation during the seven-

327   year field manipulation, we focused our subsequent analyses on the anoxic vs. oxic model

328   scenario output, which provided complementary data to the non-oxygenated vs. oxygenated

329   empirical data. Focusing on the model output for this analysis also enabled us to overcome the

330   limitations of comparing years with different numbers of sampling observations, as the model

331   calculated daily C, N, and P concentrations and rates.

332   We compared hypolimnetic C, N, and P concentrations and rates between the oxic and

333   anoxic model scenarios during 15 July - 1 October among years, the interval within the summer

334   thermally stratified period when the reservoir consistently exhibited hypolimnetic anoxia in non-

335   oxygenated conditions. We calculated the median hypolimnetic dissolved and total

336   concentrations of C, N, and P during this period for each of the seven years (2013 - 2019), and

337   compared the median summer anoxic and oxic concentrations and their ratios using paired t-

338   tests, as there was no temporal autocorrelation among median summer values (Supporting

339   Information Text 5). We also examined summer rates of all processes controlling increases and

340   decreases in hypolimnetic C, N, and P to determine their relative importance and sensitivity to

341   oxygen.

342   To examine how the uncertainty of our model outputs was affected by the model

343   parameterization, we conducted an additional sensitivity analysis in which we doubled and

344   halved the calibrated values of highly sensitive parameters for DOC, NH_4^+, NO_3^-, and DRP using

345   a one-step-at-a-time (OAT) approach (following Brett et al. 2016). We then re-calculated the

346   summer hypolimnetic concentrations of DOC, NH_4^+, NO_3^-, and DRP in the anoxic and oxic

347   model scenarios for each variable and compared anoxic and oxic concentrations with paired t-

348   tests, as described above (Supporting Information Text 3, Fig. S1).

349   For Q2, we estimated C, N, and P downstream export as a percent of inputs into the

350   reservoir each summer (Powers et al. 2015, Farrell et al. 2020). Downstream export was

351   calculated as:

352   *Flux = 100% × ((Σ Outputs – Σ Inputs)/Σ Inputs)*   (eqn. 1)

353   where Outputs and Inputs represent the daily mass of C, N, or P leaving and entering the

354   reservoir, respectively, during 15 July - 1 October each year. Fluxes were calculated for both

355   dissolved and total fractions of C, N, and P. Inputs were calculated by multiplying the individual

356   stream daily inflow concentrations with their daily inflow volumes and then summing across the

357   two streams. Outputs were calculated by multiplying the outflow water volume (leaving the

358   reservoir and going downstream) by hypolimnetic concentrations. A water budget calculated for

359   the reservoir in 2014 - 2015 (Munger et al. 2019) supplemented by monitoring data in this study

360   indicates that the two inflow streams represented approximately 97% of the reservoir's water

361   inputs (Supporting Information Text 1), motivating our focus on those inputs.

362   Inputs and Outputs were summed across the 15 July - 1 October period to calculate C, N,

363   and P fluxes. Flux values of 0 indicated that the reservoir inputs balanced outputs; flux values <0

364   indicated that the reservoir was a net sink of C, N, or P; and flux values >0 indicated that the

16

365 reservoir was a net source of C, N, or P downstream. We compared summer retention (i.e., flux

366 values) in the anoxic and oxic scenarios with paired t-tests (Supporting Information Text 5).

367 To ease comparison among C, N, and P concentrations and ratios, all analyses were

368 conducted in molar units. All analyses were conducted in R v.3.6.3 (R Core Team 2020) and all

369 code to reproduce these analyses is available in the Zenodo repository (Carey et al. 2022b).

370

Results

372 Our integrated whole-ecosystem REDOX field manipulation and modeling demonstrates

373 that hypolimnetic anoxia significantly alters water column C, N, and P concentrations and

374 stoichiometry. Importantly, our study also shows that prolonged hypolimnetic anoxia in the

375 summer decreases the ability of a reservoir to retain C, N, and P, substantially increasing the

376 downstream export of these elements.

377

Observational data from whole-ecosystem manipulations

379 Injection of oxygen into the bottom waters of Falling Creek Reservoir (FCR) over seven

380 years increased the reservoir's observed hypolimnetic oxygen, resulting in substantial changes in

381 total and dissolved C, N, and P concentrations (Fig. 3, Fig. S2). Due to the nature of our

382 oxygenation manipulation, some years experienced low levels of oxygenation (i.e., the HOx was

383 off for prolonged periods throughout the summer), while others experienced high levels of

384 oxygenation during the stratified period (Fig. 3b). Oxygenation resulted in substantially higher

385 hypolimnetic oxygen concentrations without altering water temperature and thermal stratification

386 in the reservoir (Fig. 3a,b). In 2019, oxygenation did not increase hypolimnetic oxygen

387   concentrations to the same extent as preceding summers, likely because the HOx was only

388   operated for intermittent 2-week periods (vs. 4-week or longer periods in all other years).

389   The median observed hypolimnetic DOC, NH_4^+, and DRP concentrations were 2.0, 6.9,

390   and 1.3× higher in the summers with the least oxygenation (2018, 2019) than in the summers

391   with the highest oxygenation (2016, 2017; Fig. 3c,e,h; Fig. S2), respectively. Following the

392   patterns exhibited by the dissolved fractions, median observed hypolimnetic TN and TP

393   concentrations were both 2.4× higher in the low vs. high oxygenation summers (Fig. 3d,g; Fig.

394   S2). Conversely, median observed hypolimnetic NO_3^- concentrations were 5× lower in summers

395   with low oxygenation than summers with high oxygenation (Fig. 3f, Fig. S2). Because our goal

396   was to compare completely oxic vs. completely anoxic summer conditions and every summer

397   had at least some oxygenation during the seven-year field manipulation at varying levels of

398   oxygen injection, subsequent analyses focused on the anoxic vs. oxic model scenario output,

399   described below.

400

401   *Model performance*

402   The field manipulation data were used to calibrate the ecosystem model, which generally

403   reproduced observed water temperature, oxygen, dissolved and total C, N, and P concentrations,

404   and stoichiometry (Table 1, Fig. 3, Fig. S3, Fig. S4). Similar to field observations, the simulation

405   of oxygen injection in the model did not substantively alter modeled water temperature or

406   thermocline depth (Table 1, Fig. 3a).

407   Model performance of most state variables in our study (Table 1) exceeded the median

408   goodness-of-fit metrics for recent freshwater modeling studies reported by Soares and Calijuri

409   (2021). For example, our water temperature R^2 was 0.95 for the full seven-year simulation period

410 (vs. 0.94 in Soares and Calijuri 2021), our dissolved oxygen R^2 was 0.72 (vs. 0.61), our TN was

411 0.71 (vs. 0.61), and our NH_4^+ R^2 was 0.77 (vs. 0.35). No DOC data were reported by Soares and

412 Calijuri (2021), but our R^2 values ranged from 0.30-0.52 for the full simulation, calibration, and

413 validation periods. Phosphorus had less good fit, but was still reasonable: our TP R^2 was 0.25 for

414 the full seven-year simulation period (slightly lower than the 0.30 reported by Soares and

415 Calijuri 2021), but the validation period's R^2 for TP was much higher, at 0.85. Similarly, our

416 DRP R^2 was 0.10 for the full seven-year period (vs. 0.32) but the six-year calibration period had

417 better performance, at an R^2 of 0.24. NO_3^- had an R^2 of 0.27 for the full seven-year modeling

418 period and R^2 of 0.33 for the six-year calibration period, which was lower than the 0.61 reported

419 by Soares and Calijuri (2021).

420   Much of the variation in DRP and NO_3^- observations was within the analytical limits of

421 quantitation (Fig. 3f,h). Consequently, while the model generally captured seasonal patterns of

422 DRP and NO_3^-, it was simply not possible to reproduce short-term fluctuations in observations

423 below method detection limits. NO_3^- concentrations in particular were extremely low in both

424 field observations and model output (Fig. 3f). Throughout the study, NO_3^- was a very minor

425 fraction of TN, representing a median of 0.5% ($\pm$0.9%, 1 S.D.) of TN at all depths in the field

426 data and a median of 0.8% ($\pm$0.9%) of TN in the baseline simulation. Subsequently, a lower fit of

427 NO_3^- did not affect the model performance of TN, as evident by its goodness-of-fit metrics

428 (Table 1).

429

430 *How does hypolimnetic oxygen availability affect total and dissolved C, N, and P concentrations*

431 *and stoichiometry?*

432   Model scenarios show that hypolimnetic anoxia significantly affected all three focal

433 elemental cycles, but that N was the most sensitive (Fig. 4, Fig. 5; see Table S3 for statistics).

434 Summer TN molar concentrations in the reservoir were on average 3.0× higher in anoxic than

435 oxic conditions, relative to a 1.1× increase of TOC and 1.6× increase of TP (Fig. 5a,c,g). The

436 dissolved fractions accounted for most of the changes in total C, N, and P: following the field

437 data, modeled summer hypolimnetic DOC, NH_4^+, and DRP concentrations in FCR were on

438 average 1.1, 5.8, and 3.1× higher, respectively, during anoxic conditions than in oxic conditions

439 (Fig. 5b,e,h). Conversely, hypolimnetic NO_3^- was much lower in anoxic conditions (usually at or

440 just above 0 mmol m^{-3}) than oxic conditions, but DIN exhibited an overall increase because of

441 the dominance of NH_4^+ over NO_3^- in the dissolved inorganic N pool (Fig. 5d,f). The statistical

442 significance and overall magnitude of differences in concentrations between the anoxic and oxic

443 scenarios were consistent even when focal parameters governing DOC, NH_4^+, NO_3^-, and DRP

444 were doubled or halved in the parameter sensitivity analysis (Fig. S1).

445   The elemental stoichiometry in FCR exhibited rapid and large ecosystem-scale changes

446 after the onset of anoxia each summer. While total and dissolved fractions of C, N (except NO_3^-),

447 and P significantly increased with anoxia (Fig. 4, Fig. 5), the different fractions had varying

448 sensitivities to changing oxygen, resulting in significant changes in C, N, and P ratios (Fig. 6,

449 Table S4). Hypolimnetic TN:TP and DIN:DRP were significantly higher (both by 1.9×, on

450 average) in anoxic conditions than oxic conditions (Fig. 6g,h). Because modeled hypolimnetic

451 NO_3^- concentrations were at or near zero during anoxic conditions (Fig. 5f), DOC:NO_3^- could not

452 be consistently calculated (Fig. 6e). In contrast, TOC:TN, TOC:TP, DOC:DIN, DOC:NH_4^+, and

453 DOC:DRP were significantly higher (on average, by 2.7×, 0.7×, 4.7×, 5.0×, and 2.7×,

454 respectively) in oxic conditions than anoxic conditions (Fig. 6a,b,c,d,f; Table S4).

455   The most important processes driving the biogeochemical responses to anoxia were much

456 higher fluxes of NH_4^+, DRP, and DOC into the hypolimnion from the sediments in anoxic

457 periods relative to oxic periods (Fig. 7, Fig. S5). During anoxic summer conditions, the median

458 release rates of NH_4^+ and DRP from the sediments into the water column were 3.6× and 2.2×

459 higher, respectively, than in oxic conditions (Fig. 7b,c). During oxic conditions, the sediment

460 release rate of NH_4^+ into the hypolimnion was 34× greater than the consumption of NH_4^+ by

461 nitrification (Fig. 7b), thereby explaining the hypolimnetic accumulation of NH_4^+ that occurred

462 during oxic conditions (Fig. 4g). Although median labile dissolved organic N (DON) and P

463 (DOP) mineralization rates were both 4.0× times higher in oxic than anoxic conditions, their

464 contribution to hypolimnetic N and P budgets was much smaller than NH_4^+ and DRP sediment

465 fluxes. All biogeochemical rates involving the cycling of NO_3^- were much lower than for NH_4^+

466 overall, likely because of the much lower concentrations of NO_3^- within the DIN pool (Fig. 7b).

467 For DOC, the median sediment fluxes increasing DOC in the hypolimnion were 1.9× times

468 higher in anoxic than oxic conditions (Fig. 7a). Although labile DOC mineralization rates were

469 2.0× higher in oxic than anoxic conditions, sediment flux rates were 19× higher than

470 mineralization rates, resulting in greater hypolimnetic accumulation of DOC in anoxic relative to

471 oxic periods (Fig. 4d).

472 The time scales at which C, N, and P concentrations responded to shifts in hypolimnetic

473 oxygen availability differed as a result of multiple interacting biogeochemical processes (Fig. 4,

474 Fig. 7). For example, the onset of anoxia each summer triggered rapid decreases in NO_3^- (Fig.

475 4h), due to sediment denitrification reducing NO_3^- to N_2 (Fig. 7b). Similarly, the rapid increases

476 in hypolimnetic NH_4^+ and DOC concentrations after the onset of anoxia (Fig. 4d,g) were

477 attributable to the high rates of NH_4^+ and DOC sediment release (Fig. 7a,b). In comparison,

478 hypolimnetic DRP increases in response to anoxia occurred more slowly (Fig. 4j). This

479   difference in time scale reflects the lower fitted value of the half-saturation constant of modeled

480   DRP sediment fluxes (6.91 mmol m^{-3}) relative to the half-saturation constants of NH_4^+ sediment

481   fluxes (41.25 mmol m^{-3}) and DOC sediment fluxes (93.13 mmol m^{-3}; Carey et al. 2022a).

482   Consequently, oxygen concentrations in the hypolimnion had to decrease to near zero before

483   anoxia stimulated an increase in DRP sediment fluxes, following Michaelis-Menten dynamics.

484

485   *How does hypolimnetic anoxia affect reservoir downstream export of C, N, and P?*

486   Overall, anoxia significantly increased downstream export of C, N, and P from FCR (Fig.

487   8). During the summer months, if the reservoir's hypolimnion was oxic, FCR served as a net sink

488   for inflowing TOC and TP, decreasing the downstream export of those fractions (Fig. 8a,g). The

489   reservoir served as a particularly important TP sink during summer oxic conditions, with 22% of

490   inflowing TP buried in sediments, resulting in 78% of the inflowing TP exported downstream

491   (Fig. 9). In comparison, while the reservoir was also a TOC sink in oxic conditions, only 8% of

492   inflowing TOC was buried in sediments or removed via emission to the atmosphere, resulting in

493   92% export downstream (Fig. 9). However, in most anoxic summers, the reservoir became a net

494   source of TOC and TP downstream, meaning that inflowing TOC and TP – as well as TOC and

495   TP that were previously retained in the reservoir sediments – were released and transported out

496   of the reservoir (Fig. 8a,g). Consequently, on average, the reservoir exported 105% of inflowing

497   TOC and 123% of inflowing TP in anoxic conditions (Fig. 9). DOC and DRP fluxes largely

498   mirrored the patterns of the total fractions, though DRP had much greater flux downstream

499   overall in anoxic summers than TP (Fig. 8b,g,h).

500   The reservoir was a net source of TN, DIN, and NH_4^+ downstream even in oxic

501   conditions, but this export significantly increased when the hypolimnion became anoxic in

502   summer (Fig. 8c,d,e). The only fraction of N that did not exhibit higher downstream export

503   during anoxic conditions was NO_3^- (Fig. 8f). During anoxic conditions, ~100% of inflowing

504   NO_3^- was removed due to sediment denitrification, whereas in oxic conditions, some of this NO_3^-

505   was exported downstream along with additional NO_3^- that originated from nitrified NH_4^+ in the

506   reservoir (Fig. 7b). Overall, the reservoir exported 204% of inflowing TN in summer oxic

507   conditions and 553% in anoxic conditions (Fig. 9).

508   Aggregated across the seven years, FCR served as a small net sink of POC, PON, and

509   POP in its sediments in both oxic and anoxic model scenarios. All particulate organic fractions

510   exhibited significantly higher annual burial rates in anoxic scenarios than oxic scenarios, though

511   the differences were small, especially for POP (Table S6).

512

513   **Discussion**

514   Our study provides one of the first comprehensive analyses on the effects of oxygen on

515   multiple fractions of C, N, and P at the whole-ecosystem scale in a freshwater ecosystem. Our

516   unprecedented 7-year field manipulation coupled with ecosystem model simulations reveals that

517   anoxia may decrease the ability of reservoirs to serve as sinks of C, N, and P. Moreover, both the

518   empirical data and model output demonstrate that anoxia resulted in significantly higher summer

519   concentrations of hypolimnetic NH_4^+, DRP, and DOC and altered dissolved and total

520   stoichiometry by factors of 2-5×. Our integrated field manipulation and modeling study provides

521   important insight on the biogeochemical cycling of these three elements, which are already

522   changing in many freshwaters globally due to human activities (e.g., Powers et al. 2015,

523   Maranger et al. 2018), and likely will change substantially more in the future as the prevalence

524   and duration of anoxia in lakes and reservoirs increase (Tranvik et al. 2009, North et al. 2014,

525   Jenny et al. 2016a, Jane et al. 2021). Below, we first examine the effects of anoxia on each

526   elemental cycle separately, then their combined stoichiometry, and ultimately whole-ecosystem

527   biogeochemical processing and fate.

528

529   *Hypolimnetic carbon and nutrient chemistry*

530   This study provides an answer to the critical question of how increased anoxia will affect

531   OC cycling at the whole-ecosystem scale (Sobek et al. 2009, Brothers et al. 2014, Peter et al.

532   2016, Mendonça et al. 2017, Carey et al. 2018). The shift in reservoir OC cycling in response to

533   anoxia is the consequence of changes in three linked processes: POC burial, DOC

534   mineralization, and DOC release from the sediments. Under anoxic conditions, POC burial

535   increased slightly, DOC mineralization rates were low, and DOC release from the sediments to

536   the water column was 2× higher than in oxic conditions (Fig. 7a, Table S6). Under oxic

537   conditions, DOC mineralization rates, while higher than in anoxic conditions (Fig. 7, Fig. S5),

538   were still an order of magnitude lower than the rate of hydrologic flushing. The net outcome of

539   these three processes was a substantial difference in OC retention in the reservoir during oxic vs.

540   anoxic conditions. Under oxic conditions, the reservoir served as a net sink of DOC and TOC,

541   with up to 18% of inflowing DOC and TOC retained in a summer (Fig. 8a,b). Under anoxic

542   conditions, the decrease in net retention of inflowing DOC and TOC more than offset the slight

543   increase in POC burial, and nearly all of the inflowing DOC and TOC was exported downstream

544   (as indicated by 0% or positive flux in Fig. 8a,b). In five of the seven years, FCR even became a

545   net exporter of TOC and DOC in the anoxic scenario (Fig. 8a,b), meaning that both inflowing

546   TOC and DOC, and likely legacy TOC and DOC that were previously buried in sediments, were

547   released and transported out of the reservoir.

548   The finding that anoxia simultaneously decreased the reservoir's role as a DOC sink yet

549   increased its role as a POC sink may explain some of the conflicting results that emerged from

550   previous studies that focused on only one OC fraction. First, our study supports past work that

551   observed increasing hypolimnetic DOC concentrations in anoxic conditions, suggesting that

552   anoxia decreases the freshwater OC sink (Brothers et al. 2014, Peter et al. 2016, Mendonça et al.

553   2017). The increasing hypolimnetic DOC concentrations have been attributed to both reductive

554   dissolution of iron-bound OC complexes in the sediments during anoxia (Skoog and Arias-

555   Esquivel 2009, Peter et al. 2016, Peter et al. 2017) and decreased mineralization rates in anoxic

556   conditions (Bastviken et al. 2004, Sobek et al. 2009). Our calibrated ecosystem model indicates

557   that both processes are important, but that the much higher hypolimnetic DOC concentrations in

558   anoxic conditions in FCR were primarily due to sediment release (Fig. 7a). At the same time, our

559   work also supports laboratory microcosm and sediment core studies that observed lower POC

560   mineralization rates in anoxic than in oxic conditions (Bastviken et al. 2004, Sobek et al. 2009).

561   In FCR, mean summer POC hydrolysis rates in the hypolimnion were five orders of magnitude

562   lower in anoxic than oxic conditions (Fig. 7a, Fig. S5), enabling slightly greater POC burial in

563   anoxic than oxic conditions. Altogether, our work indicates that using an ecosystem model to

564   simultaneously track both concentrations and rates of the major processes affecting dissolved,

565   particulate, and total pools of OC is needed to understand the full effects of oxygen on OC

566   cycling, as different fractions have different responses to anoxia.

567   Nitrogen was the most sensitive of the three focal elements to anoxia, with an NH_4^+-

568   dominated TN budget that increased dramatically during anoxic conditions. The dominant

569   mechanism driving the NH_4^+ increase in anoxic conditions were the approximately 4× higher

570   rates of ammonification and sediment release than those observed in oxic conditions (Fig. 7b).

571   Anammox and nitrification rates were very low in anoxic conditions (Fig. 7b, Fig. S5), enabling

572   NH_4^+ to accumulate in the hypolimnion during anoxia. In oxic conditions, nitrification rates were

573   unable to balance sediment fluxes, resulting in much lower but still noticeable increases in

574   summer NH_4^+ concentrations (Fig. 4g). As a result, the reservoir functioned as an NH_4^+ source

575   downstream regardless of hypolimnetic oxygen availability, though anoxia increased

576   downstream fluxes by 5× relative to oxic conditions, on average. The high sediment NH_4^+ fluxes,

577   even in oxic conditions, indicate that FCR has a large sediment NH_4^+ pool, which is likely due to

578   historical agriculture in the catchment (Gerling et al. 2016). Until agricultural abandonment in

579   the 1930s, most of FCR's catchment was farmland (Gerling et al. 2016). Even though the

580   catchment did not experience industrial farming, agriculture can have century-long effects on

581   soil properties, erosion, and ecosystem functioning (Foster et al. 2003, Cusack et al. 2013),

582   resulting in a large pool of NH_4^+ that can be recycled between the hypolimnion and sediments for

583   many years before eventual export (Ahlgren et al. 1994, Gerling et al. 2016).

584   Following expectation, hypolimnetic NO_3^- concentrations were significantly higher in

585   oxic conditions than anoxic conditions. Despite an increase in NO_3^- during oxic conditions, the

586   dominance of NH_4^+ over NO_3^- in the DIN pool (due to high NH_4^+ sediment fluxes even in oxic

587   conditions; Fig. 7b) resulted in overall similar patterns for TN and NH_4^+ (Fig. 5c,d,e). We

588   initially anticipated that an increase in NO_3^- in oxic conditions could balance an increase in NH_4^+

589   in anoxic conditions, thereby resulting in similar DIN concentrations regardless of oxygen level,

590   but low nitrification rates prevented increases in NO_3^- from occurring in oxic conditions (Fig.

591   7b). Long-term water chemistry monitoring of FCR shows much lower summer NO_3^-

592   concentrations over time relative to NH_4^+ (Fig. 3e,f), and thus modeled results follow

593   observations.

594   Altogether, anoxia significantly decreased FCR's role as a NH_4^+ sink and simultaneously

595   increased its role as an NO_3^- sink (Fig. 8e,f), to the extent that ~100% of inflowing NO_3^- was

596   removed via denitrification. A previous study reported an average TN retention rate of 26% (and

597   up to 78%) of inputs for agricultural reservoirs in the U.S. (Powers et al. 2015). It would be

598   expected that FCR, which is located in a forested catchment, would have much higher TN

599   retention than agricultural reservoirs because of its lower external TN loads; however, FCR's

600   high export of NH_4^+ resulted in the reservoir serving as a source of TN downstream regardless of

601   hypolimnetic oxygen availability (Fig. 9). We anticipate that a greater duration and prevalence of

602   hypolimnetic anoxia in lakes and reservoirs could increase freshwater NO_3^- retention, while

603   decreasing TN retention if a waterbody's DIN pool is dominated by NH_4^+, as in FCR.

604   Summer hypolimnetic DRP concentrations were approximately 3× higher in anoxic

605   conditions than oxic conditions (Fig. 5h). DRP cycling was primarily controlled by sediment

606   fluxes (Fig. 7c), which encompassed both release from metal complexes and sediment organic

607   matter into the water column. Our observation of 2.2× higher sediment release rates of DRP in

608   anoxic than oxic conditions (Fig. 7c) follows decades of work that have observed similar patterns

609   of increased P fluxes during anoxia (Mortimer 1971, Nürnberg 1987, Boström et al. 1988, Rydin

610   2000, Søndergaard et al. 2003).

611   A novel component of our study is that we simultaneously quantified both dissolved and

612   total pools of P at the whole-ecosystem scale in our model simulations, allowing us to

613   disentangle the responses of different P fractions to anoxia. While DRP concentrations tripled in

614   response to anoxia, TP concentrations only increased by 1.6× (Fig. 5g,h), indicating a lower

615   sensitivity of particulate P than DRP to hypolimnetic oxygen conditions in FCR. This result is

616   supported by the negligible (albeit statistically significant) response of POP to changes in oxygen

617 availability (Table S6). Consequently, we expect that the effects of anoxia on reservoir TP

618 dynamics are dependent on the proportion of dissolved P vs. particulate P within the TP pool. If

619 the hypolimnetic DRP pool comprises a sizeable proportion of TP, as observed in FCR (median

620 of $11\pm1\%$), then TP retention will likely be sensitive to anoxia (e.g., Fig. 9), but if DRP is lower,

621 then TP cycling may be more resilient to anoxia.

622

623 *Shifts in stoichiometry in response to anoxia*

624   The substantial difference in stoichiometric ratios between anoxic and oxic conditions

625 has important implications for understanding how anoxia affects the ecosystem functioning of

626 lakes and reservoirs. Because anoxia increased hypolimnetic NH_4^+ concentrations more than any

627 other dissolved or total fraction in this study, and NH_4^+ dominated both the dissolved and total N

628 pools, any stoichiometric ratios that included NH_4^+, DIN, or TN exhibited large shifts during

629 anoxia (Fig. 6). The significantly higher TN:TP and DIN:DRP ratios observed during anoxia will

630 likely affect water quality and food web structure (Fig. 6g,h). Higher N:P ratios favor non-N-

631 fixing cyanobacteria and will shift the composition of other taxa in phytoplankton community

632 based on their N and P requirements (Reynolds 2006), as phytoplankton can access hypolimnetic

633 nutrients via multiple mechanisms (Cottingham et al. 2015). In contrast, the significantly lower

634 TOC:TN, TOC:TP, DOC:DIN, DOC:NH_4^+, and DOC:DRP ratios during anoxia (Fig. 6a,b,c,d,f)

635 could increase organic matter mineralization rates (e.g., Coble et al. 2015).

636   Our results both support and contradict earlier studies that measured freshwater

637 stoichiometry across many waterbodies. Similar to an analysis of >27,000 freshwater samples

638 from U.S. waterbodies (Helton et al. 2015), we observed inverse relationships between NO_3^- vs.

639 NH_4^+ concentrations and DOC vs. DIN concentrations (Fig. 6). Our study provides experimental

640   evidence to support the hypothesis that redox gradients are a major driver of NO_3^-:NH_4^+ and

641   DOC:DIN ratios, which will increase in oxic conditions and decrease in anoxic conditions

642   (Helton et al. 2015). On the other hand, our work finds only partial support for earlier findings of

643   lower TOC:TP and TN:TP ratios in reservoirs than natural lakes in an analysis of ~1000 U.S.

644   waterbodies, which was attributed in part to a greater incidence of anoxia in reservoirs

645   (Maranger et al. 2018). Median TOC:TP and TN:TP ratios in the reservoirs of that study were

646   417 and 38, respectively, which are similar to the ratios observed in FCR (Fig. 6b,g). While

647   anoxia decreased TOC:TP ratios (Fig. 6b), it also increased TN:TP ratios (Fig. 6g), suggesting

648   that anoxia is not responsible for all differences in stoichiometry between reservoirs and natural

649   lakes. Our results indicate that individual waterbodies' responses to anoxia may be dependent on

650   the dominance of NO_3^- vs. NH_4^+ in their DIN pool prior to the onset of anoxia: if NO_3^-

651   dominates, then TN:TP ratios will likely decrease with anoxia, while if NH_4^+ dominates, then

652   TN:TP ratios will likely increase. In general, most lakes tend to have higher NO_3^- than NH_4^+

653   concentrations (Quirós 2003, Leoni et al. 2018), suggesting that anoxia may result in lower

654   TN:TP ratios in most waterbodies.

655

656   *Opportunities and challenges of our whole-ecosystem approach*

657   Our coupled field manipulation and modeling study provided a powerful approach for

658   quantifying freshwater ecosystem responses to anoxia. By focusing on the same reservoir

659   experiencing different oxygen conditions over multiple years, we were able to isolate the effects

660   of oxygen on C, N, and P cycling without having to disentangle ecosystem-specific responses

661   (e.g., if we were comparing across multiple waterbodies). Ideally, we would have run the

662   REDOX field manipulation with multiple summers of continuous oxygenation and multiple

663   summers of no oxygenation to contrast hypolimnetic conditions. However, we were constrained

664   in our manipulation as the reservoir was an active drinking water source during the study,

665   necessitating us to activate the oxygenation system every summer for the preservation of water

666   quality. Consequently, we used the calibrated ecosystem model to simulate the biogeochemistry

667   of continuously oxygenated and never-oxygenated scenarios, which uniquely enabled us to

668   compare the effect of oxygenation while holding all other factors constant, such as temperature

669   (Fig. 4a). The similar biogeochemical responses to anoxia between the non-oxygenated vs.

670   oxygenated field data and the anoxic vs. oxic model scenarios support our integrated study

671   approach and the robustness of our findings (e.g., Fig. 5, Fig. S2).

672   The simulation model provided insights to reservoir responses to anoxia that would have

673   been challenging to glean from field observations alone. We used the model to calculate whole-

674   ecosystem rates that are impossible to measure in the field (e.g., daily POC burial), determine the

675   relative importance of different processes for biogeochemical budgets, and quantify how

676   processes changed in anoxic vs. oxic conditions. While the model's biogeochemical rates were

677   determined from automated optimization and calibration of numerical simulation parameters,

678   they fall within reasonable ranges of biogeochemical rates observed in the field, supporting our

679   model results. For example, hypolimnetic sediment flux chamber measurements that were

680   collected in FCR in summer 2018 measured a mean sediment oxygen demand of ~20 mmol m^{-2}

681   d^{-1} (range 8-37.5 mmol m^{-2} d^{-1}), which compares well with our calibrated hypolimnetic flux of

682   29 mmol m^{-2} d^{-1} (Krueger et al. 2020). That study also measured NH$_4^+$, DRP, and DOC fluxes

683   from the sediment into the water column as the chambers became anoxic, with calculated release

684   rates up to 2.7 mmol NH$_4^+$ m^{-2} d^{-1}, 0.01 mmol DRP m^{-2} d^{-1}, and 14 mmol DOC m^{-2} d^{-1}

685   (Supporting Information Text 1). These numbers are consistent with our maximum calibrated

686   rates of 2.8 mmol NH_4^+ m^{-2} d^{-1} and 0.02 mmol DRP m^{-2} d^{-1} (Carey et al. 2022a). Our maximum

687   calibrated rate for DOC sediment flux, 1.4 mmol DOC m^{-2} d^{-1}, is an order of magnitude lower

688   than the field data, suggesting that our modeled sediment flux rate of DOC was likely

689   conservative.

690   We note several limitations to our study that should be considered. First, FCR is a small

691   reservoir (0.119 km^2). However, its size is representative of many U.S. reservoirs: 72% of the

692   reservoirs in the U.S. National Inventory of Dams have the same surface area or smaller (NID

693   2021). Second, we focused on the hypolimnion of FCR as a reactor in which we could isolate

694   coupled biogeochemical processes occurring during summer stratification, when C, N, and P

695   processing rates are usually at their highest due to warm temperatures. This focus on the

696   hypolimnion precluded the analysis of other important processes that can have large effects on

697   biogeochemical cycling in the epilimnion (e.g., photodegradation). Third, FCR has a

698   hypolimnetic withdrawal, which results in increased downstream export of hypolimnetic water

699   from the reservoir. While export of hypolimnetic water is limited in many naturally formed

700   lakes, hypolimnetic withdrawals are very common in reservoirs that provide drinking water,

701   hydropower, and flood risk protection (Hayes et al. 2017), which represent a large proportion of

702   the reservoirs in the U.S. (NID 2021). Fourth, similar to many other lake modeling studies (e.g.,

703   Kara et al. 2012, Farrell et al. 2020, Ward et al. 2020), it was challenging to model NO_3^- and

704   DRP. For these solutes in particular, most of the variation in observations was within the limit of

705   quantitation (Supporting Information Text 2), indicating that the model should not necessarily be

706   penalized for the low performance in its evaluation metrics. Despite these challenges, the N and

707   P parameters used for modeling FCR are consistent with other applications of the GLM-AED for

708   other lakes (e.g., Kara et al. 2012, Farrell et al. 2020, Ward et al. 2020), and overall, we were

709   generally able to recreate observed physical, chemical, and biological dynamics in both the

710   epilimnion and hypolimnion (Fig. 3, Fig. S3, Fig. S4). Moreover, the similar results between the

711   anoxic vs. oxic model scenarios and the field data from contrasting non-oxygenated vs.

712   oxygenated summer days (Fig. 5, Fig. S2) support our approach and overall results.

713

714   *Conclusions*

715   The duration, prevalence, and magnitude of anoxia in the bottom waters of lakes and

716   reservoirs are increasing globally (Butcher et al. 2015, Jenny et al. 2016a, Jane et al. 2021).

717   While low oxygen conditions are typically thought of as a response to land use and climate

718   change (Jenny et al. 2016b, Jane et al. 2021), our analysis demonstrates that low oxygen can also

719   be a *driver* of major changes to freshwater biogeochemical cycling.

720   Importantly, our work indicates that anoxia may alter the ability of freshwater ecosystems

721   to serve as sinks of C, N, and P in the landscape. Consequently, while hypolimnetic anoxia is a

722   result of increased C, N, and P loading into a waterbody, we also show that it may serve as an

723   intensifying feedback that increases anoxia in downstream waterbodies. This is evident in our

724   study, as we found significantly higher fluxes of C, N, and P downstream when FCR was

725   exhibiting anoxic vs. oxic conditions during the summer. Anoxia thus has the potential to both

726   degrade the water quality of a low-oxygen waterbody as well as its downstream waterbodies.

727   While more data are needed to evaluate the consequences of this feedback on downstream water

728   quality, we hypothesize that it could be an important process affecting water quality in some

729   freshwater ecosystems and necessitate greater treatment of water extracted for drinking. Given

730   the vital role that inland waters play in removing C, N, and P from downstream export (Harrison

731   et al. 2009, Powers et al. 2016, Maranger et al. 2018), an increased prevalence and duration of

732 anoxia in lakes and reservoirs will likely have major effects on global C, N, and P budgets as

733 well as water quality and ecosystem functioning.

734

745

746 **Author contributions:**

747 Conceptualization: CCC, PCH, MES; Data curation: CCC, ABG, AGH, ASL, MEL, RPM,

748 HLW, WMW, BRN; Formal analysis: CCC, PCH, RQT; Investigation: CCC, ABG, AGH, ASL,

749 MEL, RPM, HLW, WMW, BRN, MES; Methodology: CCC, PCH, RQT; Project administration:

750 CCC; Software: RQT; Visualization: CCC, ASL, RPM, WMW, AGH, HLW; Supervision: CCC,

751 MES; Writing-original draft: CCC, MEL, BRN, AGH; Writing-review & editing: CCC, PCH,

752 RQT, ABG, AGH, ASL, MEL, RPM, HLW, WMW, BRN, MES

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Table 1. Goodness-of-fit (GOF) metrics for comparing observations and modeled GLM-AED output for Falling Creek Reservoir, VA, USA. GOF metrics include root mean square error (RMSE), percent bias (PBIAS%), coefficient of determination (R^2), and normalized mean absolute error (NMAE); *n* is the number of observed measurements. Each GOF metric was calculated comparing model outputs and observational data for the water column for the Full simulation (2013-2019); Calibration (2013-2018); and Validation (2018-2019); see Supporting Information Text 3 for details. Evaluated parameters include temperature (Temp, ºC), summer thermocline depth (TD, m), dissolved oxygen (mmol m^{-3}), dissolved organic carbon (DOC, mmol m^{-3}), total nitrogen (TN, mmol m^{-3}), ammonium (NH$_4^+$, mmol m^{-3}), nitrate (NO$_3^-$, mmol m^{-3}), total phosphorus (TP, mmol m^{-3}), and dissolved reactive phosphorus (DRP, mmol m^{-3}).

Time period	Parameter	Temp	TD	Oxygen	DOC	TN	NH$_4^+$	NO$_3^-$	TP	DRP
Full simulation	*n*	3639	324	3726	1277	1518	1277	1485	1724	1271
	RMSE	1.41	0.8	49.1	63.2	5.9	2.81	0.16	0.29	0.05
	PBIAS%	4.4	0.1	6.4	-14.5	-6.2	22.5	9.8	-31.7	26.5
	R^2	0.95	0.50	0.72	0.30	0.71	0.77	0.27	0.25	0.10
	NMAE	0.09	0.18	0.15	0.2	0.22	0.46	0.45	0.38	0.37
Calibration	*n*	3164	284	3251	1018	1250	1018	1014	1456	1012
	RMSE	1.39	0.9	45.9	61.5	5.0	2.81	0.16	0.25	0.04
	PBIAS%	3.3	-1.4	5.8	-16.8	-0.8	40.7	11.7	-29.6	21.1
	R^2	0.95	0.46	0.71	0.46	0.58	0.63	0.33	0.15	0.24
	NMAE	0.09	0.19	0.14	0.19	0.19	0.61	0.44	0.33	0.28
Validation	*n*	475	40	475	259	268	259	471	268	259
	RMSE	1.48	0.4	62.8	70.4	9.23	2.79	0.14	0.33	0.08
	PBIAS%	11.2	10.5	9.9	-4.2	-19.8	-7.2	3.3	-42.9	51.6
	R^2	0.97	0.95	0.74	0.52	0.94	0.94	0.12	0.85	0.03
	NMAE	0.12	0.1	0.2	0.24	0.36	0.22	0.49	0.38	0.57

Figure legends

Fig. 1. Conceptual diagram of the dominant carbon, nitrogen, and phosphorus cycling processes in oxic (top) and anoxic (bottom) conditions in the water column of a thermally stratified reservoir. Carbon processes include cycling of carbon dioxide (CO_2), dissolved organic carbon (DOC), methane (CH_4), and particulate organic carbon (POC). Nitrogen processes include cycling of dissolved organic nitrogen (DON), nitrogen gas (N_2), ammonium (NH_4^+), nitrate (NO_3^-), and particulate organic nitrogen (PON). Phosphorus processes include cycling of dissolved organic phosphorus (DOP), dissolved reactive phosphorus (DRP), and particulate organic phosphorus (POP). Processes are denoted by arrows.

Fig. 2. Map of Falling Creek Reservoir, Vinton, VA, USA (37.303479, -79.837371). The map shows the reservoir watershed, locations of the two inflow streams (Falling Creek and Tunnel Branch), dam, hypolimnetic oxygenation (HOx) system, and monitoring site near the dam.

Fig. 3. The model was able to generally recreate observed reservoir dynamics. Modeled (black line) and observed (red points) hypolimnetic (9 m) water temperature (a), dissolved oxygen (b), dissolved organic carbon (DOC; c), total nitrogen (TN; d), ammonium (NH_4^+; e), nitrate (NO_3^-; f), total phosphorus (TP; g), and dissolved reactive phosphorus (DRP; h) in Falling Creek Reservoir (goodness-of-fit metrics presented for the full water column in Table 1). The grey shaded areas in panel (b) represent the periods and addition rates of oxygen injection into the hypolimnion from the hypolimnetic oxygenation system (HOx) during the seven-year field manipulation. Note varying y-axes among panels, and that many of the NO_3^- and DRP observations were below the limit of quantitation in laboratory analysis (0.11 and 0.08 mmol m^{-3}, respectively).

Fig. 4. Time series of oxic (blue) and anoxic (red) model scenarios in Falling Creek Reservoir. Model results are shown for hypolimnetic (9 m) water temperature (a), dissolved oxygen (b), total organic carbon (TOC; c), dissolved organic carbon (DOC; d), total nitrogen (TN; e), dissolved inorganic nitrogen (DIN, the sum of ammonium and nitrate; f), ammonium (NH_4^+; g), nitrate (NO_3^-; h), total phosphorus (TP; i), and dissolved reactive phosphorus (DRP; j). In the oxic scenario, oxygen was injected into the hypolimnion throughout the thermally stratified period each summer. In the anoxic scenario, no oxygen was added to the hypolimnion, resulting in prolonged hypolimnetic anoxia each summer. Note varying y-axes among panels.

Fig. 5. Anoxia significantly altered bottom-water concentrations of carbon, nitrogen, and phosphorus. Median hypolimnetic (9 m) total organic carbon (TOC; a), dissolved organic carbon (DOC; b), total nitrogen (TN; c), dissolved inorganic nitrogen (DIN; d), ammonium (NH_4^+; e), nitrate (NO_3^-; f), total phosphorus (TP; g), and dissolved reactive phosphorus (DRP; h) concentrations between anoxic (red) and oxic (blue) scenarios during Falling Creek Reservoir's stratified period (July 15 - October 1) for all years of this study. The grey points are the median values from each of the seven years. The **** denotes that the difference between the median summer anoxic and oxic scenario concentrations was highly statistically significant (all paired t-tests $p \leq 0.0001$, see Table S3 for statistics). Note varying y-axes among panels.

Fig. 6. Anoxia significantly affected water column stoichiometry. Total and dissolved molar ratios of hypolimnetic (9 m) total organic carbon:total nitrogen (TOC:TN; a), TOC:total phosphorus (TOC:TP; b), dissolved organic carbon:dissolved inorganic nitrogen (DOC:DIN; c), DOC:ammonium (DOC:NH_4^+; d), DOC:nitrate (DOC:NO_3^-; e), DOC:dissolved reactive phosphorus (DOC:DRP; f), TN:TP (g), and DIN:DRP (h) between anoxic (red) and oxic (blue) scenarios during Falling Creek Reservoir's stratified period (July 15 - October 1) for all years of this study. The grey points are the median values from each of the seven years. Because NO_3^- concentrations in the anoxic scenario were functionally zero, the ratio of DOC:NO_3^- could not be calculated (hence the X in panel e). The asterisks denote the p-values from paired t-tests comparing the median summer ratios between anoxic and oxic scenarios: **** $p < 0.0001$, *** $p < 0.001$, ** $p < 0.01$, and * $p < 0.05$ (see Table S4 for statistics). Note varying y-axes among panels.

Fig. 7. Sediment fluxes dominated the responses of dissolved carbon, nitrogen, and phosphorus to anoxia. Comparison of the dominant biogeochemical processes altering dissolved pools of carbon (dissolved organic carbon, DOC; a), nitrogen (ammonium, NH_4^+, and nitrate, NO_3^-; b), and phosphorus (dissolved reactive phosphorus, DRP; c) in the hypolimnion of Falling Creek Reservoir under anoxic vs. oxic model scenarios. Rates shown represent the median contribution of each process to hypolimnetic concentrations of DOC, NH_4^+, NO_3^-, and DRP during Falling Creek Reservoir's summer stratified period (July 15 - October 1) for all years of this study. Positive rates indicate that the process increased hypolimnetic concentrations; negative rates indicate that the process decreased hypolimnetic concentrations. Mineralization is shown separately for both labile (labl.) and recalcitrant (recalc.) dissolved organic pools, and denitrification is partitioned for the water column (WC denitrification) and sediment in the NO_3^- panel (Sediment flux). Note the varying y-axes among panels and that some rates are so small that they are not visible in the figure; Fig. S5 shows a modified version of this figure with the sediment fluxes excluded.

Fig. 8. Anoxia significantly increased the downstream export of carbon, nitrogen, and phosphorus. Percent downstream export (% flux) of total organic carbon (TOC; a), dissolved organic carbon (DOC; b), total nitrogen (TN; c), dissolved inorganic nitrogen (DIN; d), ammonium (NH_4^+; e), nitrate (NO_3^-; f), total phosphorus (TP; g), and dissolved reactive phosphorus (DRP; h) inputs into Falling Creek Reservoir for anoxic (red) and oxic (blue) model scenarios during the stratified period (July 15 - October 1) for all years of this study. Flux values of 0 (denoted by dashed horizontal lines) indicated that the reservoir inputs balanced exports; flux values <0 indicated that the reservoir was a net sink of C, N, or P; and flux values >0 indicated that the reservoir was a net source of C, N, or P downstream. The grey points are the median values from each of the seven years. The asterisks denote the p-values from paired t-tests comparing the median summer retention in anoxic and oxic scenarios: **** $p < 0.0001$, *** $p < 0.001$, and ** $p < 0.01$ (see Table S5 for statistics). Note varying y-axes among panels.

Fig. 9. Median summer downstream export of total organic carbon (C), total nitrogen (N), and total phosphorus (P) inputs under oxic (top) and anoxic (bottom) conditions. The "% of inflow" value represents the percent of inflowing C, N, and P into the reservoir that is exported downstream. A value of 100% indicates that reservoir inputs balanced exports; values <100% indicated that the reservoir was a net sink of C, N, or P; and values >100% indicated that the
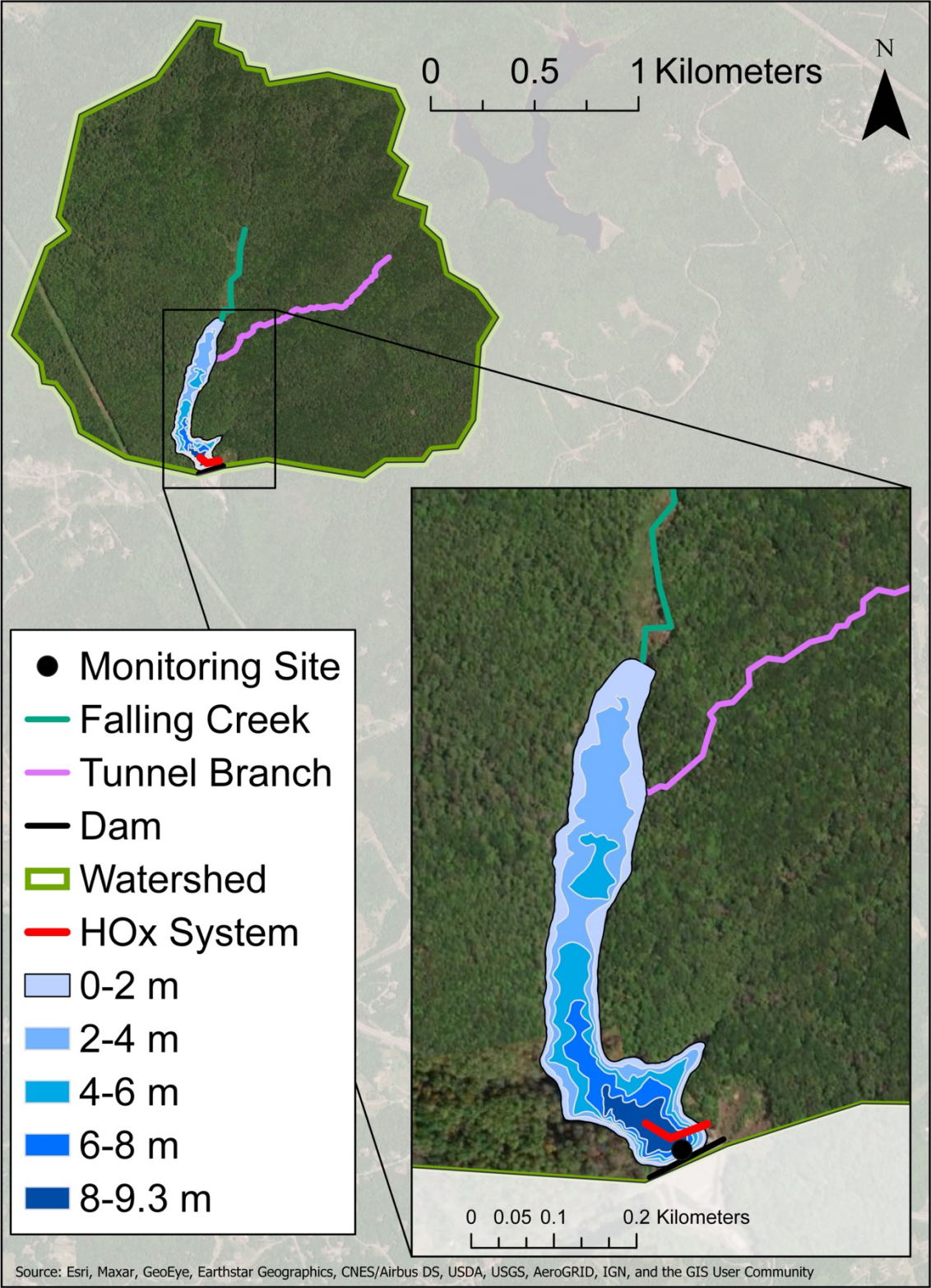
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1153 reservoir was a net source of C, N, or P downstream. Arrow widths are scaled to be proportional
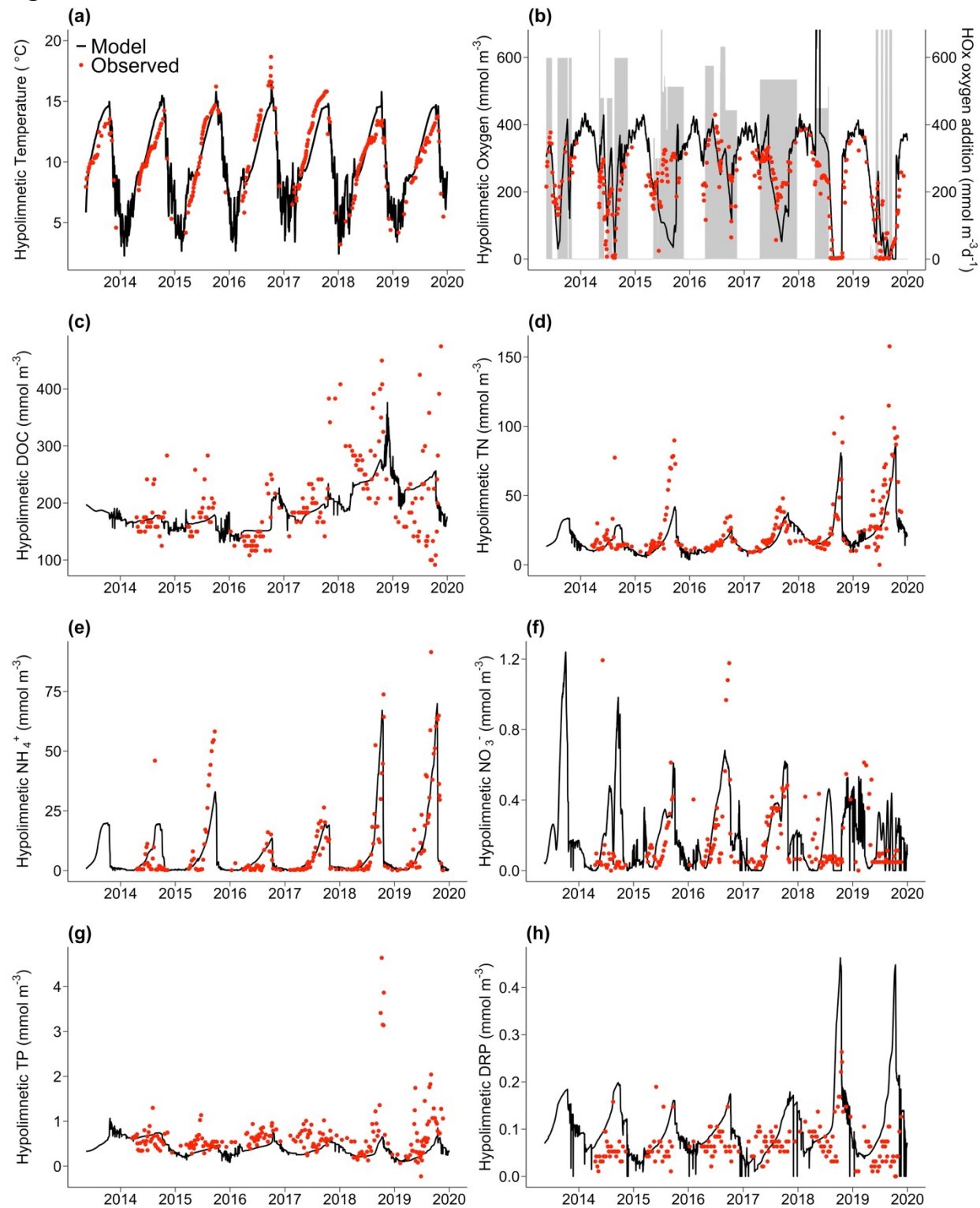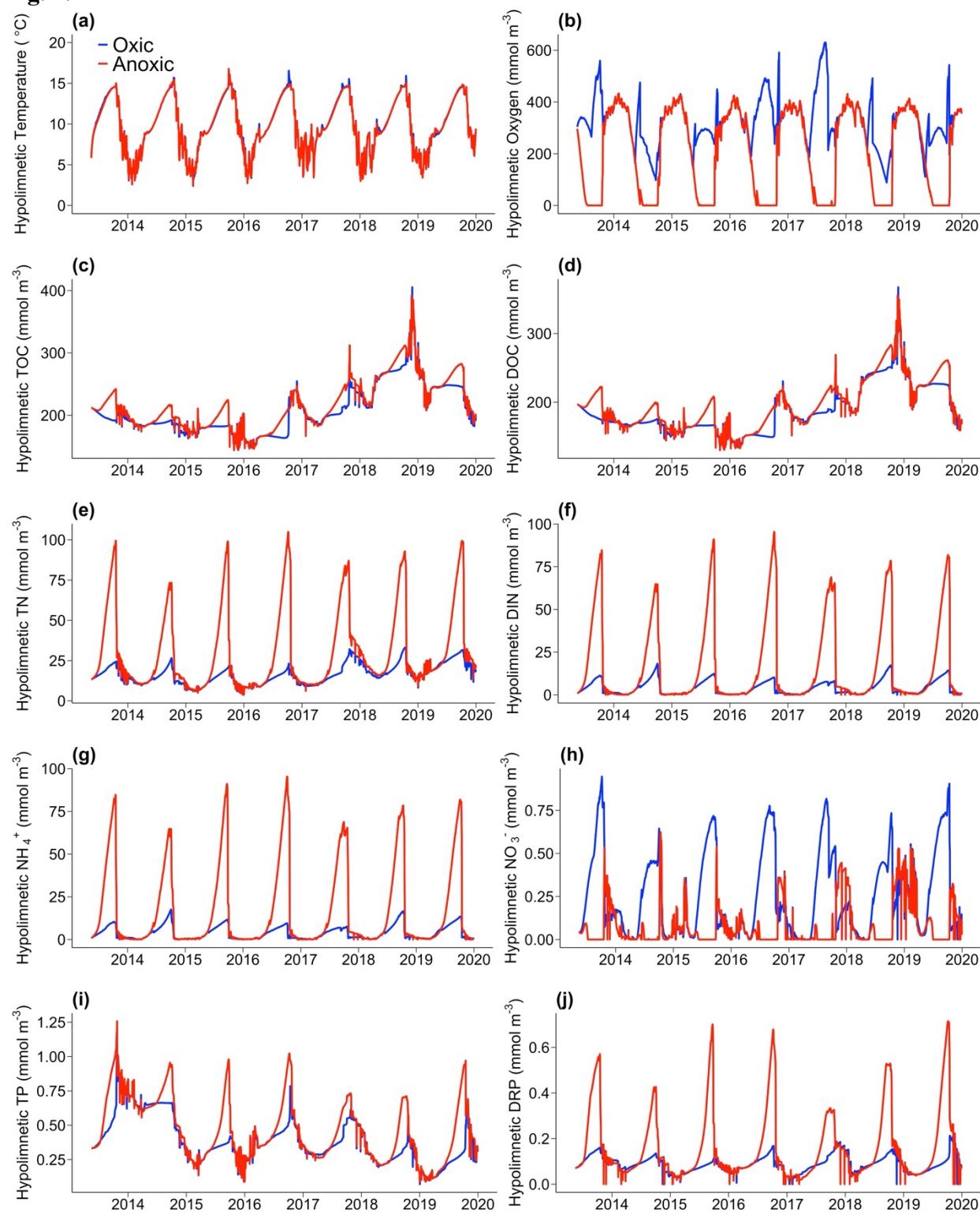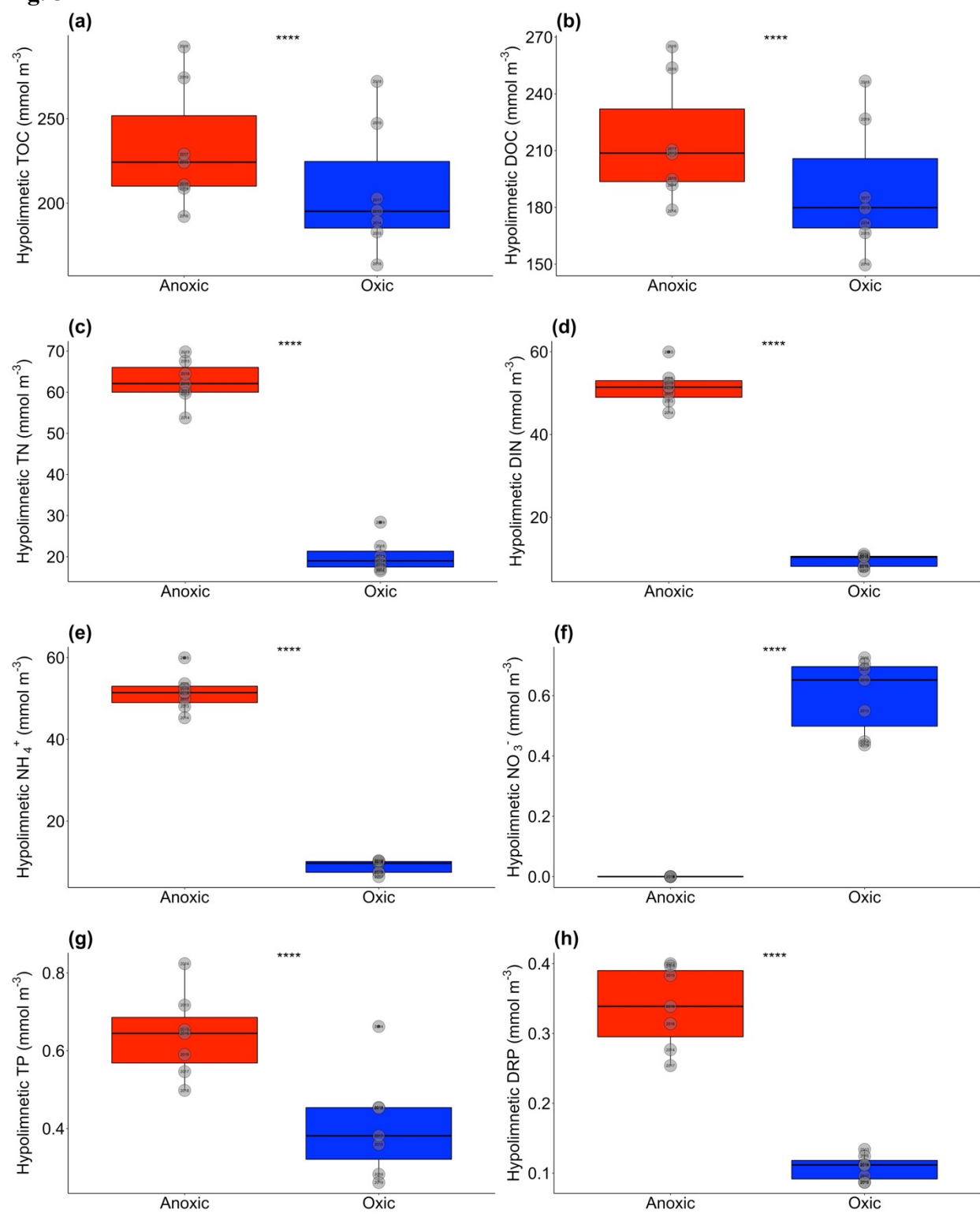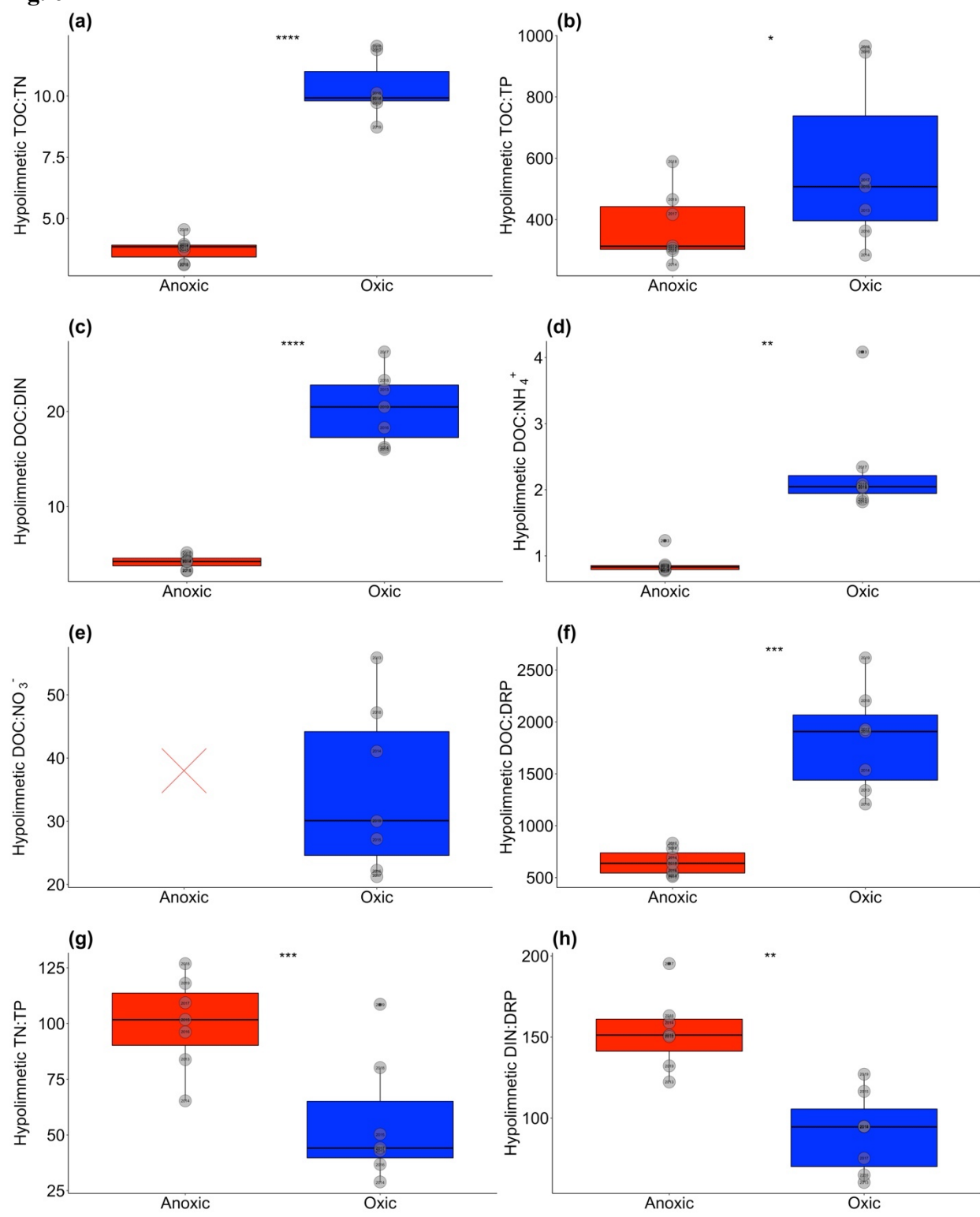1154 to the median downstream export of each element.
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Fig. 1

Oxic

Anoxic

Emission
Fixation
Hydrolysis
Mineralization
Immobilization
Sediment flux
N-specific processes

1159   **Fig. 2**

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1162   **Fig. 3**

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1165 **Fig. 4.**

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1168   **Fig. 5**

1171   **Fig. 6**

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Fig. 7

(a) Carbon

(b) Nitrogen

(c) Phosphorus

1176   **Fig. 8**

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1179 **Fig. 9**

Oxic

C — 92% of inflow

N — 204% of inflow

P — 78% of inflow

Anoxic

C — 105% of inflow

N — 553% of inflow

P — 123% of inflow

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