

1 Costs and benefits of toxin production in a dinoflagellate

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Abstract

3 Many phytoplankton respond to chemical cues from grazers by upregulating defensive
4 capabilities. Inducible defences like these are often assumed to come at a cost to the
5 organism, but these trade-offs have not been experimentally established. A reason for this
6 may be that costs only become evident under resource limiting conditions. Here, we exposed
7 the toxin-producing dinoflagellate *Alexandrium minutum* to chemical cues from copepods
8 under different levels of nitrogen limitation. Induced cells had higher cellular toxin content
9 and a larger fraction of the cells were rejected by a copepod, demonstrating the clear benefits
10 of toxin production. Induced cells also had a higher carbon and nitrogen content, despite an
11 up to 25% reduction in cell size. Unexpectedly, induced cells seemed to grow faster than
12 controls, likely owing to a higher nutrient affinity due to reduced size. We thus found no clear
13 trade-offs, rather the opposite. However, we argue that indirect ecological costs that do not
14 manifest under laboratory conditions are important and that the induction of toxins specific to
15 particular defences prevents the cells from constantly synthesizing the large array of
16 secondary metabolites that they are capable of producing.

Introduction

17 Dinoflagellates of the genus *Alexandrium* produce paralytic shellfish toxins (PSTs),
18 intracellular secondary metabolites that may have defensive capabilities (Selander *et al.* 2006;
19 Xu & Kiørboe 2018). Indeed, toxicity as a defence mechanism against grazers is the favoured
20 explanation for the evolution of algal toxins (Turner & Tester 1997; Smetacek 2001; Xu &
21 Kiørboe 2018).

22 Studies dedicated to defence mechanisms in phytoplankton have often focused on the benefits
23 of the defence, but have rarely established potential costs (Pančić & Kiørboe 2018). So far,
24 many experimental assessments have suggested toxin production trade-offs to be
25 insignificant. Thus, the growth rate of toxic and non-toxic strains of the same species, or the
26 growth of grazer-induced versus non-induced cells of the same strain but with very different
27 toxin contents appear to be identical (John & Flynn 2000; Selander *et al.* 2006, 2008).

28 Blossom *et al.* (2019) compared several species and strains of *Alexandrium* spp. and similarly
29 did not find any correlation between growth rate and toxin production under light replete
30 conditions, and even a positive correlation under limiting light. Brown & Kubanek (2020)
31 demonstrated a negative relation between toxin content and growth rate in *Alexandrium*
32 *minutum* exposed to lysed cells of various other species of dinoflagellates, thus suggesting a
33 trade-off. However, the correlation may well have been spurious and driven independently by
34 allelochemical substances in the lysed cells (Windust *et al.* 1996). It is well documented that
35 many dinoflagellates produce such dissolved allelochemicals that reduce the growth rate of
36 other cells (Legrand *et al.* 2003). Significant costs of predator-induced toxin production have
37 so far only been convincingly demonstrated in diatoms that produce domoic acid, but here the
38 defence mechanisms are unclear (Lundholm *et al.* 2018). However, if defence mechanisms
39 are adaptive there must be associated costs; otherwise, non-defended species or strains would
40 be outcompeted and all species would be equally defended. Also, toxin production is

41 inducible; i.e., it is upregulated in the presence of grazers cues, as seen in *Alexandrium* spp.
42 dinoflagellates (e.g. Selander *et al.* 2006; Bergkvist *et al.* 2008; Griffin *et al.* 2019) and some
43 toxic strains of the diatom *Pseudo-nitzschia* (Lundholm *et al.* 2018; Selander *et al.* 2019).
44 According to optimal defence theory, inducible defences are favoured when risks vary in time
45 and defence costs are significant (Rhoades 1979; Karban 2011). While these costs have likely
46 been reduced through evolution by being selected against, the wide variety of defences found
47 in both marine and terrestrial organisms suggests the presence of influential trade-offs to any
48 beneficial defensive trait (Strauss *et al.* 2002; Agrawal 2011; Pančić *et al.* 2019; Grønning
49 and Kiørboe submitted).

50 The failure of experiments to demonstrate costs may be due to the fact that experimental
51 assessments have often been done under resource replete conditions, while costs may be more
52 significant when resources are deficient (Karban 2011; Pančić & Kiørboe 2018; Kiørboe &
53 Andersen 2019). The PST molecules are high in nitrogen with N:C ratio 4.6 times higher than
54 average phytoplankton materials (Redfield 1958). Numerous studies have shown cell toxin
55 content to be very low in nitrogen depleted cells (e.g. Boyer *et al.* 1987; Leong *et al.* 2004)
56 even when exposed to a grazer threat (Selander *et al.* 2008). Trade-off costs may be trivial
57 when nutrients and light are plentiful, but when available nitrogen is limiting and grazer
58 biomass high, a fitness-optimization resource allocation model suggests a significant growth
59 penalty to toxin production (Chakraborty *et al.* 2019).

60 Here, we quantify the benefits and costs of toxin production in *Alexandrium minutum* under
61 different degrees of nitrogen limitation using both a chemostat approach and classical batch
62 experiments. We induce grazer defences (toxin production) by adding grazer cues
63 (copepodamides; Selander *et al.* 2015) and examine the growth rate response, the toxin
64 production, and the efficiency of the defence by directly video recording the response of
65 copepods to induced and non-induced cells. Following the predictions of the model of

66 Chakraborty *et al.* (2019), we hypothesize that both induced and non-induced cells will be
67 more toxic with increasing nitrogen availability, that the costs of increased toxicity of
68 induced cells will be highest at intermediate nitrogen limitation, and that cells grown in
69 excess of nitrogen will reap full benefit while paying negligible costs.

70 **Material and methods**

71 *Phytoplankton*

72 *Alexandrium minutum* strain GUMACC 83 were grown in B1 medium (Hansen 1989) at
73 salinity 26, 18 °C, and an irradiance of *ca.* 150 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$ on a 12:12 light:dark
74 cycle.

75 *Batch culture experiment*

76 Six batch cultures of exponentially growing *A. minutum* were initiated at *ca.* 200 cells mL^{-1}
77 in 2 L blue-cap glass flasks exposed to *ca.* 150 $\mu\text{mol photons m}^{-2} \text{s}^{-1}$ on a 12:12 light:dark
78 cycle and constant temperature of 18 °C. We used modified B1 medium with a nitrogen
79 concentration of only 60 $\mu\text{M NO}_3^-$ to make sure that the cells eventually would be limited by
80 nitrogen rather than other resources. The cultures were gently bubbled to avoid high pH
81 limiting growth. pH was monitored using a PHM220 Lab pH meter (Radiometer Analytical,
82 France). Three bottles were treated with copepodamides to induce increased toxin production
83 (Selander *et al.* 2015) and three were used as controls. Copepodamides were extracted from
84 freeze dried *Calanus finmarchicus* (Calanus AS, Norway) according to (Selander *et al.* 2015)
85 and exposed to the cultures by coating the inside of the bottle with a copepodamide mixture
86 dissolved in methanol to a final concentration of 2 nM. Due to slow release and rapid
87 degradation the average effective concentration is around 1–2% of the added concentration
88 (Selander *et al.* 2019). The methanol was evaporated using N_2 gas and the cultures transferred
89 into the bottles after gentle mixing. This process was repeated and the culture transferred to a

90 freshly coated flask every 24 hours during the treatment period to assure a continuous
91 exposure to the cues (Selander *et al.* 2019). The controls received the same treatment but with
92 methanol without copepodamides. Samples were taken every or every other day for cell
93 abundance and nitrogen concentration while samples for toxin analysis and cellular carbon
94 and nitrogen were taken at inoculation and then in tandem with the video experiments (see
95 below) six times during the course of the experiment. Initial samples of cellular toxin-,
96 carbon-, and nitrogen content were taken from the stock culture.

97 *Exponentially fed batch culture experiment*

98 While nutrient concentration decline over time from high to limiting in the batch cultures,
99 nutrients concentrations are near constant in a continuous cultures, thus allowing us to
100 examine the effect of grazer induction at low, constant concentrations of nutrients. This may
101 be important because the effect of grazer induction is time-lagged (Prevett *et al.* 2019).
102 Dinoflagellates cannot tolerate vigorous mixing (Berdal et *al.* 2007), and a classical
103 chemostat cannot be used. Instead, we used exponentially fed batch cultures (EFB; Fischer *et*
104 *al.* 2014). The EFB is similar to a chemostat except that there is no continuous outflow. The
105 volume is instead reduced to initial value at each sampling occasion by removing medium
106 and cells manually after gently mixing the culture. Growth medium is added continuously in
107 a constant proportion of the increasing volume of the culture by exponentially increasing the
108 inflow using a computer controllable multichannel peristaltic pump (IPC 16, Ismatec,
109 Germany).

110 Six replicate cultures of *A. minutum* were set up as exponentially fed batch cultures in 1 L
111 blue-cap glass bottles under the same conditions as above. Depending on the dilution rate, the
112 initial culture volume varied between 250–500 mL. Four different dilution rates were used to
113 vary cell growth rate: 0.05, 0.10, 0.20, and 0.40 d⁻¹. The medium was prepared as B1 with

114 reduced (80 μM) NO_3^- in all the experiments except at the 0.10 d^{-1} dilution rate where the
115 NO_3^- concentration was 30 μM . The cultures were gently bubbled and pH was measured
116 daily. At each dilution rate, the cultures were allowed up to ten days to achieve steady state
117 before starting the experimental treatment. In some cases perfect steady-state was not
118 achieved.

119 Copepodamides were exposed to the cultures daily as described above, using a nominal
120 concentration of 0.63 nM. For the 0.2 d^{-1} dilution rate a second experiment was run with a
121 copepodamide concentration of 6 nM. Samples for analysis of cell abundance and size, cell
122 toxin content, cellular carbon and nitrogen, dissolved inorganic nitrogen, and copepod
123 rejection rate were taken daily or every 2–3 days during the 6–10 day treatment period. Using
124 the chemostat equations (Appendix 1) and assuming a maximum growth rate of 0.5 d^{-1}
125 (Flynn *et al.* 1996) and a half saturation constant for nitrate of 0.5 μM (Brandenburg *et al.*
126 2018) the resulting nitrate concentration in the cultures should range from severe nitrogen
127 limitation to saturation.

128 In the continuous cultures, the growth rate is fixed by the dilution rate and any growth rate
129 response will materialize as a change in the steady state concentrations of cells and nutrients.
130 Thus, if the cells respond to a cue by lowering their maximum growth or their affinity then in
131 the chemostat at steady state the concentration of nutrients will increase, and the density of
132 cells decrease in exposed compared to control cultures. The magnitude of the response can be
133 computed from the chemostat equations (Appendix 1).

134 *Cell counts and cell size*

135 Cell concentrations were determined by fixing a small volume of sample in acid Lugol's
136 solution to a final concentration of 1%. The entire chamber or at least 400 cells were counted
137 per replicate in a Sedgewick-Rafter chamber using an inverted microscope (Olympus, Japan).

138 20 random cells from each sample were measured at 400 \times magnification (width-length) and
139 cell volume was estimated by assuming a prolate spheroid shape (Hillebrand *et al.* 1999).
140 Cell growth was calculated using the formula

$$\mu = \frac{\ln C_t - \ln C_0}{\Delta t}, \quad (1)$$

141 where C_t is the cell concentration in units of cell number, biovolume, or cellular nitrogen per
142 volume at the sampling occasion, C_0 is the concentration at the previous sampling occasion,
143 and Δt is the elapsed time in days. The dilution rate was added when calculating growth in
144 the EFB experiments.

145 *Nitrate analysis*

146 Subsamples for analysis of nitrate were filtered through a 0.2- μ m syringe filter, and stored
147 frozen at -20 °C until analysis. Nitrate was analysed by reduction to NO_x with VCl₃ as the
148 reducing reagent (Schnetger & Lehnert 2014) on a Smartchem 200 (AMS Alliance, Italy).
149 Concentrations below 0.5 μ M were measured using an extended cuvette (100 mm, FireflySci,
150 New York, USA) by UV-VIS spectrophometry.

151 *Toxin analysis*

152 Samples (10–120 mL) for cellular toxin contents were filtered onto 25 mm Whatman GF/F
153 glass fiber filters and frozen at -20 °C until extraction. 750 μ L of 0.05 M acetic acid was
154 added and samples were subjected to three cycles of freezing and thawing to lyse cells and
155 extract toxins. The extracts were filtered through a GF/F filter and stored at -20 °C in glass
156 HPLC vials until analysis. The samples from the batch experiment and the 0.2 d⁻¹ dilution
157 rate experiments (both low and high dose) were analysed with isocratic ion-pair
158 chromatography followed by post column derivatization and fluorescent detection (Asp *et al.*
159 2004). We used a reversed phase C18 column (150 \times 4 mm C18, 5 μ m, Dr. Maisch GmBH,

160 Germany). Samples from the 0.05, 0.10, and 0.40 d⁻¹ dilution rate experiments were analyzed
161 with mass spectrometric (MS/MS) detection on an Agilent 1200 HPLC system coupled to an
162 Agilent 6470 triple quadrupole detector with electrospray interface (Agilent Technologies,
163 California, USA) equipped with a SeQuant zwitterionic hydrophilic interaction column (ZIC-
164 HILIC, 2.1×150 mm, 5 µm, Merck, Germany) following the methods of (Turner & Tölguesi
165 2019).

166 This particular strain of *A. minutum* is known to only produce gonyautoxins (GTX) 1–4
167 (Franco *et al.* 1994; Selander *et al.* 2006). GTX standards 1–4 were obtained from the
168 National Research Council Canada (Halifax, Canada).

169 *Cellular carbon and nitrogen*

170 Samples for cellular C and N were filtered onto pre-combusted (550 °C, 2 hours) 13 mm
171 GF/C filters, packed in tin capsules and dried for 24 hours at 60 °C. The samples were kept
172 dry at room temperature in a desiccator until analysis with a Thermo Scientific Flash 2000
173 Organic Elemental Analyzer (Thermo Scientific, Massachusetts, USA).

174 *Copepod feeding response*

175 We directly observed individual copepod-cell interactions and recorded the fraction of
176 captured cells that were rejected. We used the feeding-current feeding copepod *Temora*
177 *longicornis* from a continuous culture that was maintained on a phytoplankton diet consisting
178 of *Rhodomonas salina*, *Thalassioria weissflogii*, *Heterocapsa triquetra*, and *Oxyrrhis*
179 *marina*.

180 Adult female copepods were tethered to a human hair by their dorsal surface using
181 cyanoacrylate-based super glue (Xu *et al.* 2017). The tethered copepods were starved
182 overnight in darkness at the same temperature (18 °C) and salinity as the cultures (26) before

183 used for experiments. The tethered copepods are seemingly unaffected by the tethering and
184 can live for many days while feeding, defecating, and producing eggs.

185 The feeding experiments took place in darkness. The untethered end of the hair was glued to
186 a needle attached to a micromanipulator. The copepod was submerged in a $10 \times 10 \times 10 \text{ cm}^3$
187 aquarium and *Alexandrium* cells were added to a final concentration of $100\text{-}200 \text{ cells mL}^{-1}$.
188 The experiment started when cells were added. A new copepod was used for each replicate
189 culture. The water was gently mixed by a magnetic stirrer to keep the cells suspended. Three
190 10 minute sequences (0-10 minutes, 25-35 minutes, and 50-60 minutes) of 24 fps footage was
191 recorded during a one hour period using a high speed camera (Phantom V210; Vision
192 Research, New Jersey, USA) connected to a computer. The camera was equipped with lenses
193 to get a field of view of $1.3 \times 1 \text{ mm}^2$. The video sequences were analysed to quantify prey
194 capture, ingestion, and the fraction of cells that were rejected by the copepod (Xu *et al.*
195 2017).

196 *Statistical analysis*

197 The effect of the copepodamide treatment in the batch experiment was analysed using a
198 generalized additive mixed model (GAMM) in the ‘*gamm4*’ R package (Wood & Scheipl
199 2020). ‘Treatment’ and ‘Time’ were used as fixed effects and ‘Replicate’ as the random
200 effect.

201 To analyse the effect of the copepodamide treatment in the chemostat experiments, we used a
202 linear mixed effects model with ‘Time’, ‘Treatment’, and ‘Dilution rate’ as fixed effects, and
203 ‘Replicate’ as the random effect, in the ‘*lmerTest*’ R package (Kuznetsova *et al.* 2017). The
204 analysis of the repeated ‘High’ copepodamide dose experiment was done separately.
205 Significant differences between treatments were assessed through pairwise comparisons by
206 estimated marginal means using the Satterthwaite degrees of freedom method. The random

207 effect had a variance component that was close to zero when analysing some variables, but
208 was retained in the model to incorporate the dependency of the response variable on the
209 replications. Some variables were log-transformed to homogenize variances. Statistical tests
210 were considered significant at the 0.05 level and are summarized in Appendix Tables S1, S2,
211 S5 and S6.

212 **Results**

213 Dinoflagellate concentrations and growth rates are in the following mainly reported in terms
214 of cell number concentration (cells mL^{-1}) and cell contents of C, N, and toxins on a per cell
215 basis. Concentrations and growth rate in terms of cell volume concentration ($\mu\text{m}^3 \text{mL}^{-1}$) and
216 the more sparsely monitored cellular nitrogen concentration ($\mu\text{g N mL}^{-1}$) are reported in the
217 online Appendix.

218 *Batch-culture experiment*

219 Induced cultures grew faster than un-induced ones during the exponential phase and reached
220 the stationary phase after around 14 days as the inorganic nitrogen in the cultures became
221 depleted (Fig. 1A-C). The available nitrate in the culture medium was therefore used up at a
222 higher rate in the induced treatment (Fig. 1C), because cell accumulation rate in terms of
223 cellular nitrogen was also faster in induced than in un-induced cultures (Appendix 2 Fig. S1).
224 Cellular nitrogen content and cell sizes initially increased and then decreased as nutrients
225 were exhausted and growth ceased, but induced cells had a significantly higher nitrogen
226 content (Fig. 1D) and were significantly smaller (Fig. 1G) than un-induced cells during the
227 exponential growth phase before converging again with control values after 10 and 16 days,
228 respectively. Cellular carbon content was significantly higher in induced than in un-induced
229 cells (Fig. 1E). The differences in cellular C and N contents between induced and un-induced
230 cultures are even more pronounced when normalized to cell volume (Appendix 2 Fig. S1).
231 The carbon to nitrogen ratio increased over time as nitrate resources were exhausted but

232 faster and to higher values in the induced treatment (Fig. 1F). Overall, cellular nitrogen
233 content increased and cellular carbon content decreased with increasing growth rate and the
234 contents of both nitrogen and carbon were higher in induced cells (Fig. 2, Appendix Table
235 S2).

236 Cell toxicity (320% increase relative to controls) peaked after six days of exposure in the
237 induced treatments, after which it decreased throughout the rest of the exponential phase (Fig.
238 1H). Toxin production essentially reached zero after 14 days but cell toxicity remained stable
239 at around 20 fmol cell⁻¹ due to the low cell division rates. In the control treatment, cell
240 toxicity followed the same temporal patterns but was throughout lower than in induced cells
241 (Fig. 1H). Finally, a significantly higher fraction of induced than un-induced cells were
242 rejected by copepods, demonstrating a clear benefit (Fig. 1I).

243 *Exponentially fed batch culture experiment*

244 Cells in the 0.05, 0.10, and 0.40 d⁻¹ dilution rate experiments grew at lower rates than the
245 dilution rate and cell concentrations thus decreased over time (Fig. 3). It was only in the two
246 0.20 d⁻¹ dilution rate experiments that the cells were able to keep up with the dilution rate
247 (Fig. 3C). However, cell concentrations expressed in terms of cellular nitrogen per culture
248 volume were near constant over times at the three lowest dilution rates, and the growth rates
249 were similar to dilution rate except at the lowest and highest dilution rates (Figure 4D,
250 Appendix 2 Fig. S2). Cell concentrations in nitrogen units were similar between induced and
251 un-induced cultures at the highest dilution rate, but were generally higher in induced vs un-
252 induced cultures at the lower dilution rates, suggesting higher growth rate or affinities of
253 induced cells at limiting nutrient concentrations. The difference was significant only at the
254 lowest dilution rate. Thus, if anything induced cells grow slightly faster, not slower, than un-
255 induced cells at limiting nitrogen concentrations, consistent with the result of the batch

256 experiment. The small differences in cell concentrations and the low sensitivity of estimates
257 of affinity and maximum growth rate parameters to changes in cell concentration at low
258 dilution rates makes the estimation of these parameters meaningless (Appendix 1).

259 Induced cells were significantly smaller than un-induced cells at intermediate dilution rates
260 but similar at the lowest and highest rates, consistent with the pattern in the batch experiment.
261 (Figure 4C). Cellular carbon increased and nitrogen contents decreased with growth rate and
262 both were significantly higher in induced than un-induced cells, particularly at intermediate
263 dilution rates (Figure 4G, H, Fig. 2). Cellular C:N ratio varied inversely with dilution rate and
264 were slightly higher in induced than un-induced cells, all again consistent with the patterns in
265 the batch experiment (Figure 4I, Fig. 2). As in the batch experiment, effects were more
266 pronounced when expressed on a per volume basis (Appendix 2 Table S3, S4). The effect of
267 varying the copepodamide dose from low (0.63 nM) to high (6 nM) in the 0.2 d^{-1} dilution
268 rate experiment had a significant effect on (reduced) cell volume and also further increased
269 toxin content relative to the controls (Fig. 4C, F).

270 Cells increased their toxicity per cell in all but the 0.05 and 0.10 d^{-1} experiments in response
271 to the copepodamides (Fig. 4F) (The low toxicity in the 0.10 d^{-1} experiment is inconsistent
272 with the high cellular nitrogen content and the high cell rejection rates; we suspect that the
273 analysis is flawed). Consequently, the copepods generally rejected a larger fraction of
274 induced cells, except at the lowest dilution rate (Fig. 4J; Appendix 2 Table S5). Overall, the
275 fraction of rejected cells increased with increasing toxin content but the effect saturates at a
276 rather low toxin content of ca. $20 \text{ fmol GTX cell}^{-1}$ (Fig. 5).

277 **Discussion**

278 We set out to quantify the costs and benefits of toxin production in a dinoflagellate by
279 comparing the performance of cells induced to express their defence with those that were not,

280 and under different degrees of nitrogen limitation. Our experiments produced increasing
281 nitrogen limitation with decreasing growth rates, in both batch and continuous cultures, as
282 demonstrated by the relations between cellular nitrogen contents of the cells and their growth
283 rate (Fig. 2A, C). We have utilized that toxin production in many dinoflagellates, including *A.*
284 *minutum*, can be induced by grazer cues (Selander *et al.* 2006, 2015), thus allowing us to
285 examine the same strain under different conditions. This is important because different strains
286 of the same species may differ in many traits, including in their toxin profiles (e.g. Franco *et*
287 *al.* 1994; Wohlrab *et al.* 2017). We note also that we examine the ‘private good’ grazer
288 deterrent effect of the defence at the level of the individual. That is, we quantify the benefits
289 that the individual cell that produces the toxin may enjoy. This is different from any toxic
290 effects on the copepod that reduces its ability to graze on further cells, which is a ‘public
291 good’ (Driscoll *et al.* 2015). We had predicted that both benefits and costs would be small in
292 nutrient starved cells, that benefits would be large but costs relatively small in nutrient replete
293 cells, and that both benefits and costs would be high at intermediate nitrogen levels.

294 *Defence trade-offs*

295 The benefits of toxin production were clear and largely followed the pattern predicted, and
296 the results were consistent between the two types of experiments: induced cells have up to 3
297 times higher chance of being rejected by the copepod than un-induced cells, and the chance
298 of rejection was directly related to the toxin content of the cells. This confirms previous
299 reports of reduced grazing on induced dinoflagellates (Selander *et al.* 2006), but the
300 demonstration at the individual cell level is novel. It is well established that nitrogen-starved
301 cells produce no or very little toxins (Flynn *et al.* 1994; Selander *et al.* 2008) and, hence,
302 enjoy little or no defence from toxins. In the batch experiment, cells remained toxic even in
303 the stationary phase due to low cell division rate, but they did not produce new toxins. Even
304 in nutrient replete conditions where cells continue to divide, it may take up to 14 days for

305 induced *A. tamarense* to return to control levels after being removed from exposure to
306 copepod cues (Selander *et al.* 2012).

307 The efficiency of the defence was not as high as that reported for other strains and species of
308 *Alexandrium* spp. Thus, Xu & Kiørboe (2018) found that more than 90% of the cells of some
309 toxic *Alexandrium* species/strains were rejected by a copepod, but also that other strains
310 containing toxins were readily consumed by the copepod. Neither Xu *et al.* (2017) nor
311 Teegarden *et al.* (2008) were consequently able to relate the efficiency of the defence to the
312 composition and concentration of specific toxins in the cells of *Alexandrium* spp. Here, we
313 have established a direct relation between the cells' content of the GTX toxin and the
314 efficiency of the defence. Transcriptional studies of grazer induced diatoms (Amato *et al.*
315 2018) reveals a rather massive response to grazer presence, with hundreds of genes being up-,
316 or down-regulated. Thus is it quite possible that rejection rate resulted from additional up-
317 regulated traits, acting in concert with the toxins.

318 It has been notoriously difficult to demonstrate the cost part of defence trade-offs in
319 phytoplankton (Pančić & Kiørboe 2018), and this study is no exception. Ideally, 'costs'
320 should be quantified in terms of reduced cell division rate. We found no reduction in the
321 growth rate nor in nutrient affinity of the cells, even at nutrient deplete conditions.

322 However, we document a number of very clear effects of induction in addition to enhanced
323 toxin production, i.e., elevated cellular contents of C and N, a reduction in cell size, and even
324 an increase in cell division rate, with the effects being most pronounced at intermediate
325 nutrient levels. The responses are consistent between the batch and the continuous cultures.
326 However, it is not obvious whether these responses can be considered 'costs' or as parts of
327 the defence.

328 The expectation of reduced cell division rate of grazer-induced, nitrogen-limited cells is
329 based on the nitrogen requirements for PST production in *Alexandrium tamarens*e as worked
330 out by (Chakraborty *et al.* 2019). However, we had overlooked that the *A. tamarens*e they
331 considered produces high amounts of toxins, equivalent to the $\sim 10^{-9} \mu\text{g N } \mu\text{m}^{-3}$, compared to
332 the 1-2 orders of magnitude lower contents of $\sim 10^{-10}-10^{-11} \mu\text{g N } \mu\text{m}^{-3}$ in *A. minutum* found
333 during our study. Thus, the biochemical syntheses costs and the N requirements for toxins are
334 minute in this species. Thus, the higher N-uptake and -content of induced cells cannot be
335 explained by direct requirements for nitrogen and energy for toxin production.

336 It is well established that cells shrink in size when nutrient limited (Peter & Sommer 2015;
337 Garcia *et al.* 2016), as also seen most clearly in the batch experiment (Fig. 1G). However,
338 and more important, induction by grazer cues causes cells to shrink, by up to 25% in volume
339 relative to un-induced cells. This has two implications. First, a smaller cell volume implies a
340 higher *concentration* of toxins in the cells. It is reasonable to assume that the copepods
341 respond to the concentration rather than the contents of toxins, and the shrinking of the cells
342 may therefore be adaptive and part of the defence. A similar consistent response in cell size
343 to grazer cues has been found in seven species of diatoms (Grønning & Kiørboe submitted).
344 For the diatoms, smaller cell sizes implies higher concentrations of biogenic silica and,
345 therefore, a stronger protective shell that makes the cells less susceptible to copepod grazing
346 (Pančić *et al.* 2019).

347 The second potential implication of cell shrinking is a higher affinity for dissolved nutrients.
348 To first order, affinity scales inversely with cell radius due to the nature of molecular
349 diffusion (Kiørboe 1993) and it is well established experimentally that the volume-specific
350 nutrient uptake indeed increases with decreasing cell size (Edwards *et al.* 2012; Lindemann *et*
351 *al.* 2016). Thus, a 25% decrease in cell volume, corresponds to an 8 % decrease in radius and
352 a corresponding increase in affinity. This, in fact, may account for the elevated nitrogen

353 uptake, nitrogen content, and growth rate of induced cells when cells start being nutrient
354 limited, as most clearly seen in the batch experiment (Fig. 1). If the decrease in cell size is an
355 adaptation to increase toxin concentration, then the elevated nitrogen assimilation and growth
356 rate of induced cells is a secondary and maybe beneficiary effect.

357 The increased cell content found in induced cells may be due to thickening of their thecal
358 plates, providing them with another possible defence. It is unclear if this has an effect on the
359 copepods, but it has been shown that diatoms that increase their silica shell thickness
360 experience reduced grazing from both juvenile and adult copepods (Pančić *et al.* 2019).

361 *Ecological and indirect costs of defence*

362 In addition to direct costs, defences may also come with indirect ecological costs that do not
363 manifest in simplified laboratory settings (Strauss *et al.* 2002). This includes, e.g., increased
364 sinking rate or reduced swimming speed that may inflict fitness costs in nature (Lürling &
365 Van Donk 2000; Selander *et al.* 2011). A possible ecological cost of the reduced cell size
366 recorded here is elevated predation risk. In general, mortality rate of plankton organisms
367 scale inversely with their volume to power 0.25 (Kiørboe 2008), and a 25% decrease in
368 volume thus implies a 7.5% increase in predation mortality from other predators than
369 copepods. Copepods and other larger herbivores are probably the most important grazers on
370 dinoflagellate, thus the more than 50% decrease in copepod grazing pressure of induced cells
371 more than outweighs the cost in most situations, and toxin production increases the fitness of
372 the cell.

373 Theory of inducible defences predicts that defences should only be inducible if they are
374 associated with a cost (Tollrian & Harvell 1999). The number of studies unable to detect
375 costs associated with induced defences in phytoplankton suggests that additional factors may
376 be at play. Recent advancements in genome sequencing reveals that a substantial part of the

377 genome may be dedicated to secondary metabolism, up to one fifth in some cyanobacteria
378 (Leao *et al.* 2017). Keeping a single biosynthetic pathway active may inflict a very limited
379 cost whereas the cost for constant activation of one fifth of the genome will be substantial.
380 Thus the evolution of inducible defences may be driven not by the allocation of resources to a
381 single pathway, but the necessity to avoid allocation to all defence systems simultaneously.
382 This is but a corollary hypothesis to the optimal defence theory, but one that may explain the
383 lack of detectable costs in some induced responses to herbivory.
384 In conclusion, we found a complex nutrient-dependent response of a dinoflagellate to
385 copepod cues: increase toxicity with implied lower predation risk, higher cellular contents of
386 carbon and nitrogen, reduced cell size, and higher growth rate. Most of these responses may
387 be beneficial to the cells, while we found no strong indication of costs. Because
388 dinoflagellates are not Darwinian demons, the necessary costs are most likely indirect or
389 ecological that are apparent only in nature.

390 **Competing interests**

391 We declare we have no competing interests.

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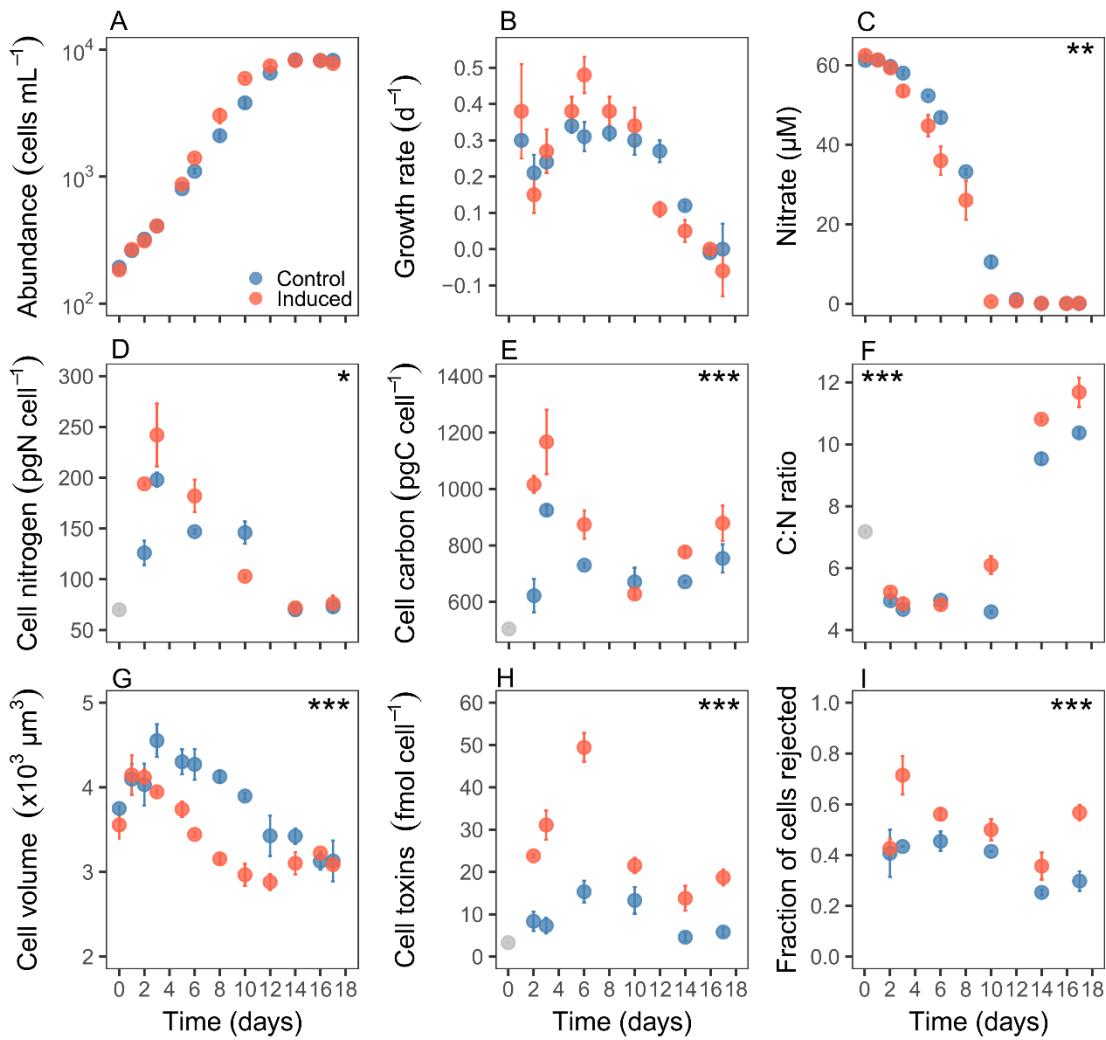
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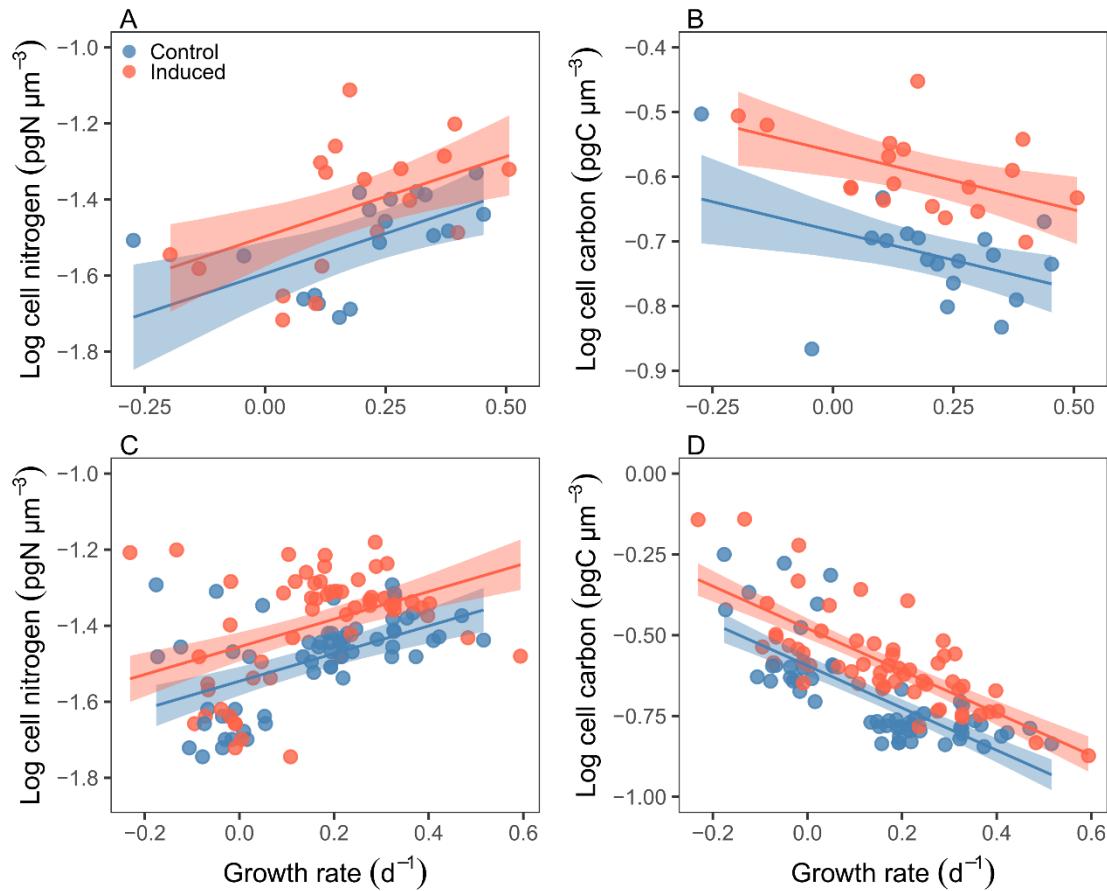
545 **Figure 1.**



546

547 Figure 1. Change in (A) cell abundance (cells mL^{-1}), (B) growth rate (d^{-1}), (C) culture nitrate
548 concentration (μM), (D) cell nitrogen content (pg N cell^{-1}), (E) cell carbon content (pg C
549 cell^{-1}), (F) C:N ratio, (G) cell volume (μm^{-3}), (H) cell toxin content (fmol cell^{-1}), and (I) the
550 fraction of cells rejected by copepods in the control (blue) and induced (red) *Alexandrium*
551 cultures over time in the batch-culture experiment. The grey points in D, E, F, and H are
552 initial values taken from the stock culture. Values are means and error bars are standard error
553 ($n = 3$). Significant effects of the addition of copepodamides are indicated by the asterisks
554 ($*** P < 0.001$, $** P < 0.01$, $* P < 0.05$).

555 **Figure 2.**

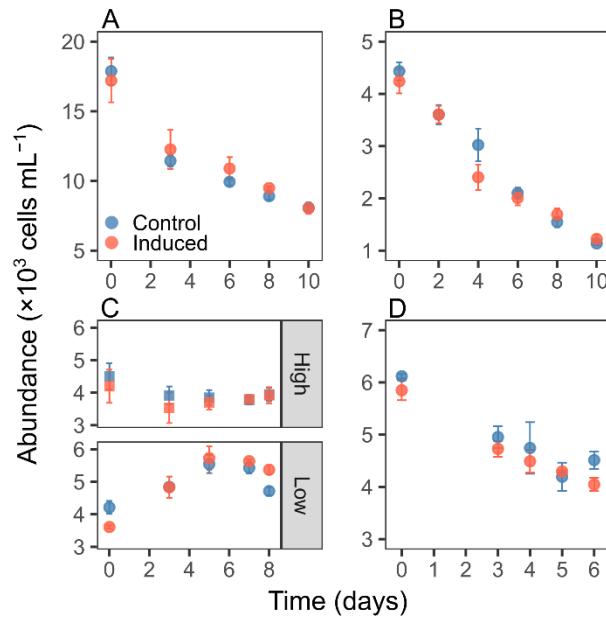


556

557 Figure 2. Relation between cell nitrogen (N, $\text{pg N } \mu\text{m}^{-3}$) or cell carbon (C, $\text{pg C } \mu\text{m}^{-3}$), and
558 growth rate (GR, d^{-1}) in the (A, B) batch and (C, D) EFB experiments. Growth rate is
559 calculated from change in biovolume. Multiple linear regression was fit to the data: (A)
560 control: $\text{log cell N} = -1.594 + 0.420 \times \text{GR}$, induced: $\text{log cell N} = -1.497 + 0.420 \times \text{GR}$ ($r^2 =$
561 $0.27, P = 0.002$); (B) control: $\text{log cell C} = -0.684 - 0.181 \times \text{GR}$, induced: $-0.561 - 0.181 \times$
562 GR ($r^2 = 0.539, P < 0.001$); (C) control: $\text{log cell N} = -1.546 + 0.363 \times \text{GR}$, induced: $-1.456 +$
563 $0.363 \times \text{GR}$ ($r^2 = 0.28, P < 0.001$); and (D) control: $\text{log cell C} = -0.594 - 0.654 \times \text{GR}$,
564 induced: $-0.479 - 0.654 \times \text{GR}$ ($r^2 = 0.61, P < 0.001$). The shaded areas are 95% confidence
565 intervals.

566

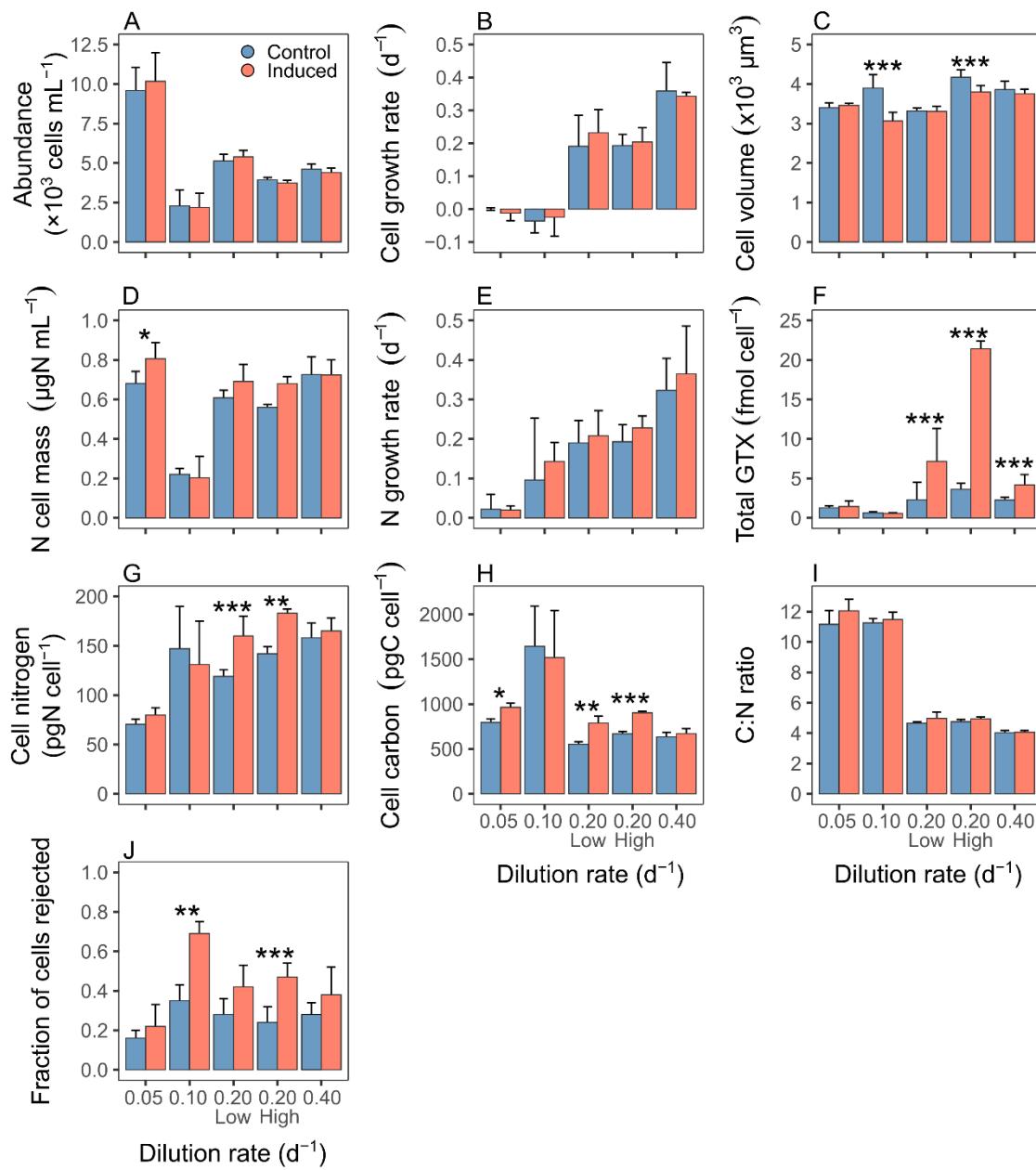
567 **Figure 3.**



568

569 Figure 3. Change in cell abundance (cells mL^{-1}) in the EFB at the different dilution rates. (A)
570 0.05 d^{-1} , (B) 0.10 d^{-1} , (C) 0.20 d^{-1} with high (6 nM) and low (0.63 nM) dose of
571 copepodamides, (D) 0.40 d^{-1} . The values are means and error bars show standard error ($n =$
572 3). Note the different y-axes scales.

573 **Figure 4.**



574

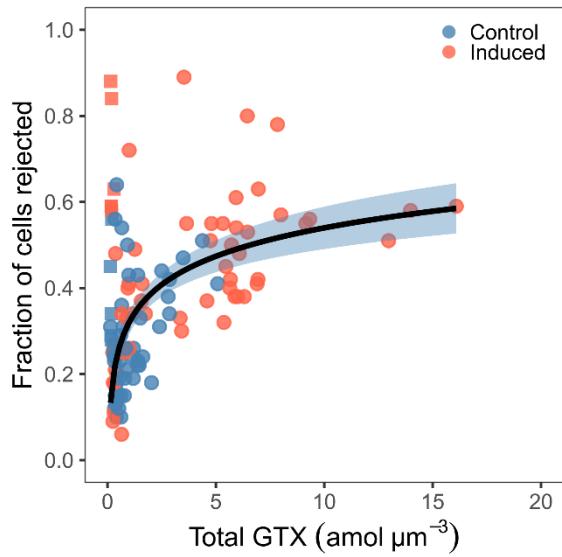
575 Figure 4. Summary of (A) cell abundance ($\times 10^3 \text{ cells mL}^{-1}$), (B) cell growth rate (d^{-1}), (C)
 576 cell volume ($\times 10^3 \mu\text{m}^3$), (D) nitrogen cell mass ($\mu\text{g N mL}^{-1}$), (E) nitrogen growth rate (d^{-1}),
 577 (F) cell toxin content (fmol cell $^{-1}$), (G) cell nitrogen (pg N cell $^{-1}$), (H) cell carbon (pg C
 578 cell $^{-1}$), (I) cell C:N ratio, and (J) the fraction of cells rejected by copepods in the EFB
 579 experiments. Values are averaged over time during the treatment period and error bars show
 580 standard deviation (n = 4 in 0.05, 0.20, 0.40 d^{-1} ; n = 5 in 0.10 d^{-1} ; n = 3 in 0.10 d^{-1} C/N

581 measurements). Significant differences between treatments within each dilution rate are

582 indicated by asterisks (** $P < 0.001$, ** $P < 0.01$, * $P < 0.05$).

583

584 **Figure 5.**



585

586 Figure 5. Relation between copepod rejection rate and cell toxin content normalized by
587 volume ($\text{amol } \mu\text{m}^{-3}$) in control (blue) and induced (red) cultures. Data are from both batch
588 culture and EFB experiments. Squares are data from the 0.10 d^{-1} EFB experiment that are not
589 included in the regression analysis. The regression line is $\text{Rejection} = 0.320 + 0.219 \times \log$
590 GTX ($r^2 = 0.42, P < 0.001$). The shaded area is the 95% confidence interval.