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Mercury in fish from Norwegian lakes: The complex influence of aqueous organic carbon

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25 **Abstract**

26 Mercury (Hg) concentrations in water and biota are often positively correlated to organic matter (OM),
27 typically measured as total or dissolved organic carbon (TOC/DOC). However, recent evidence suggests
28 that higher OM concentrations inhibit bioaccumulation of Hg. Here, we test how TOC impacts the Hg
29 accumulation in fish in a synoptic study of Methyl-Hg (MeHg) in water and total Hg (THg) in perch
30 (*Perca fluviatilis*) in 34 boreal lakes in southern Norway. We found that aqueous MeHg ($r^2=0.49$,
31 $p<0.0001$) and THg ($r^2 = 0.69$, $p<0.0001$), and fish THg ($r^2=0.26$, $p<0.01$) were all positively related with
32 TOC. However, we found declining MeHg bioaccumulation factors (BAF_{MeHg}) for fish with increasing
33 TOC concentrations. The significant correlation between fish THg concentrations and aqueous TOC
34 suggests that elevated fish Hg levels in boreal regions are associated with humic lakes. The declining
35 BAF_{MeHg} with increasing TOC suggest that increased OM promotes increased aqueous Hg
36 concentrations, but lowers relative MeHg bioaccumulation. A mechanistic understanding of the
37 response from OM on BAF_{MeHg} might be found in the metal-complexation properties of OM, where OM
38 complexation of metals reduces their bioavailability. Hence, suggesting that MeHg bioaccumulation
39 becomes less effective at higher TOC, which is particularly relevant when assessing potential responses
40 of fish Hg to predicted future changes in OM inputs to boreal ecosystems. Increased browning of
41 waters may affect fish Hg in opposite directions: an increase of foodweb exposure to aqueous Hg, and
42 reduced bioavailability of Hg species. However, the negative relationship between BAF_{MeHg} and TOC is
43 challenging to interpret, and carries a great deal of uncertainty, since this relationship may be driven
44 by the underlying correlation between TOC and MeHg (i.e. spurious correlations). Our results suggest
45 that the trade-off between Hg exposure and accumulation will have important implications for the
46 effects of lake browning on Hg transport, bioavailability, and trophodynamics.

47

48 **Keywords**

49 Bioaccumulation factor, boreal, freshwater, methylmercury, organic matter, perch

50

51 **1 Introduction**

52 Mercury (Hg) can undergo long-range transport in the atmosphere, and nearly two centuries of
53 elevated Hg deposition from anthropogenic activities (Streets et al., 2011) have led to considerable
54 stores of Hg in catchment soils, even in remote locations (Fitzgerald et al., 1998). Inorganic forms of
55 Hg can be methylated into the neurotoxic Methyl-Hg (MeHg), which is biomagnified in aquatic food
56 webs with potential harmful effects on aquatic organisms (Wolfe et al., 1998) and their consumers
57 (Scheulhammer et al., 2007), including humans (Driscoll et al., 2013; Zahir et al., 2005). Although the
58 toxic effects of Hg have been known for more than half a century (Kurland et al., 1960), researchers
59 still struggle to understand and describe many of the complex processes involved in the
60 biogeochemical cycling of the element, including mechanisms controlling accumulation and
61 biomagnification of Hg in aquatic food webs.

62 Throughout the boreal zone, Hg concentrations in freshwater fish often exceed national and
63 international dietary advisory limits, typically defined from 0.5-1.0 ppm (FAO UN, 1995, UNEP, 2002,
64 Depew et al., 2012). Elevated concentrations are confirmed for both North American (e.g. Gandhi et
65 al., 2014) and Scandinavian lakes (e.g. Åkerblom et al., 2014, Braaten et al., 2017), with levels posing a
66 potential risk to ecosystem and human health. Recent studies have documented widespread increases
67 in concentrations of aqueous organic matter (OM), normally measured as dissolved organic carbon
68 (DOC) or total organic carbon (TOC), in freshwater lakes throughout the boreal forest zone (Monteith
69 et al., 2007), and concentrations are predicted to change markedly with future climate change (de Wit
70 et al., 2016, i.e. altered precipitation patterns). Browning of lakes may have strong impacts on Hg
71 transport, availability and bioaccumulation and a better understanding of the interactions between
72 climate, biogeochemistry and bioaccumulation is needed. In particular there is a need to increase our
73 knowledge about the most decisive factors and processes for Hg accumulation in fish, and how these
74 processes interact. This knowledge gap limits our ability to predict future levels of Hg in fish under
75 various environmental changes.

76 Aqueous OM is known to affect the cycling of Hg in aquatic environments through chemical
77 complexation (Ravichandran, 2004), through direct and indirect impacts on photochemical
78 degradation of MeHg (Lehnherr and Louis, 2009, Klapstein et al., 2018), and through microbial
79 production and de-methylation mechanisms and processes (Gilmour et al., 1998). In recent decades,
80 many studies have shown significant, positive correlations between aqueous concentrations of OM
81 and Hg, both in water and biota (Braaten et al., 2014a; Chasar et al., 2009; Driscoll et al., 1995; Meili
82 et al., 1991). However, more recent investigations suggest that at higher OM concentrations, Hg may
83 be less available for uptake into aquatic food webs (e.g. French et al., 2014, Jeremiason et al., 2016,
84 Tsui and Finlay, 2011). French et al. (2014) showed reduced bioaccumulation of both total Hg (THg)
85 and MeHg in aquatic invertebrates (amphipods of different size classes: 250-2000 μm and $>2000 \mu\text{m}$)
86 in Arctic lakes at DOC concentrations $> 8.6 \text{ mg C L}^{-1}$, while increased accumulation occurred at DOC $<$
87 8.6 mg C L^{-1} . Amphipods from lakes with higher DOC concentrations had lower Hg bioaccumulation
88 factors (BAFs), defined as the ratio between the concentration of Hg in an organism and the
89 concentration of Hg in its surrounding environment, i.e. water (French et al., 2014). A similar threshold
90 value ($\approx 8 \text{ mg C L}^{-1}$) was proposed by Driscoll et al. (1994) from a limited data set of North American
91 fish populations. French et al. (2014) suggest that the mechanism responsible for the change in BAF
92 with OM concentrations relates to the complexation of Hg by OM, where high presence of humic acids
93 make Hg species less bioavailable.

94 Herein, we wanted to investigate the relationship between aqueous concentrations of MeHg
95 and TOC in 34 boreal lakes in southern Norway and assess the effects of TOC concentrations on Hg in
96 perch (*Perca fluviatilis*). We explore various modelling approaches, including a BAF approach similar to
97 that of French et al. (2014), and discuss the limitations and potential future environmental implications
98 of our results. Hg concentrations in aquatic food webs depend strongly on the uptake of Hg at the base
99 of the food web (Chasar et al., 2009), implying that a potential TOC threshold for Hg bioaccumulation
100 in fish prey will also be reflected as a threshold response in fish Hg. We hypothesise that reduced
101 bioavailability of MeHg occurs at higher TOC concentrations, leading to lower BAFs for Hg in fish.

102

103 **2 Experimental**

104 **2.1 Study sites and field sampling**

105 Our investigation is based on 34 lakes from southeast Norway, located between 58.84° N and 60.51°
106 N, 7.96° E and 12.51° E (WGS84, see *Figure 1* and *Supporting Information* for details). All lakes are
107 located within the boreal forest ecotone, dominated by coniferous forest and wetlands, without direct
108 influence from agricultural activities. Lake-specific information on geographical location is attached as
109 *Supporting Information (Table S1)*, while water chemistry (THg, MeHg and TOC) and fish Hg
110 concentrations are shown in *Table 1*.

111 Samples were collected in the early autumn (August-September) between 2008 and 2012.
112 Perch (*Perca fluviatilis*) is the most abundant fish species in all lakes, and was collected using gill nets
113 composed of different mesh sizes for a broad distribution of fish size. For further details regarding
114 sampling and sample handling we refer to Braaten et al. (2014b). To be included in our calculations,
115 fish data from each of the 34 lakes had to comprise of at least $n = 10$ specimens, with the mean (\pm one
116 standard deviation) being $n = 23 \pm 7$ fish (*Table 1*).

117 Water sampling for chemical analysis was conducted as described in Braaten et al. (2014a). In
118 short, samples of surface water for Hg speciation were collected using 250 mL fluoropolymer bottles,
119 following ultraclean sampling procedures to avoid contamination (USEPA, 1996). All bottles were
120 previously unused, and water for determination of THg and MeHg was sampled in separate bottles to
121 avoid errors resulting from loss of Hg during preservation (Creswell et al., 2016, Braaten et al., 2014c).
122 Samples for TOC determination were collected at the same time as the samples for Hg analysis in an
123 high-density polyethylene (HDPE) bottle.

124

125 **2.2 Analytical methods**

126 Hg concentrations in fish were determined as THg. Wet samples of muscle tissue were analysed by
127 thermal decomposition and direct atomic absorption spectrophotometry (Lumex Mercury Analyser

128 RA915). Quality assurance and quality control (QA/QC) are described in detail in Braaten et al. (2014b).
129 Relative standard deviation (RSD) of sample duplicates was < 10 % and recovery of certified reference
130 material (DORM-3 fish protein) within 90-110 %.

131 The analytical method for MeHg in water was based on USEPA method 1630 (USEPA, 1998) by
132 distillation, aqueous ethylation, purge and trap, and cold vapor atomic fluorescence spectrometry
133 (CVAFS). The method for THg in water followed USEPA method 1631 (USEPA, 2002) by oxidation, purge
134 and trap, and CVAFS. Method detection levels (MDLs) were 0.02 and 0.1 ng L⁻¹ for MeHg and THg,
135 respectively. For both Hg species, automated systems were used for analysis (Brooks Rand Instruments
136 MERX). QA/QC are described in detail in Braaten et al. (2014a). RSD of sample duplicates was < 10 %
137 and < 20 % for THg and MeHg, respectively. Recoveries of blank spikes and matrix spikes were 80-120
138 % for MeHg and 90-110 % for THg. Both THg and MeHg were determined on unfiltered water to allow
139 for comparison with levels of TOC.

140 TOC was measured by infrared spectrophotometry according to Norwegian and European
141 Standard NS-EN1484 with a measurement uncertainty of ± 20 % and a MDL of 0.1 mg L⁻¹.

142

143 **2.3 Data collection of fish Hg measurements**

144 Fish Hg data were collected from previous publications by Fjeld and Rognerud (2009) and Braaten et
145 al. (2017). Mean observed fish Hg concentrations (measured as THg) in the lakes varied from 0.16 \pm
146 0.08 to 0.68 \pm 0.12 ppm wet weight (w.w., *Table 1*). Based on monitoring data for perch from
147 Scandinavian lakes (n = 80 lakes, n = 2026 specimens), ratios of MeHg to THg are typically above 0.95
148 in fish muscle tissue (Braaten et al., 2017), and as such we used concentrations of THg as an estimate
149 of MeHg. Mean fish weight and total length (\pm one standard deviation), including ranges (min, max),
150 in the complete dataset (n = 776) were 75.8 \pm 113.3 g (1.0 – 1141.0 g) and 16.3 \pm 5.9 cm (4.7 – 44.3
151 cm), respectively (Data for individual lakes are shown in the *Supplementary Information, Table S2*).

152

153 **2.4 Treatment of fish Hg data**

154 For comparison of Hg concentration in fish between lakes, a length and/or age adjustment is needed
155 due to the strong co-variation between Hg concentration and fish size (i.e. length and weight;
156 Sonesten, 2003, Chasar et al., 2009) as well as age (Braaten et al., 2014b). In our dataset, strong
157 significant positive relationships were found for fish Hg concentrations (observed values) with both
158 weight ($r^2=0.46$, $p<0.0001$) and length ($r^2=0.35$, $p<0.0001$). To investigate the between-lake fish Hg
159 concentration variations, we carried out an analysis of covariance (ANCOVA) creating a general linear
160 model. Explanatory variables included in the model included the fish characteristics available for all
161 lakes; total length and weight. To evaluate potential changes in the relationship between fish length
162 and weight, and Hg concentrations between the different lakes (length*lake and weight*lake),
163 interaction terms were also included in the model (all $p < 0.0001$). The final model's summary of fit
164 and analysis of variance are shown in *Supporting Information (Table S3)*, together with residual and
165 actual (i.e. measured) versus predicted plots (*Figure S1 and S2*). The final adjusted fish Hg
166 concentrations model specifications include $r^2 = 0.79$ and root mean square error (RMSE) = 0.14.

167 All statistical analyses and calculations were performed in JMP 13.0.0 with a significance level
168 $\alpha = 0.05$, unless otherwise mentioned.

169

170 **2.5 Calculation of bioaccumulation factors**

171 Estimation of BAFs for MeHg (BAF_{MeHg}) in each lake were performed by dividing the mean adjusted
172 concentrations of Hg in the perch populations (ppm, w.w.) by the concentrations of MeHg in water (ng
173 L^{-1}), by the following function:

174

$$175 \quad BAF_{MeHg} = [Hg]_{perch\ adjusted} / [aqueous\ MeHg] \quad (2)$$

176

177 BAFs should ideally rely on aqueous dissolved MeHg concentrations, however, given the oligotrophic
178 nature of our study lakes (low nutrient concentrations, Braaten et al., 2014a, sustaining low algal
179 productivity, and therefore low particulate matter), we calculated BAFs based on the total MeHg

180 concentrations (including dissolved and potential particle associated MeHg). Although the BAF_{MeHg} are
181 calculated from one measurement of MeHg in water from each lake, aqueous MeHg concentrations
182 measured in autumn in south-east Norwegian boreal lakes tend to be relatively stable from year to
183 year (i.e. low inter-annual variability, Braaten et al., 2014a). Lake-specific estimates of BAFs are
184 presented in the *Supporting Information (Table S2)*.

185 Obtained BAF_{MeHg} were tested for outliers and all values were found to be within the 75 %
186 quartile plus 1.5 * interquartile range.

187

188 **3 Results and Discussion**

189 ***3.1 Hg concentrations positively related to aqueous organic carbon***

190 Aqueous concentrations of TOC, THg and MeHg ranged between 3.6 – 20.1 mg C L⁻¹, 1.3 – 6.6 ng Hg L⁻¹
191 and 0.04 – 0.53 ng MeHg L⁻¹, respectively (*Table 1*). As expected, a significant positive linear
192 relationship was found between aqueous concentrations of TOC and both THg ($r^2 = 0.69$; $p < 0.0001$,
193 *Figure 2A*) and MeHg (data transformed to a logarithmic scale, $r^2 = 0.49$; $p < 0.0001$, *Figure 2B*). For
194 THg, this relationship reflects the importance of OM as transport vector of Hg species from terrestrial
195 to aquatic systems, a pattern well described for boreal areas in Scandinavia (Braaten et al., 2014a;
196 Eklof et al., 2012) as well as North America (Dennis et al., 2005; Driscoll et al., 1995). In boreal humic
197 lakes, where DOC typically constitutes more than 90% of TOC, particulate organic carbon (POC) is only
198 a minor constituent of aqueous OM (Hessen, 2005; Wetzel, 2001). Therefore, TOC is usually a good
199 proxy for DOC in these systems, and we present only TOC data in this manuscript. TOC in boreal
200 forested lakes is often of predominantly terrestrial origin (allochthonous OM) with minor contribution
201 from in-lake derived sources (autochthonous OM, Hessen, 1992), a factor of significant importance for
202 the OM quality (Bravo et al., 2017). For MeHg, the positive correlation with TOC is likely to be related
203 to TOC as a transport vector, but is also consistent with reduced loss of MeHg through photolytic de-
204 methylation (Lehnherr and Louis, 2009; Poste et al., 2015) and increased OM availability for in-lake
205 methylation (Ullrich et al., 2001).

206 The positive relationships between TOC concentrations and mean observed (linear regression:
207 $r^2 = 0.26$; $p < 0.01$, *Figure 3*) and adjusted (linear regression: $r^2 = 0.21$; $p < 0.01$) fish THg concentrations
208 were significant. Thus, our study confirms earlier findings demonstrating that elevated levels of Hg in
209 fish in boreal regions are associated with humic lakes (Driscoll et al., 1994; Hakanson et al., 1988). The
210 strong relationship between aqueous TOC concentrations and both aqueous Hg species and THg levels
211 in fish (*Figures 2 and 3*, respectively), reflects the dominant effects of OM on aquatic Hg cycling.
212 However, the positive relationship between observed fish THg concentrations and aqueous TOC
213 concentrations ($r^2 = 0.26$) leaves a considerable amount of variation unexplained, and disguises
214 complex relationships between bioaccumulation of MeHg in biota and aqueous OM in humic waters
215 (Driscoll et al., 1994; French et al., 2014), as well as other inter-lake differences in biogeochemistry and
216 ecology. We also observed a great deal of within-lake variability in fish THg concentrations (observed
217 concentrations, *Figure 3*), likely driven by between-fish differences in size, age and diet, further
218 supporting our decision to use adjusted fish THg data in our further analyses.

219

220 **3.2 Complex interactions between aqueous organic matter and MeHg bioaccumulation**

221 French et al. (2014) suggested that at lower DOC concentrations ($< 8.6 \text{ mg L}^{-1}$), aqueous Hg species are
222 primarily bound to smaller organic molecules (i.e. fulvic acids), while at higher OM concentrations ($>$
223 8.6 mg L^{-1}), higher molecular weight OM with higher affinity for Hg is more prevalent (i.e. humic acids).
224 Accordingly, in humic lakes, where the Hg to OM ratios are very low (*Table 1*), relatively more Hg is
225 bound to OM and therefore less available for uptake into the lower levels of aquatic food webs. The
226 relatively higher molecular weight and larger radius of OM in boreal lakes with higher TOC
227 concentrations has been confirmed by Vogt et al. (2004).

228 In the present dataset, BAF_{MeHg} appeared to have a unimodal response to increasing aqueous
229 TOC concentrations (*Figure 4*, green continuous line, $r^2 = 0.46$). The bell-shaped pattern indicates a
230 threshold peak TOC concentration (Lorentzian peak model inflection point, see *Supporting Information*
231 for details, *Table S4*), at $5.8 \pm 0.6 \text{ mg L}^{-1}$ (95 % confidence interval: $4.6 - 6.9 \text{ mg L}^{-1}$). Our modelled TOC

232 threshold value of 5.8 mg L^{-1} was lower than the threshold value found by French et al. (2014) for
233 aquatic invertebrates, i.e. 8.6 mg L^{-1} . However, our maximum BAF_{MeHg} was found in a lake with a TOC
234 concentration of 7.9 mg L^{-1} . This result was similar to the maximum DOC concentration ($\approx 8 \text{ mg L}^{-1}$)
235 obtained for the maximum fish Hg concentration reported by Driscoll et al. (1994) in lakes from the
236 Adirondack region, a predominantly forested area in northern New York State, USA.

237 However, it can also be argued that the relationship between BAF_{MeHg} and aqueous TOC
238 concentrations is simply described by a significantly negative linear relationship (*Figure 4*, $r^2 = 0.35$, p
239 < 0.001 , blue broken line). Jeremiason et al. (2016) found a lower BAF_{MeHg} with increasing levels of OM
240 for lower trophic levels (i.e. dragonfly larvae), but over a much larger DOC range ($9.6 - 55.7 \text{ mg L}^{-1}$)
241 than in French et al. (2014, $6.8 - 30.0 \text{ mg L}^{-1}$) and than we present here ($3.6 - 20.1 \text{ mg L}^{-1}$). Both the
242 threshold (*Figure 4*, green continuous line) and negative linear relationship (*Figure 4*, blue broken line)
243 support the view that bioaccumulation of MeHg in boreal aquatic freshwater food webs is strongly
244 controlled by uptake at the base of the food web (Chasar et al., 2009), and that the uptake is highly
245 influenced by lake TOC concentrations. Thus, the quality and/or quantity of OM is likely to be linked to
246 the physico-chemical properties of MeHg and its bioavailability at the base of the food web. For
247 example, Jeremiason et al. (2016) demonstrates, in contrast to French et al. (2014), that at higher DOC,
248 relatively more MeHg is present in the dissolved phase and associated with DOM, making it less
249 available for accumulation in algae at the base of the food web. It is also shown that reduced uptake
250 of MeHg (estimated as bioconcentration factors for hydropsychid caddisflies) with increased DOC
251 concentrations is related to reduced partitioning of dissolved MeHg to seston (which transfers MeHg
252 to primary consumers, Tsui and Finlay, 2011).

253 Additionally, increased concentrations of terrestrial OM can lead to a shift in the balance
254 between primary and bacterial production in lakes, with increased bacterial production and
255 importance of microbial trophic pathways in lakes with higher allochthonous OM inputs (Karlsson et
256 al., 2012; Karlsson et al., 2015). A shift from algal to more bacterial energy sources can be expected to

257 have important implications for MeHg uptake, trophic efficiency, and MeHg bioaccumulation in
258 consumers (de Wit et al., 2012).

259 *Figure 4* suggests that there is a threshold response of MeHg bioaccumulation to aqueous OM
260 concentrations, with highest bioaccumulation at intermediate levels of OM ($\sim 7\text{-}10 \text{ mg C L}^{-1}$), which is
261 reflected in Hg levels in aquatic biota from lower (i.e. phytoplankton, Gorski et al., 2008; invertebrates,
262 French et al., 2014) to higher trophic levels (i.e. fish, *this study*). The threshold response in relative Hg
263 bioaccumulation to OM implies that expected higher future TOC levels (de Wit et al., 2016) will
264 promote Hg bioaccumulation in lakes with low TOC concentrations ($< 5.8 \pm 0.6 \text{ mg L}^{-1}$), and potentially
265 reduce Hg bioaccumulation in lakes with high TOC concentrations ($> 5.8 \pm 0.6 \text{ mg L}^{-1}$). A similar
266 threshold value (5.0 mg L^{-1}) is suggested for the lower trophic levels (i.e. algae) by Gorski et al. (2008).
267 However, the functions in *Figure 4* could also imply that expected higher future TOC concentrations
268 will simply lead to reduced Hg bioaccumulation over the complete OM concentration gradient ($3.6 -$
269 20.1 mg C L^{-1}) in the boreal ecozone. The two models (Lorentzian and linear) are both possible
270 descriptions of the relation between BAF_{MeHg} and TOC, and both support a similar reduction of relative
271 bioaccumulation of MeHg above the threshold value of 5.8 mg L^{-1} . However, the Lorentzian model has
272 a slightly better fit ($r^2 = 0.46$) than the linear model ($r^2 = 0.35$).

273 For 30 of the 34 lakes included in this study, additional water chemistry parameters were
274 available, including measurements of total nitrogen (Tot-N), total phosphorous (Tot-P), pH, and
275 sulphate (SO_4^{2-} , *Table S5*, Supporting Information). We tested the influence of these parameters on
276 both fish Hg concentrations and BAF_{MeHg} (as for TOC in chapter 3.1 and 3.2, respectively), by running
277 both multiple regression analysis and one-way regressions. None of the parameters were significantly
278 related to fish Hg concentrations (all $p > 0.15$), and they did not improve explanatory power when
279 included in a multiple regression analysis with TOC (all $p > 0.2$).

280

281 **3.3 Confounding factors and potential for spurious correlations**

282 Although the present data show significant effects on MeHg bioaccumulation from aqueous OM
283 concentrations (*Figure 4*), we should not eliminate other confounding factors. For example, perch from
284 different lakes may feed at different trophic levels, with direct effects on the BAF_{MeHg} , and also perch
285 diet may vary with lake TOC concentrations (e.g. preferred prey, pelagic and/or benthic feeding
286 strategies, nutritional quality of prey, trophic position). If so, this could have a strong influence on the
287 observed relationship between BAF_{MeHg} and TOC. Furthermore, inter-lake comparisons of BAFs may
288 also be complicated by differences in fish growth rates between lakes, with higher BAFs expected for
289 lakes with slower growing perch.

290 Increased concentrations of TOC have potentially large effects on lake conditions, including
291 reduced light penetration, changing temperature regimes, and oxygen depletion (Read and Rose,
292 2013, Couture et al., 2015). Given that perch are cool-water adapted visual predators (Diehl, 1988),
293 such changes in physicochemical conditions can be expected to have strong effects on perch foraging
294 and growth, which in turn will affect Hg accumulation.

295 When assessing relationships between ratios, e.g. BAFs (fish [THg]/aqueous [MeHg]), and their
296 denominators (e.g. aqueous MeHg) or parameters strongly correlated with their denominators (e.g.
297 TOC), so-called spurious correlations may arise (Dunlap et al., 1997). Spurious correlations potentially
298 lead to misleading or incorrect conclusions (Kronmal, 1993). Historically, ratios have been widely used
299 to incorporate more than one variable into a single measure suitable for bivariate analyses. However,
300 Jackson and Somers (1991) used several statistical examples to demonstrate that the use of ratios
301 often lead to artificial correlations due to a lack of independence between ratios and denominators.
302 Pollman and Axelrad (2014) refer to examples of unsupported conclusions from peer-reviewed
303 publications where BAF is significantly correlated to aqueous contaminant concentrations, failing to
304 recognise the real underlying statistical relationship. An example of such a spurious correlation is when
305 BAF_{MeHg} is plotted against aqueous MeHg concentrations, i.e. when the dependent variable is plotted
306 against the variable used to calculate the independent variable. In our data set, such a plot shows a
307 strong exponential negative relationship ($r^2 = 0.82$, *Supporting Information, Figure S3*). In other words,

308 when THg in fish is divided by MeHg in water, low MeHg in water promotes high BAF_{MeHg} , and high
309 MeHg in water promotes low BAF_{MeHg} . However, we also see a significant positive correlation between
310 adjusted fish THg concentrations and aqueous MeHg concentrations ($r^2 = 0.16$, $p = 0.02$).

311 The relationships between BAF_{MeHg} and TOC (*Figure 4*) is, however, not as obvious an example
312 of a spurious correlation, as TOC is not used to calculate BAF_{MeHg} . Because of the strong positive
313 relationship between TOC and log-transformed MeHg in water (*Figure 2*), the strong relationship
314 between BAF_{MeHg} and TOC (*Figure 4*) may be driven by the underlying correlation between TOC and
315 MeHg.

316 In order to avoid a possible spurious correlation, we tested if TOC had additional explanatory
317 power for fish THg concentrations when the effect of aqueous MeHg was accounted for. We found
318 that there was no significant relationship between TOC and the residuals of the regression between
319 adjusted fish THg and aqueous MeHg ($r^2 = 0.03$, $p = 0.29$, *Supporting Information, Figure S4*). This lack
320 of relationship lends further weight to the possibility that the relationships between BAF_{MeHg} and TOC
321 that we found (*Figure 4*) may be complicated by the underlying relationship between MeHg and TOC
322 (Pollman and Axelrad, 2014). This highlights the challenges of assessing the effects of OM on Hg
323 bioaccumulation, and the need for care in interpreting relationships that arise between these
324 parameters.

325

326 **3.4 Mechanistic explanations for the influence of TOC on BAF**

327 We hypothesise, if we assume the reality of a threshold response of TOC on BAF_{MeHg} , that at lower TOC
328 concentrations, two processes contribute to high uptake and bioaccumulation of MeHg: 1) less OM is
329 available to bind MeHg; and 2) the OM available is typically present as smaller and more bioavailable
330 molecules (French et al., 2014). Correspondingly, with increasing concentrations of TOC, more OM is
331 available to bind MeHg and more OM is present as larger molecules (Vogt et al., 2004), potentially
332 decreasing Hg bioavailability (as modelled by French et al., 2014). Thus, bioaccumulation of organic
333 forms of Hg is reduced with increasing TOC concentrations. Hence, in our boreal lakes, increased OM

334 promotes increased aqueous Hg concentrations (*Figure 2*), but lowers Hg bioaccumulation (*Figure 4*).
335 If the relationship between BAF_{MeHg} and TOC is simply linear (*Figure 4*), the same arguments hold, but
336 for the full TOC concentration range, and not restricted to levels above $5.8 \pm 0.6 \text{ mg L}^{-1}$.

337 A mechanistic understanding of the threshold response from OM on BAF_{MeHg} and the linear
338 relationship between the two parameters (*Figure 4*) might be found in the metal-complexation
339 properties of OM. Complexation of metals with OM usually reduces their bioavailability (Stockdale et
340 al., 2010), which implies lower metal-specific BAFs, although there is some evidence that binding to
341 smaller more labile OM may increase the availability of Hg for uptake into bacteria capable of Hg
342 methylation (Chiasson-Gould et al., 2014). The OM-metals complexation is strongly affected by the
343 affinity for specific metals (Haitzer et al., 2002), in addition to the molecular charge, which in turn
344 depends on water chemical conditions such as pH and ionic strength (Haitzer et al., 2003, Tipping,
345 1993). If we apply these insights to Hg species chemistry, it is likely that OM concentrations and water
346 chemical conditions, such as acidity, will affect distribution of MeHg binding and bioavailability. In
347 agreement with the above, Driscoll et al. (1994) proposed that aluminium (Al) may compete with MeHg
348 for organic binding sites, leading to greater bioavailability of MeHg in lakes with a high Al/DOC ratio.

349

350 ***3.5 Future implications on MeHg bioaccumulation following browning of surface waters***

351 The current browning trend of surface waters has been explained by declining deposition of sulphur
352 (Monteith et al., 2007), which leads to higher solubility of OM through increased charge density (De
353 Wit et al., 2007), and might have implications also for the distribution of MeHg complexes. If
354 intermediate TOC concentrations are indeed associated with the highest bioavailability of MeHg
355 (*Figure 4*), future browning will significantly affect the BAF for Hg in fish. Hongve et al. (2004) showed
356 that the increase in water colour is much larger than the increase in DOC concentrations, and suggests
357 that this is related to the properties of the OM. The alteration of the OM includes an increase in the
358 relative quantity of high-molecular weight compounds (Hongve et al., 2004). Our study documents
359 ameliorating effects on Hg accumulation in fish at TOC concentrations lower than that of other studies,

360 possibly a consequence of qualitative differences in water chemistry between the Norwegian boreal
361 lakes and the American boreal and Canadian Arctic lakes (Driscoll et al., 1994; French et al., 2014). This
362 again might rely on differences in chemical properties of OM between Europe and North America,
363 including differences in cation/DOC ratios, e.g. the Al/DOC ratio, possibly related to different levels of
364 sulphate deposition and associated acidification (Garmo et al., 2014). Accordingly, more attention on
365 relations between OM quality and fish Hg is warranted.

366 Our study highlights the complexity of the relationship between OM and Hg transport,
367 bioavailability and bioaccumulation, as well as the challenges of quantitatively assessing the effects of
368 OM on Hg bioaccumulation. However, gaining a comprehensive understanding of these complex
369 relationships and processes is critical in the context of understanding how ongoing and future
370 browning of boreal lakes can be expected to affect fish Hg concentrations and related risks to
371 ecosystem and human health.

372

373 **4 Conclusions**

374 Given the complex ways in which OM and MeHg interact in boreal freshwater-catchment systems, and
375 the importance of OM in Hg cycling in these systems, future climate-change driven shifts in OM loading
376 to aquatic systems can be expected to affect Hg concentrations in water and aquatic food webs. Our
377 results suggest that aqueous OM is important for the bioavailability and bioaccumulation of MeHg in
378 aquatic food webs, and show that differences in OM concentrations are also reflected in fish Hg
379 concentrations, with important implications for risk to human consumers. In the future, the trade-off
380 between Hg exposure and accumulation will have important implications with respect to the effects
381 of lake browning on Hg transport, bioavailability, and trophodynamics.

382

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