

1 **Potential long-distance dispersal of freshwater diatoms adhering to waterfowl**
2 **plumage**

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20 **Abstract**

21 1. Waterfowl are potential long-distance dispersal vectors for aquatic microbes such as diatoms,
22 but supporting empirical data are scarce, especially concerning external transport on feathers.

23 2. We conducted an experiment designed to partially emulate diatom dispersal via adherence to
24 waterfowl, and to evaluate the effects of relative humidity (RH) and exposure time on viability.

25 Using eight replicates per treatment combination, we dipped individual breast feathers from
26 mallard ducks (*Anas platyrhynchos*) in a pure culture of the freshwater diatom *Nitzschia pusilla*
27 Grunow, then subjected them to one of four contrasting levels of RH (ca. 8, 35, 70, 88%) crossed
28 with one of four exposure times (10, 60, 120, 240 minutes) within a chamber through which air
29 was passed continuously, mimicking light wind that might be experienced by diatoms adhered to
30 subsurface feathers. All treatments occurred at room temperature, and thus our four RH
31 treatments corresponded to the following values of vapour pressure deficit (VPD): 2.5, 1.8, 0.8,
32 and 0.3 kPa respectively. We then gently placed the feather on sterile growth medium. After two
33 weeks we used spectrofluorometry to detect diatom growth and thus diatom viability. Finally, we
34 combined our experimental findings with geospatial data to predict the probability of potential
35 dispersal via adherence to mallards throughout Nebraska, South Dakota, and North Dakota,
36 which are situated within the central waterfowl migration flyway in North America, and host
37 important mallard breeding grounds.

38 3. We found that exposure time and RH interacted significantly to affect diatom viability: the
39 negative effect of exposure time was strongest under low RH conditions, but under high RH
40 (88%) the probability of being viable was 0.84 for a ten minute exposure (95% confidence
41 interval: 0.64 to 0.94), and 0.45 for four hours of exposure (95% confidence interval: 0.18 to
42 0.75). Combining these results with published data about (i) mallard flight speeds, (ii) the

43 geographic distribution of surface waters and of *N. pusilla*, and (iii) vapour pressure deficit
44 during the months of April and May, our geospatial model predicted high probabilities of
45 potential dispersal, over tens to hundreds of kilometres, among ~~the suitable~~ water bodies of the
46 central migration flyway.

47 4. Taken together, the results of our experiment and geospatial models suggest that long-distance
48 dispersal of diatoms via adherence to waterfowl feathers is highly plausible, particularly during
49 the near-dawn hours when waterfowl flight activity peaks and VPD is low. Considered
50 alongside previous evidence suggesting successful internal transport by waterfowl, we conclude
51 that for freshwater diatoms ectozoochory is likely commonplace ~~high~~ among waterbodies
52 frequented by waterfowl.

53

54 **Introduction**

55 Dispersal is a fundamental ecological process that connects populations and communities
56 and moderates how diversity is distributed across the landscape (Leibold *et al.*, 2004; Vellend,
57 2016). Consequently, data describing dispersal have been key to gaining a more complete
58 understanding of diversity patterns and their origins among a variety of taxonomic groups
59 (Cadotte, 2006; Heino *et al.*, 2015). However, such data have proved challenging to obtain for
60 microbial organisms, and this shortfall has fuelled debate about the frequency and scales over
61 which microbes disperse (e.g. Heino, 2011; Tesson *et al.*, 2015). A case in point is provided by
62 freshwater diatoms (Pither, 2007; Telford, Vandvik & Birks, 2007; Vyverman *et al.*, 2007;
63 Verleyen *et al.*, 2009): despite their prevalence and importance to the functioning of inland
64 aquatic ecosystems, little is known about the frequency and mechanisms of dispersal among
65 waterbodies, particularly among isolated lakes and ponds (i.e., those unconnected to other
66 waterbodies by overland streams or rivers).

67 Pioneering work by Maguire (1963) and others demonstrated the potential for substantive
68 dispersal of freshwater diatoms among waterbodies (reviewed in Kristiansen, 1996), and
69 numerous researchers have highlighted the roles that animal vectors, especially waterbirds, could
70 potentially play (Schlichting, 1960; Figuerola & Green, 2002; Green *et al.*, 2016; Stoyneva,
71 2016; Coughlan *et al.*, 2017; Kleyheeg *et al.*, 2019). To date, most experimental research has
72 focused on endozoochory, testing whether the propagules of plants (including diatoms) remain
73 viable after ingestion and internal transport (Proctor, 1959; Atkinson, 1972; Sides, 1973; Soons
74 *et al.*, 2008; Viana *et al.*, 2013c; Coughlan *et al.*, 2017; Tesson *et al.*, 2018). These studies have
75 revealed mixed findings, but do suggest strong potential for successful diatom dispersal via
76 endozoochory. For instance, Atkinson (1972) sampled the hind guts of several waterbird species

77 captured on Lake Windermere, and successfully cultured several diatom taxa including species
78 of *Melosira* and *Fragilaria*. Using samples from the esophagus and colons of gulls collected in
79 Texas and North Carolina, Sides (1973) successfully cultured a variety of diatom taxa including
80 species of *Fragilaria*, *Navicula*, and several species of *Nitzschia*. However, these authors did not
81 know the length of time the diatoms had been present in the sampled birds.

82 The degree to which diatoms successfully disperse via ectozoochory (external transport)
83 by waterbirds remains an open question. To be successful, the diatom propagules would need to
84 (i) come into contact with the bird, (ii) adhere or attach to the bird, (iii) survive and remain
85 attached during transport, (iv) detach in the new habitat, and (v) successfully colonize and persist
86 in the new habitat (Coughlan *et al.*, 2017). Diatoms have been observed on waterbird plumage
87 (e.g. Schlichting, 1960; Kristiansen, 1996; Figuerola & Green, 2002), but we are unaware of any
88 quantitative data about diatom survival and viability following ectozoochory. A key limiting
89 step is surviving exposure to desiccation (Kristiansen, 1996; Coughlan *et al.*, 2018), which is
90 governed by flight time and the humidity experienced by the propagules during transport.
91 Souffreau *et al.* (2010, 2013) experimentally tested the tolerance of 69 strains (34 species) of
92 diatom to desiccation, and found only 5 to exhibit some tolerance to desiccation. Combined with
93 their findings of limited tolerance to freezing and heating, the authors concluded that the
94 physiological sensitivities of vegetative diatom cells to harsh conditions are likely to severely
95 limit dispersal capacity. However, desiccation risk could be lessened if sufficiently high
96 humidity is maintained around the diatom cells during transport, as might be the case for cells
97 berried within waterfowl plumage, which has strong insulating properties (Coughlan *et al.* 2015).
98 Considering that waterfowl such as mallard ducks (*Anas platyrhynchos*) fly at 60-70km/h
99 (McDuie *et al.*, 2019), diatoms that survive transport could conceivably cover considerable

100 distances in short periods of time. For reference, we use the phrase “long distance dispersal” to
101 simply refer to dispersal among disjunct waterbodies separated by tens to hundreds of
102 kilometres.

103 Here, we present the results of a novel experiment designed to partially emulate diatom
104 dispersal via adherence to waterfowl feathers. We used breast feathers from mallard ducks,
105 which are common throughout temperate regions of the world (Wetlands International, 2021),
106 with estimates in North America at almost 10 million (U.S. Fish & Wildlife Service, 2019). The
107 mallard duck is an omnivorous, widely dispersed migratory species that frequents a broad range
108 of aquatic habitats (Kleyheeg *et al.*, 2019), and thus has the capacity to transport diatoms to a
109 broad range of environments. As waterfowl such as mallards forage in productive littoral zones,
110 it is reasonable to expect their plumage – especially breast plumage – comes into contact with
111 large numbers of benthic, epiphytic and epipelagic diatoms, which can reach very high densities in
112 favourable conditions (Patrick, 1977; Wehr & Sheath, 2004). Barbed feathers provide relatively
113 large surface area for potential adherence, especially for micro-algae such as diatoms. Our
114 experiment mimicked this encounter process by dragging individual breast feathers through
115 solution droplets containing relatively high densities of the benthic diatom *Nitzschia pusilla*
116 Grunow. Under near-constant room temperature, we examined how relative humidity (RH) and
117 exposure time individually and interactively affected the viability of the diatoms adhered to
118 feathers. We predicted that viability would decrease with decreasing RH and increasing
119 exposure time. To place our experimental results in real-world contexts, we combined them with
120 data about mallard flight speeds, and geospatial data describing waterbody distribution and
121 vapour pressure deficit (VPD) (based on RH and air temperature) within the states of North
122 Dakota, South Dakota, and Nebraska. These states are situated in the central migration flyway of

123 North America, and of the four major north-south flyways in North America (see map at
124 <https://www.fws.gov/birds/management/flyways.php>), the central flyway hosts the largest
125 numbers of mallards (U.S. Fish & Wildlife Service, 2019).

126 **Materials & Methods**

127 *Diatom culture*

128 We obtained a pure culture of a strain of *Nitzschia sp.* (CPCC 499) from the Canadian
129 Phycological Culture Centre (Waterloo, Ontario). Among the genera available from the centre,
130 we chose *Nitzschia* because it is a relatively common, primarily benthic genus found throughout
131 inland waters in North America (Potapova & Charles, 2002), and we chose this particular strain
132 because it is readily maintained in culture. According to the centre, the original material for
133 strain CPCC 499 was sourced in 1999 from an effluent pond at St. Mary's River pulp and paper
134 mill in Sault Ste. Marie, Ontario, Canada. Upon completion of our study, this strain was
135 identified to be *Nitzschia pusilla* Grunow (pers. comm. Kathryn Thomas, Stillwater
136 Environmental) using standard taxonomic references (Krammer & Lange-Bertalot, 1988; Cox,
137 1996) and morphological assessments of preserved and live material under 1000x magnification
138 (Supporting Information, Fig. S1).

139 Throughout the duration of our study, we grew and maintained the diatom culture in its
140 exponential growth phase at approximately 20-23° C and 21-24 $\mu\text{E}/\text{m}^2/\text{s}$ using serial dilutions in
141 125mL Erlenmeyer flasks capped with tinfoil.

142 *Feathers*

143 We collected mallard (*Anas platyrhynchos*) feathers under Environment Canada
144 Scientific Permit No. BC-18-0005 and adhered to the *Migratory Birds Convention Act*,
145 (Government of Canada, 1994). In response to a request communicated by a local wildlife

146 biologist / waterfowl hunter, waterfowl hunters in the Okanagan Valley region of southern
147 British Columbia, Canada, donated mallard skin patches from the breast/abdominal section (i.e.,
148 the section typically immersed when the duck is in water) with the feathers attached. We
149 provided hunters a video depicting the skinning method alongside written instructions for
150 reference (video available at <https://osf.io/ujnw2/>), to standardize the collections as much as
151 possible. Each bird yielded a single feather patch. Once removed, the patch was placed in a
152 Ziploc® bag, labelled with the sex, collection date, site, and hunting context (over water or field)
153 and stored in a freezer at -18°C as soon as possible. We obtained a total of twelve suitable
154 mallard feather patches (six male and six female). By the time the experiment began, the patches
155 had been stored in the freezer for at least 38 weeks. Any diatoms that may have been on the
156 feathers would have been killed by the prolonged freezing (cf. Souffreau *et al.*, 2010, 2013).
157 This was confirmed by the results of control trials (see below). Using latex gloves we plucked
158 fifteen feathers haphazardly from different parts of each feather patch and trimmed at the shaft to
159 remove the downy portion of the feather to isolate the part of the feather that is normally
160 exposed. Feathers from this pile were then randomly selected for each experimental run.

161 *Experimental apparatus*

162 We constructed four apparatuses in total, and a single experimental apparatus consisted
163 of the following: one plastic filter holder that served as the makeshift airflow chamber
164 (henceforth “chamber”) within which the feather was placed; three lengths of inline tubing; one
165 250mL Erlenmeyer flask filled with a glycerol and water solution; a WhirlPak® bag, and a
166 hygrometer (Supporting Information, Fig. S2). The first length of inline tubing connected the
167 benchtop air valve to the Erlenmeyer flask, which in turn was connected to the top of the
168 chamber with the second length of tubing. The third and final length of tubing was used to direct

169 outflow air from the bottom of the chamber into the WhirlPak® bag, in which the sensor (Hobo
170 12-bit smart sensor, model S-THB-M002) simultaneously measured RH and temperature. The
171 bag was twist-tied shut around the tubing. We connected the sensor to a Decagon Em50® Series
172 Data Collection System Data Logger, and took RH and temperature readings every minute. We
173 assume that the RH and temperature measured in the WhirlPak® bag reliably estimated the RH
174 and temperature in the chamber proper. We also monitored the RH and temperature of the room
175 using another identical sensor, attached to the same datalogger.

176 The RH within the chamber was manipulated using glycerol-water solutions.
177 Specifically, increasing the glycerol:water ratio in the flask reduces the equilibrium relative
178 humidity in the air within the sealed chamber, as the glycerol directly affects the water activity of
179 the solution (Forney & Brandl, 1992). The Erlenmeyer flask contained one of four ratios of
180 glycerol:water (approximately 100:0, 90:10, 60:30, or 0:100), which were adjusted as needed to
181 maintain one of four target RH levels within the main chamber: near 0%, 35%, 70%, and near
182 100%, respectively. The mean RH that we achieved for each of the four target RH levels
183 (calculated using 32 samples per group; see below) was 8.1% (\pm one standard error: 0.35), 35.9
184 (\pm 0.54), 71.1 (\pm 0.35), and 88.4 (\pm 0.44), and the corresponding mean temperatures were 22.7 (\pm
185 0.04), 22.8 (\pm 0.04), 22.9 (\pm 0.04), and 22.7 (\pm 0.04) °C (Supporting Information, Fig. S3). For
186 our statistical analyses (below) we used the average RH value calculated using the 1-minute
187 interval readings taken during the given experimental run.

188 The air valves were turned on 30 minutes before the start of each experimental run. We
189 did not have the means to directly measure the rate of airflow inside the chamber, but we strove
190 to ensure airflow rate was consistent across experimental runs: the airflow valve was opened just
191 enough so air could be felt moving through the system and would ruffle the feather slightly. We

192 were not attempting to mimic the rapid airflow that outermost feathers might experience during
193 flight. Rather, we envision this small rate of airflow simulating the conditions that might be
194 experienced by subsurface plumage (*sensu* Coughlan et al. 2015).

195 *Experimental procedure*

196 The procedure for a single experimental run consisted of the following steps: a 1mL
197 droplet of culture was pipetted into the centre of a petri dish (60mm diameter x 15mm depth).
198 Using forceps, each side of a single feather was dragged through the droplet, ensuring that the
199 entire surface of the feather made contact. We verified in preliminary trials that this procedure
200 resulted in diatoms readily adhering to feather barbs, as seen in Figure 1. The feather was then
201 placed in the chamber with the base of the feather shaft compressed in the seal, to hold the
202 feather in place. The chamber containing the feather was maintained near the desired RH for the
203 desired time. The feather was then transferred to a new petri dish containing 7mL of sterile
204 growth medium (enough to cover the bottom of the dish). The feather was gently placed on the
205 liquid medium, but not submerged or pressed downward. The dish was maintained under the
206 same growing conditions as the pure culture for fourteen days (determined during preliminary
207 trials as sufficient time for growth). The medium was then assessed for evidence of diatom
208 growth using spectrofluorometry (see below). Pre-experiment trials in which inoculated feathers
209 were directly transferred to the growth medium confirmed that this procedure resulted in
210 successful establishment of diatoms.

211 During the procedure the RH occasionally varied beyond desired ranges immediately
212 following sample changeovers. We ignored fluctuations to a higher humidity immediately
213 following sample changeovers, regardless of how long the higher humidity persisted, as the
214 sensor was likely detecting the water evaporating off the feather as it exited the system. When

215 the RH varied beyond the desired range at any other point during the procedure, the sample was
216 discarded, and the procedure started over.

217 We used eight replicates (feathers) for each combination of target RH (four levels) and
218 exposure time (four times), for a total of N = 128. We conducted the experiment over two four-
219 day intervals, separated by one day. We completed one replicate from each unique treatment
220 (sixteen unique combinations of target RH level and exposure time) each day, and we
221 randomized the order of treatments within each day. We also randomly assigned the target
222 humidity levels to the four chambers. At the end of each experimental day, we replaced the
223 volume drawn from the culture with an equal volume of sterile media. This ultimately diluted
224 the culture over the course of the experiment, but concentrations remained very high ($> 1.7 \times 10^5$
225 cells/mL) and were thus suitable for ensuring feather inoculation (Supporting Information, Fig.
226 S4).

227 We conducted all assessments of diatom growth using an RF-1501 Shimadzu
228 spectrofluorometer, which yields a fluorometer intensity reading as an indicator of cell
229 concentration. We set the excitation and emittance wavelengths for the in vivo fluorometry to
230 530nm and 680nm, respectively, to target chlorophyll a and fucoxanthin (Vincent, 1983; Watras
231 & Baker, 1988; Beutler *et al.*, 2002), with gap length set to 10nm (5nm per side). Fucoxanthin is
232 unique to brown algae including diatoms (Beutler *et al.*, 2002), and thus our estimates of cell
233 density are unlikely to be affected by any other microbial organisms, if present. We equated
234 evidence of diatom growth with the survival of viable cells. To ensure the reliability of the
235 measurement, we first established the limit of detection (LOD) for our spectrofluorometer
236 intensity readings, as described below.

237 *Experimental controls and Limit of Detection*

238 On each of the eight days, we ran one control replicate in which a feather was dipped in
239 sterile growth medium instead of diatom culture, placed in the chamber as described above, then
240 removed after two seconds (thus it did not undergo RH and exposure time treatments), and
241 subsequently placed in a petri dish with growth medium. The spectrofluorometer intensity
242 readings obtained after fourteen days from these eight controls served to establish our LOD. We
243 additionally ran eight controls for which we used a 2cm² square of filter paper instead of feathers
244 as the experimental unit. The spectrofluorometer intensity readings for the feather and paper
245 controls were statistically indistinguishable (Supporting Information, Fig. S5). We are thus
246 confident that the feathers used in our experiment were not pre-contaminated with organisms
247 producing fucoxanthin or chlorophyll. We equated the LOD with the mean intensity reading
248 from the feather controls plus three times the standard deviation of the readings (Shrivastava &
249 Gupta, 2011; Choo *et al.*, 2018).

250 *Statistical analyses*

251 For our experiment, our response variable of interest was binary: viable or inviable. We
252 equated evidence of diatom growth (i.e. intensity readings > LOD) after fourteen days with
253 evidence of viability. We analyzed this binary response variable in relation to RH (%) and
254 exposure time (minutes), and their interaction, using a generalized linear model (GLM) with a
255 binomial link (i.e., logistic regression). We coded RH and time as continuous variables. Coding
256 them as ordinal factors yielded qualitatively similar results. We computed the McFadden
257 pseudo-R² value (McFadden, 1974), which, for logistic regression, is analogous to the coefficient
258 of determination for general linear models.

259 *Extrapolating our experimental results to real landscapes*

260 We conducted our experiment at a near-constant air temperature of 22.8°C, which
261 simplified the interpretation of our RH treatments. In the real world, air temperature varies
262 spatially and temporally, and VPD is a more meaningful measure of desiccation potential
263 because it provides an absolute measure of the atmospheric moisture state independent of
264 temperature (Anderson, 1936). VPD is the difference between the actual moisture content of the
265 air and the saturation point of the air at a given temperature, and it varies as a function of RH and
266 air temperature. Desiccation potential increases with increasing VPD (Anderson, 1936). For
267 example, our experimental treatment of 35% RH at 22.8°C yields a VPD value of 1.81kPa, but
268 at an air temperature of 10°C, the same RH yields a VPD value of 0.80kPa. Thus, despite RH
269 being the same, desiccation would occur much faster at 22.8°C compared to 10°C. To facilitate
270 extrapolation of our results to the real world, we therefore re-analyzed our experiment data using
271 VPD as a predictor in lieu of RH within the GLM. Specifically, we used the default arguments
272 of the `rH.to.VPD` function within the `bigleaf` R package (Knauer *et al.*, 2018) to estimate
273 VPD in the experimental chambers, using the measured RH and temperature. The average VPD
274 values corresponding to the four RH treatments (from low to high RH), were 2.53 (± 0.01), 1.78
275 (± 0.02), 0.80 (± 0.01), and 0.32 (± 0.01) (Supporting Information, Fig. S3c). The results of this
276 analysis are provided in Table S1 and Fig. S6 in the Supporting Information.

277 We extrapolated our results to North Dakota, South Dakota, and Nebraska, and gathered
278 *in situ* VPD data for the period between April 1 and May 31, which corresponds with high
279 frequencies of mallard occurrences in the region (eBird, 2020), and also diatom growth. These
280 three states are located along the central flyway for waterfowl migration, and host the Prairie
281 Potholes region, a crucial breeding ground for North American waterfowl including mallard

282 ducks (U.S. Fish & Wildlife Service, 2019). We could not extend our geospatial analyses north
283 into Canada due to a lack of data. As we did not manipulate temperature in our experiment, our
284 geographical extrapolations should be interpreted with caution.

285 We first used our GLM in combination with the average flight speed of 69 km/h for
286 mallards (the middle value between average breeding time flight speeds and migration flight
287 speeds; McDuie *et al.*, 2019) to estimate the probability of remaining viable across a range of
288 distances (with corresponding flight times) and VPD values typical of the study region and time
289 periods (0.25 to 1.25kPa; Supporting Information, Fig. S7). We present these predictions
290 alongside (i) data about within-day dispersal distances of mallard ducks, based on banding
291 observations (Viana *et al.*, 2013a, 2013b), and (ii) distances between each surface water body (>
292 0.1 km² area) in the study region and its nearest neighbour water body, calculated using the
293 Global Lakes and Wetlands Database (GLWD), downloaded from the World Wildlife Fund.
294 Finally, we generated a map of probability of potential dispersal among the region's water
295 bodies, using *N. pusilla* Grunow as the focal diatom taxon. To do this, we used our GLM in
296 combination with (i) the average flight speed of mallards (as above), (ii) spatially interpolated
297 VPD for the region, calculated using RH and air temperature data from the ASOS Network
298 online database, and based on the average measurements for three times of day: near dawn
299 (04:00 and 07:00), mid-day (12:00 to 15:00), and dusk (20:00 to 23:00) during the first week of
300 May, (iii) estimated flight times between surface water bodies (using distances from the GLWD
301 data), and (iv) data about the distribution of *Nitzschia* taxa, including *N. pusilla*, acquired from
302 the 2007 and 2012 National Lakes Assessment. All data sources are detailed in the Data
303 Availability Statement. We included the dawn and dusk VPD values because the daily flight
304 activity of ducks typically peaks just before dawn and just after dusk (Bengtsson *et al.*, 2014;

305 Kleyheeg *et al.*, 2017). We included mid-day VPD values for comparison. We used lakes
306 hosting *N. pusilla* Grunow as the focal “source” lakes for diatoms, and generated a raster layer of
307 probability of potential dispersal based on estimated flight times (based on distances and flight
308 speed) from these source lakes, combined with the spatially-interpolated VPD values. Then for
309 each waterbody hosting diatoms of the *Nitzschia* genus, we extracted the probability of potential
310 dispersal values from the resulting raster layer. This procedure (i) equates probability of
311 potential dispersal with the probability of diatoms remaining viable after the given exposure time
312 and VPD (based on spatially interpolated VPD), and (ii) makes the simplifying assumption that
313 waterbodies hosting the genus *Nitzschia* are suitable for colonization by *N. pusilla* Grunow (see
314 Discussion). Additional details of these methods and of our results are provided in the fully
315 annotated R Markdown script available online (<https://osf.io/ujnw2/>).

316 *Ensuring computational reproducibility*

317 All our analyses were performed using R version 3.6.3 (R Core Team, 2019) within the
318 RStudio IDE (RStudio Team, 2019). To ensure computational reproducibility we used the `renv`
319 package (Ushey, 2020) that manages R package versions, and we generated an annotated R
320 Markdown script that, along with all data, are freely available for download from the Open
321 Science Framework (<https://osf.io/ujnw2/>). We used numerous R packages within our analyses,
322 and these are detailed in the Supporting Information. We encourage readers to contact the
323 corresponding author (JP) if any part of our study is unclear and / or irreproducible.

324 **Results**

325 The logistic regression from our experiment yielded a McFadden pseudo- R^2 value of
326 0.51, indicating a significant amount of the deviance was accounted for by the full model (Table
327 1). Exposure time and RH interacted significantly to affect diatom viability: at high RH, the

328 probability of being viable was moderate to high across all exposure times, including the
329 maximum four-hour period (Fig. 2). For instance, at an average RH value of 88% and an
330 exposure time of four hours, the predicted probability of being viable was 0.45 (95% confidence
331 interval: 0.18 to 0.75), and for a one-hour exposure time it was 0.78 (95% confidence interval:
332 0.61 to 0.89) (Fig. 2). At lower RH, the probability of being viable declined more rapidly with
333 increasing exposure time, and at the lowest RH values (8 and 36%), viability was predicted to be
334 possible (between 0 and 0.42 probability) over only the shortest duration of exposure (10 min)
335 (Fig. 2).

336 Using VPD in lieu of RH in a GLM yielded qualitatively identical outcomes (Table S1),
337 including a significant interaction between VPD and exposure time (Table S1; Fig. S6). Based on
338 this GLM, Figure 3A depicts the predicted probability of remaining viable across a range of
339 travel distances (using an estimated average mallard flight speed of 69 km/h) and VPD values
340 that are typical of those observed in the study region during April and May (Fig. S7). Figure 3B
341 shows the frequency distribution of distance travelled by mallards within a single day, and
342 Figure 3C shows the frequency distribution of distance to nearest neighbouring water body
343 among lakes and wetlands (those > 0.1 km² area) in the study region. Collectively, these figures
344 suggest strong potential for long-distance diatom dispersal by mallard vectors, especially over
345 tens of kilometres, and given the highly favourable VPD conditions (< 0.5kPa) that are typical of
346 dawn hours during April and May (Fig. S7).

347 The U.S. National Lakes Assessment survey revealed that diatoms of the genus *Nitzschia*
348 were observed in 85 waterbodies in the study region in the years 2007 and 2012, with 5 of these
349 locations hosting *N. pusilla* Grunow in 2007 (species-level identifications were only available for
350 the 2007 surveys) (Fig. 4). Using these 5 waterbodies as potential sources of mallard-borne *N.*

351 *pusilla* diatoms, Figure 4 shows how the probability of potential dispersal varies geographically
352 in the study region, based on (i) distance from the source lakes, (ii) average mallard flight speed
353 (69 km/h), and (iii) VPD interpolated throughout the study region (Fig. S8), using data from the
354 first week of May for illustration, and for three different times of day (dawn, mid-day, and dusk).
355 The maps show considerable potential for dispersal throughout the study region, particularly
356 during dawn hours (04:00 – 07:00) when VPD is ubiquitously low (rarely reaching 0.25kPa; Fig.
357 S8) owing to the cool temperatures and high RH that are typical of spring mornings in the region
358 (Fig. S7). Using data extracted from these prediction maps, Figure 5 shows the probability of
359 potential dispersal from the 5 source lakes into each of the other eighty waterbodies in the region
360 that host *Nitzschia* diatoms. It shows the considerable influence that time of day has on the
361 probability of potential dispersal, owing to pronounced variation in VPD that occurs through the
362 day (Fig. S8). During dawn hours, predicted probabilities are generally greater than 0.75,
363 whereas during mid-day hours, most are less than 0.25, though some lakes exhibit higher
364 probabilities owing to their proximity to source lakes (Fig. 4). At dusk, the geographical pattern
365 is more varied, and the probabilities of potential dispersal are more evenly distributed between
366 zero and 0.8 (Fig. 5).

367 **Discussion**

368 Consistent with our predictions, we found that the viability of diatoms adhered to feathers
369 declined significantly with increasing exposure time and decreasing RH. However, these
370 treatments interacted significantly: exposure time had diminished negative effects under high RH
371 conditions. For example, the predicted probability of remaining viable after four hours of
372 exposure was near zero at 8 and 36% RH, whereas at 88% RH plausible values for the
373 probability of remaining viable ranged from 0.18 to as high as 0.75. Such interactions between

374 RH and exposure duration have previously been observed in desiccation experiments involving
375 aquatic macrophytes (e.g. Coughlan *et al.*, 2018), but to our knowledge, ours are the first such
376 findings pertaining to diatoms. Souffreau *et al.* (2010, 2013) examined desiccation tolerance
377 among an impressively long list of diatom taxa (69 strains), but RH was not manipulated
378 directly, and nor was exposure time examined simultaneously. Rather, solutions of diatom
379 culture within well plates were air-dried for five or ten minutes in separate experiments. A
380 factorial experimental design is key for detecting treatment interactions, and in our case revealed
381 the important interaction between RH and exposure time.

382 Our experiment was also unique in examining desiccation tolerance of diatoms adhered
383 to feathers. Although a number of studies have examined the potential for internal transport of
384 diatoms by waterfowl (reviewed in Coughlan *et al.*, 2017), we are unaware of any that have
385 experimentally evaluated the potential for ectozoochory of diatoms via adherence to feathers.
386 For diatoms to successfully disperse via waterbird-mediated ectozoochory, propagules would
387 need to (i) come into contact with the bird, (ii) adhere or attach to the bird, (iii) survive and
388 remain attached during transport, (iv) detach in the new habitat, and (v) successfully colonize
389 and persist in the new habitat (Coughlan *et al.*, 2017). Below we discuss our findings with
390 reference to each of these five points.

391 *Contact and adherence of diatoms to waterfowl*

392 As waterfowl such as mallards forage in productive littoral zones, their breast plumage
393 likely comes into contact with numerous benthic, epiphytic, and epipelagic diatoms. In our
394 experiment we aimed to emulate this process by dragging individual breast feathers through
395 solution droplets containing relatively high densities of diatom (see Supporting Information
396 Figure S4). We cannot be sure whether using an entire patch of breast feathers as the

397 experimental unit would have affected the adherence process, but it certainly would have
398 provided more surface area of feather barbs for the diatoms to adhere to. While designing the
399 experiment we tested the procedure of dragging a single feather through a droplet of diatom
400 solution, and each time large numbers of diatoms readily adhered to the feather barbs (as seen in
401 Figure 1). We speculate, therefore, that in productive littoral zones, large numbers of diatom
402 may adhere to mallard breast plumage. If correct, dispersal success is unlikely to be limited by
403 the number of diatoms that successfully adhere to mallard feathers, especially when one
404 considers the vast numbers of diatoms and mallards involved – almost 10 million mallards in
405 North America alone, (U.S. Fish & Wildlife Service, 2019).

406 The apparent ease with which diatoms were observed to adhere to feathers could be due
407 in part to properties of diatom frustules. First, diatom frustules contain polysaccharides
408 (Gélabert *et al.*, 2004; Le Costaouëc *et al.*, 2017) that are typically attracted to hydrophobic
409 substances, potentially including the so-called “preening oil” secreted by waterbirds from the
410 uropygial gland (Bakken *et al.*, 2006), and that has been found to contain chemical derivatives
411 found in waxes (wax esters) (Stenhagen & Odham, 1971). Second, the polysaccharides in
412 diatom frustules can reduce the surface tension of water (Ozkan & Berberoglu, 2013), which
413 could further facilitate contact between diatoms and feathers. Third, *Nitzschia pusilla* Grunow is
414 a comparatively small diatom, with reference material suggesting lengths between 8 and 33 μm ,
415 and widths of 2.5 to 5 μm (Krammer & Lange-Bertalot, 1988; Cox, 1996). We speculate that the
416 small size of *N. pusilla* Grunow may facilitate adherence to feather barbs. Specifically, we
417 propose that its small size enables it to better “fit” within the barb structure (see Fig. 1), and
418 promotes interaction over a greater surface area (for a given volume) between the
419 polysaccharides on the diatom frustules and the hydrophobic substance in waterfowl plumage

420 (see above). Future experiments could test these ideas by using diatoms of contrasting body size,
421 and by using feathers that have and have not been washed of its hydrophobic substance. More
422 generally, body size has long been linked to dispersal capacity among microorganisms (Finlay,
423 2002): smaller body size is associated with larger population size, which will promote dispersal
424 capacity, and with respect to microbes, smaller organisms are more efficiently dispersed.

425 *Survival and adherence during transport*

426 We did not evaluate the extent to which diatoms adhered to feathers might dislodge
427 during flight, and nor did we attempt to mimic the potentially strong wind shear that might be
428 experienced by diatoms adhered to the outermost feathers on a bird. Rather, in our experiment,
429 we exposed the feathers to a light breeze that may be more representative of conditions
430 experienced by diatoms adhering to subsurface plumage, though this remains speculative. Our
431 experimental design could readily be modified to test the effects of wind speed and angle on
432 propagule dislodgement and viability, using a wind-tunnel design, for example.

433 For any aquatic plants successfully adhering to feathers for the duration of flight,
434 desiccation is thought to be the key limiting process (Green *et al.*, 2016; Coughlan *et al.*, 2017).
435 In the only other studies we are aware of that examined diatom tolerance to desiccation,
436 Souffreau *et al.* (2010, 2013) showed that diatoms are broadly intolerant of this form of stress.
437 Our findings are generally consistent with this: we directly manipulated relative humidity at
438 room temperature and found a dramatic decrease in viability with decreasing relative humidity
439 (Figure 2) and corresponding vapour pressure deficits (Fig. S6). However, we did not examine
440 the physiological status of the diatoms in our experiment, so cannot be certain that inviability
441 was due to desiccation per se. Importantly, we found that under levels of vapour pressure deficit
442 that are representative of the favourable springtime, near-dawn conditions in the central flyway

443 of North America (e.g. $< 0.25\text{kPa}$; Supporting Information Fig. S7 and Fig. S8), diatoms
444 remained viable after prolonged periods adhered to feathers, including 4 hours at a vapour
445 pressure deficit of 0.33kPa . It should be noted that our experiment examined a single
446 temperature regime (between 22 and 23°C ; Fig. S3), and we do not know how diatom viability
447 might respond to the much cooler air temperatures typical of springtime dawns in the region. On
448 one hand, we suspect that air temperatures between 0 and 10°C are more favourable to diatom
449 viability, as cooler temperatures yield lower vapour pressure deficit (all else being equal), and
450 diatoms are well adapted to cold aquatic environments (Wehr & Sheath, 2004). On the other
451 hand, waterfowl plumage includes microclimates that are buffered to some extent from ambient
452 conditions (Coughlan *et al.*, 2015), and may include warm pockets proximate to the skin. The
453 plumage can also maintain a humid microclimate (Coughlan *et al.*, 2015). Thus, the conditions
454 experienced by the diatoms in our experiment may have been more harsh than would be
455 experienced in transit within duck plumage.

456 It is important to note that the strain of diatom that we used in our experiment was chosen
457 specifically because it is easily maintained in culture. It may therefore be hardier and better
458 adapted to surviving ectozoochory than most diatom taxa. For instance, among the 69 strains (34
459 species) of diatom examined by Souffreau *et al.* (2010, 2013), only 5 exhibited some tolerance to
460 their desiccation treatment, including two strains of *Pinnularia borealis*, one strain of *Hantzschia*
461 *amphioxys*, and two strains of *Navicula radiososa*. It would be beneficial to explore the tolerances
462 of more taxa using our experimental design.

463 Flight duration is another factor that will influence the number of diatoms that remain
464 attached and survive transport. Our study explored this in three ways. In our experiment we
465 directly manipulated exposure time and found that increasing it from 10 minutes to 4 hours

466 decreased viability, but only moderately so under high relative humidity (Fig. 2) and
467 correspondingly low vapour pressure deficit (Fig. S6). Then, assuming an average flight speed
468 of 69 km/h (McDuie *et al.*, 2019), we used the statistical model from our experimental results to
469 make spatially implicit predictions of the probability of remaining viable across a range of
470 vapour pressure deficits and flight distances. For example, with values of vapour pressure deficit
471 $\leq 0.5\text{kPa}$, which are representative of springtime dawn and dusk conditions (Fig. S7) in the
472 central flyway, our model predicts that diatoms would remain viable over 120 km with a
473 probability of almost 0.5, and this increases to 0.7 for a distance of 40 km (Fig. 3A). In many
474 parts of the North American range of mallards these distances more than span the distances
475 among neighbouring water bodies (e.g. Fig. 3C). Nevertheless, these predictions make a number
476 of key assumptions that should be borne in mind. Most importantly, we assume that diatoms can
477 successfully remain adhered to feathers for the duration of the flight, despite the strong airflow
478 that would impact outermost feathers with flight speeds of 69km/h. Below the plumage surface,
479 it is possible that feathers are protected from strong airflow due to the insulating properties of the
480 plumage and its microstructure (Coughlan *et al.*, 2015). In our experiment we exposed the
481 feathers to a light breeze rather than a strong wind. We assume that this could represent the
482 conditions experienced by diatoms adhered to subsurface feathers, but this requires testing.

483 The same assumptions apply to our spatially-explicit predictions of the probability of
484 potential dispersal (Fig. 4), which indicated strong potential for dispersal among the region's
485 waterbodies, particularly during dawn and dusk hours when ducks, including mallards, tend to
486 fly between daytime roosting sites and nighttime foraging sites (Bengtsson *et al.*, 2014;
487 Kleyheeg *et al.*, 2017). Indeed, based on air temperature and relative humidity data gathered
488 from ninety-eight ASOS stations distributed throughout the study region, we found that vapour

489 pressure deficit was quite low ($\leq 0.5\text{kPa}$) and thus favourable in April and May during the hours
490 around dawn (Figs. S7, S8). During mid-day hours (noon to 3pm), higher temperatures combine
491 with lower relative humidity to yield much higher vapour pressure deficits on average (Figs. S7,
492 S8), so feather-borne dispersal during these times are predicted to be much less likely (Figs. 4,
493 5).

494 *Detachment in the new habitat*

495 Diatoms that withstand transport could be dislodged from feathers during landing, by
496 preening, and/or could remain adhered to feathers that themselves become dislodged (Coughlan
497 *et al.*, 2017). Our experiment mimicked the latter scenario in which feathers detach from the
498 bird (due to molting, for example), and rest on the water surface. During early spring and late
499 summer molting seasons, the surfaces of ponds and lakes hosting large numbers of waterfowl are
500 often littered with detached feathers. Although plausible, we do not know how effective this
501 scenario is at enabling diatoms to actually colonize the new habitat. Future experiments could
502 compare alternative dislodgment scenarios, including dragging the feather through sterile media.

503 *Successful colonization*

504 The final step of successful colonization and establishing a local population is clearly
505 dependent on the suitability of local conditions (e.g., water chemistry) for the given diatom
506 taxon. In our experiment we aimed to ensure that diatoms surviving the treatments would not be
507 limited by subsequent growth conditions, and therefore provided algal growth medium as the
508 receiving habitat. The diatom strain we used was sourced from an effluent pond at St. Mary's
509 River pulp and paper mill in Sault Ste. Marie, Ontario, Canada, and was identified using standard
510 morphological techniques to be *Nitzschia pusilla* Grunow. According to algaebase.org (accessed
511 March 10, 2020), this freshwater taxon has been recorded at locations throughout North America

512 and Europe, and in the 2007 National Lakes Assessment it was observed in 23 lakes in 13
513 different states. It occurred in 5 lakes within our study region (Fig. 4A). Thus, it is not an
514 especially common taxon. However, there is considerable uncertainty surrounding the taxonomy
515 of the genus *Nitzschia* (Rimet *et al.*, 2011), so the available data about the distribution of *N.*
516 *pusilla* should be interpreted with caution. For instance, members of the genus appear to occupy
517 an extremely diverse range of abiotic conditions (Potapova & Charles, 2002), and this can be
518 indicative of a taxonomic group in need of revision. In the case of *N. pusilla*, there is insufficient
519 data upon which to define “suitable habitat”. Based on our geospatial predictions, there is
520 considerable potential for dispersal from the five waterbodies that host *N. pusilla* (Fig. 4), but
521 given the small number occurrence records, perhaps “suitable habitat” is comparatively rare in
522 the region.

523 It is also important to note that the available survey and geospatial data (e.g. the lakes
524 and wetlands data used for Figures 3 and 4) may underestimate the distribution and abundance of
525 potential diatom habitat, because they do not include very small and ephemeral waterbodies.
526 Given that the mallard duck frequents a broad range of aquatic habitats (Kleyheeg *et al.*, 2019), it
527 has the capacity to transport diatoms to a broad range of environments. Future research should
528 modify our experimental design to explore multiple species of diatom simultaneously, using
529 receiving solutions with contrasting conditions.

530 *Conclusion*

531 We have provided novel evidence consistent with the idea that adherence to waterfowl
532 feathers is a potentially effective mode of ectozoochory for freshwater diatoms. More generally,
533 our study adds to a growing body of evidence that waterfowl are potentially effective long-
534 distance dispersal vectors for aquatic organisms via both endozoochory and ectozoochory

535 (Figuerola & Green, 2002; Viana *et al.*, 2013c; Tesson *et al.*, 2015; Green *et al.*, 2016; Coughlan
536 *et al.*, 2017; Lovas-Kiss *et al.*, 2018). Considering (i) the vast numbers of waterfowl that migrate
537 annually and visit numerous waterbodies en route, and (ii) the high densities of diatom that many
538 aquatic habitats host, it is possible that the number of diatoms that successfully disperse adhered
539 to waterfowl feathers is extremely large. Nevertheless, the efficacy of this mode of dispersal is
540 likely to vary among diatom taxa, and future research should seek to quantify this variation
541 experimentally.

542

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558 **Data Availability Statement**

559 All data and scripts are freely available for download from the OSF (<https://osf.io/ujnw2>), and
560 are citable as: Pither and Manning (2020). Data about within-day dispersal distances of mallard
561 ducks are available on Dryad (<https://datadryad.org/resource/doi:10.5061/dryad.619gd>). The
562 Global Lakes and Wetlands Database (GLWD) is available from the World Wildlife Fund
563 (<https://www.worldwildlife.org/pages/global-lakes-and-wetlands-database>). The ASOS Network
564 online database is freely accessible
565 (https://mesonet.agron.iastate.edu/request/download.phtml?network=IA_ASOS). Data about the
566 distribution of *Nitzschia* taxa, including *N. pusilla*, are freely accessible within the 2007 and
567 2012 National Lakes Assessment online repository ([https://www.epa.gov/national-aquatic-
568 resource-surveys/data-national-aquatic-resource-surveys](https://www.epa.gov/national-aquatic-resource-surveys/data-national-aquatic-resource-surveys)).

569

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741 **Tables**

742

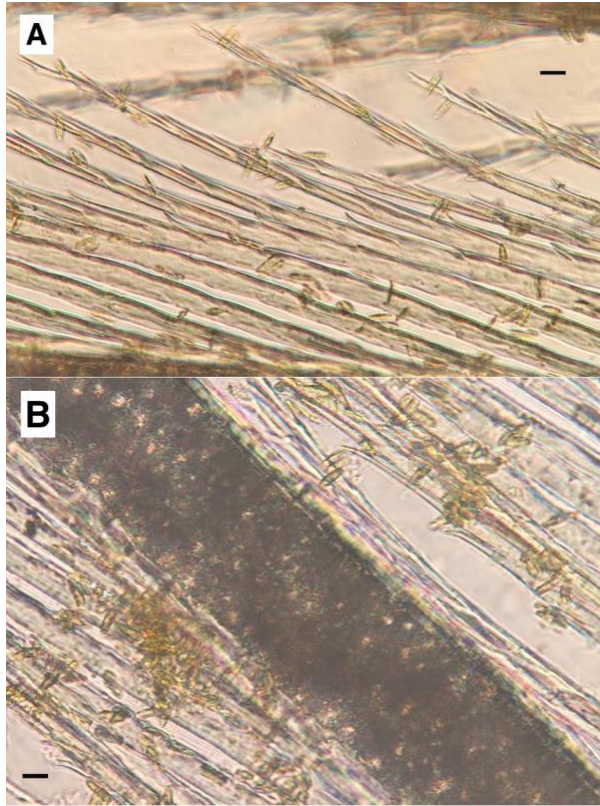
743 **Table 1.** Logistic regression (generalized linear model with binomial link) of the effects of
 744 relative humidity (RH) (%), exposure time (TIME) (minutes), and their interaction (RH × TIME) on
 745 the probability of diatoms remaining viable. Shown are the coefficient estimates, lower and
 746 upper 95% confidence limits (CL), Z-values, and associated probability values (*P*-value). The
 747 null and residual deviance was 146.1 and 71.5 respectively, on 127 and 124 degrees of freedom
 748 respectively). The McFadden pseudo- R^2 was 0.51.

Coefficient	Estimate	Lower 95% CL	Upper 95% CL	Z-value	<i>P</i> -value
Intercept	-3.420	-7.355	-0.717	-2.099	0.036
RH	0.059	0.022	0.110	2.703	0.007
TIME	-0.090	-0.185	-0.023	-2.214	0.027
RH × TIME	9.251 x 10 ⁻⁴	1.427 x 10 ⁻⁴	20.044 x 10 ⁻⁴	2.000	0.046

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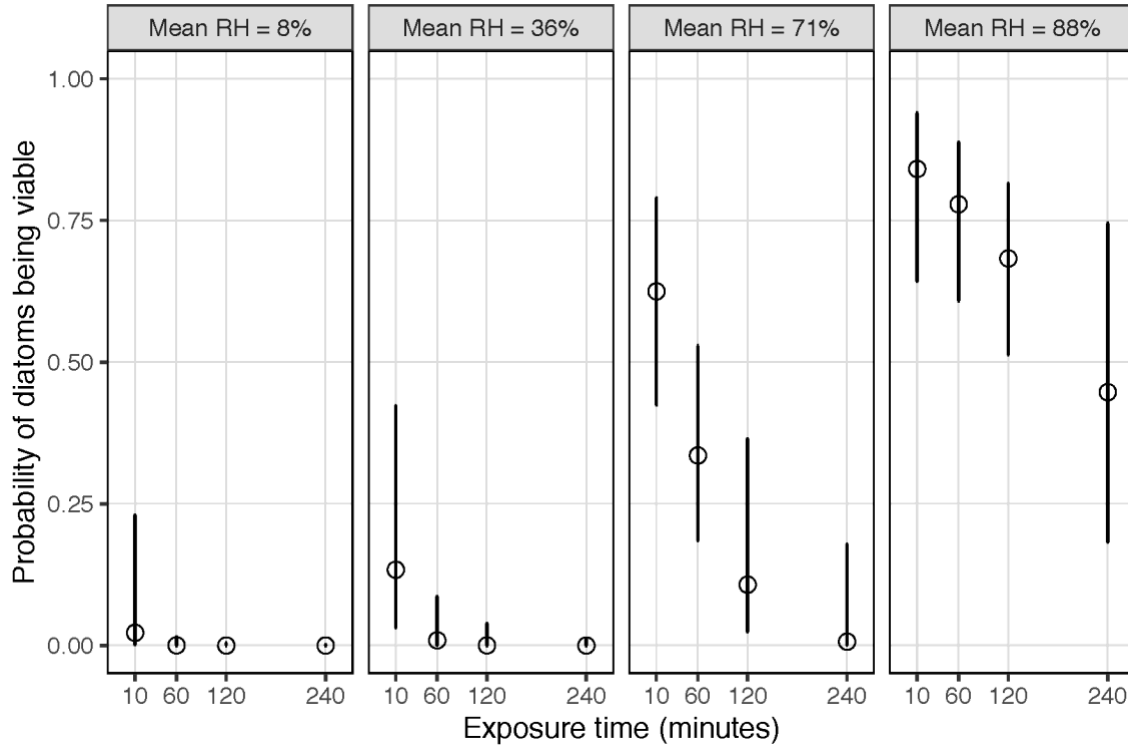
751 **Figures**



752

753 **Figure 1.** Two views (panels A and B) of *Nitzschia pusilla* Grunow diatoms embedded within a
754 mallard breast feather. The black scale bar in each panel is approximately 10 μm . For reference,
755 individual diatoms examined during identification work were, on average, 13.7 μm long (see
756 Figure S1).

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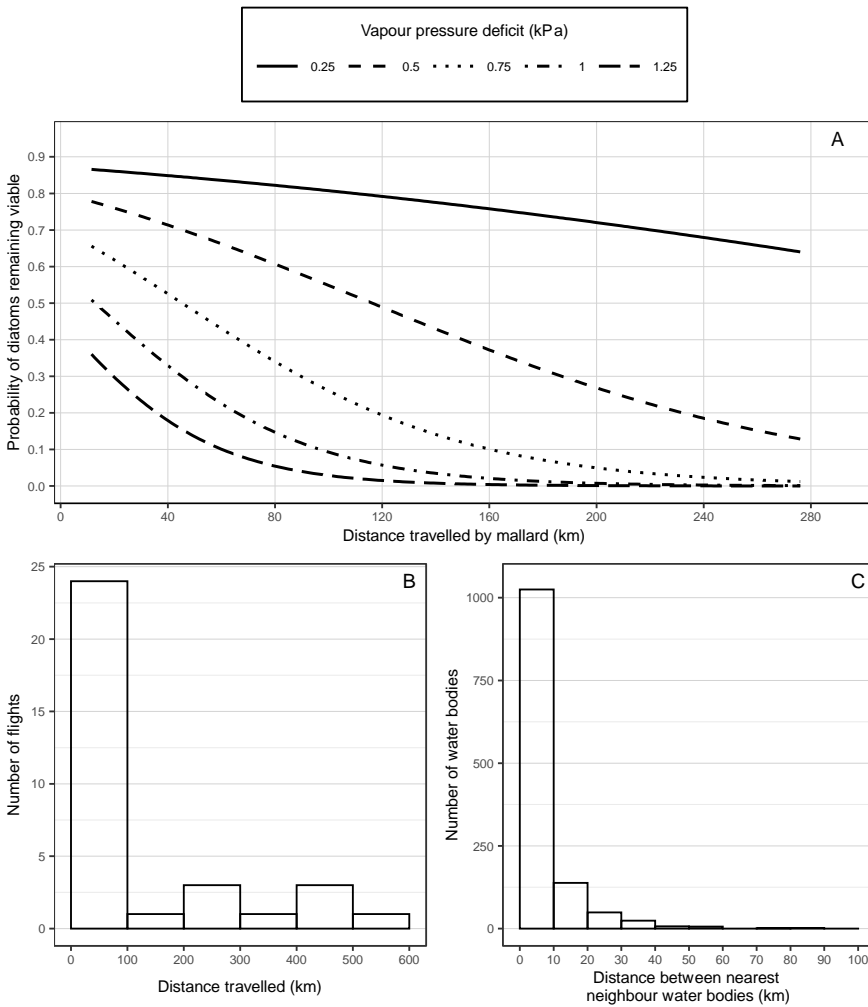


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761 **Figure 2.** Predicted probability (circles) of *Nitzschia pusilla* Grunow diatoms being viable as a
 762 function of relative humidity and exposure time. Bars indicate 95% confidence intervals. Panels
 763 display results grouped by target relative humidity (from lowest to highest, left to right), and
 764 panel labels show the mean relative humidity measured across replicates of the corresponding
 765 group. All experimental trials occurred at temperatures between 22.7 and 22.9 °C. Predictions
 766 are based on the GLM from the main experiment, and use marginal responses, the default
 767 approach in the R package `ggeffects` (Lüdtke, 2018).

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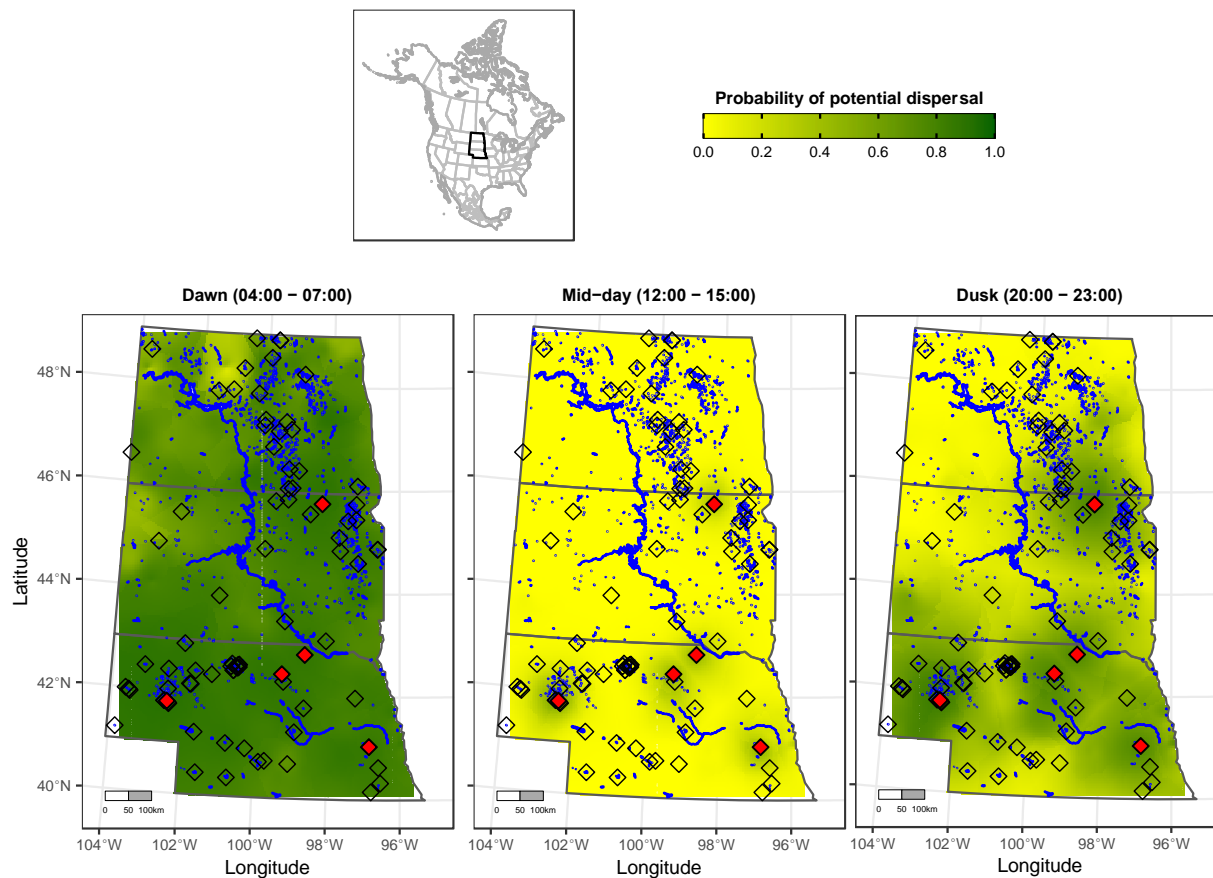


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772 **Figure 3.** Panel (A): Predicted probability of *Nitzschia pusilla* Grunow diatoms remaining
 773 viable as a function of vapour pressure deficit and travel distance. Predictions are based on our
 774 VPD-based GLM, and assume average flight speed of 69 km/h. (B) Histogram of distances
 775 travelled by mallards in North America in a single day (N = 33) (Viana *et al.*, 2013a, 2013b). (C)
 776 Histogram of distances between surface water bodies and their nearest neighbours within North
 777 Dakota, South Dakota, and Nebraska (N = 1252 water bodies).

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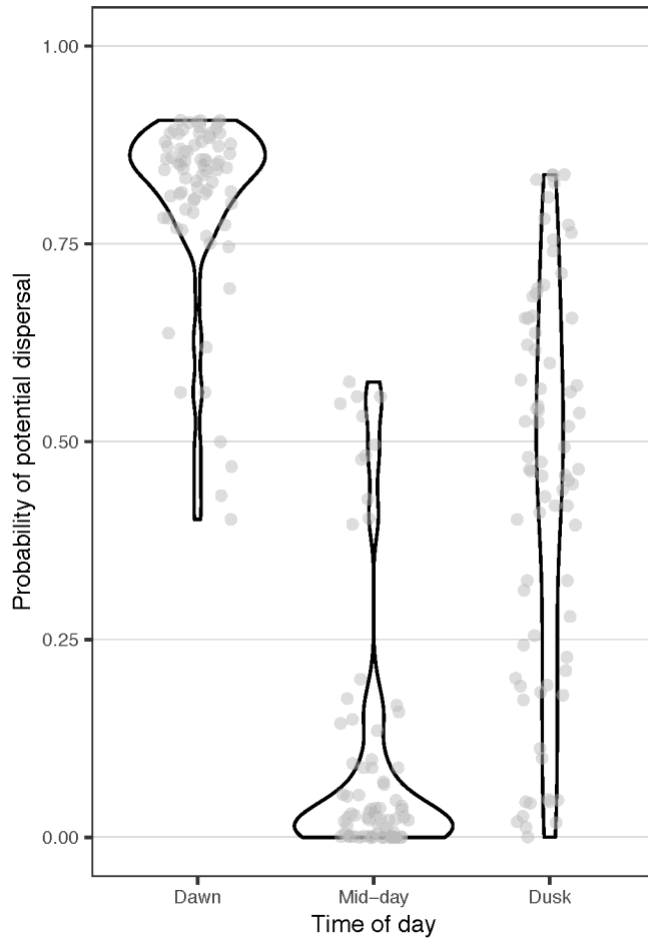
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780 **Figure 4.** Geographical predictions of the probability of potential diatom dispersal
 781 (omnidirectional) from 5 source lakes hosting *Nitzschia pusilla* Grunow (red diamonds).
 782 Predictions are derived from the VPD-based GLM from our experiment, using estimates of
 783 mallard flight duration (based on average flight speed of 69 km/h and geographic distances) and
 784 spatially interpolated vapour pressure deficit for the first week of May, averaged over the years
 785 2015 through 2020, and for three different times of day (dawn, mid-day, and dusk). See
 786 Materials and Methods for details. All surface waterbodies are indicated in blue. Hollow black
 787 diamonds denote the 80 waterbodies that in 2007 or 2012 hosted diatoms of the genus *Nitzschia*
 788 (aside from the 5 hosting *N. pusilla*). The map projection is North American Equidistant Conic.

789 The map at the top shows the study region outlined in black within North America (North
790 American Lambert Conformal Conic projection).

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794 **Figure 5.** For waterbodies in the study region (Fig. 4) known to have hosted members of the
 795 diatom genus *Nitzschia*, shown here is a violin plot depicting the probabilities of potential
 796 dispersal from five lakes hosting the study species *Nitzschia pusilla* Grunow. The probabilities
 797 are extracted from the raster layers depicted in Figure 5. One of the 80 lakes hosting *Nitzschia*,
 798 located in the extreme south-west of region, did not overlap with prediction raster, thus the
 799 sample size for each of the three time-of-day groups is 79. The width of the black outline shapes
 800 reflect the frequency distribution of probabilities, and the grey dots are individual observations.

801

802

Supporting Information for:

Potential long-distance dispersal of freshwater diatoms adhering to waterfowl plumage

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List of R packages used in analyses:

`bigleaf` (Knauer *et al.*, 2018), `cowplot` (Wilke, 2019), `dplyr` (Wickham *et al.*, 2020), `ggeffects` (Lüdecke, 2018), `ggplot2` (Wickham, 2016), `ggsn` (Santos Baquero, 2019), `ggspatial` (Dunnington, 2018), `gstat` (Pebesma, 2004; Gräler, Pebesma & Heuvelink, 2016), `investr` (Greenwell & Schubert Kabban, 2014), `kableExtra` (Zhu, 2020), `knitr` (Xie, 2019), `lubridate` (Grolemund & Wickham, 2011), `minpack.lm` (Elzhov *et al.*, 2016), `patchwork` (Pedersen, 2019), `pscl` (Jackman, 2020) `riem` (Salmon, 2016), `raster` (Hijmans, 2020), `rdryad` (Chamberlain & Boettiger, 2018), `rmapshaper` (Teucher & Russell, 2020), `sf` (Pebesma, 2018), `snakecase` (Grosser, 2019), `sp` (Pebesma & Bivand, 2005; Bivand, Pebesma & Gomez-Rubio, 2013), `spatstat` (Baddeley, Rubak & Turner, 2015), `tidyr` (Wickham & Henry, 2019).

Supplemental Table

Table S1. Logistic regression (generalized linear model with binomial link) of the effects of vapour pressure deficit (VPD) (kPa), exposure time (TIME) (minutes), and their interaction (VPD \times TIME) on the probability of diatoms remaining viable. Shown are the coefficient estimates, lower and upper 95% confidence limits (CL), Z-values, and associated probability values (*P*-value). The null and residual deviance was 146.1 and 71.7 respectively, on 127 and 124 degrees of freedom respectively). The McFadden pseudo- R^2 was 0.51.

Coefficient	Estimate	Lower 95% CL	Upper 95% CL	Z-value	<i>P</i> -value
Intercept	2.448	1.058	4.098	3.199	0.001
VPD	-2.111	-3.947	-0.802	-2.718	0.007
TIME	0.003	-0.011	0.018	0.358	0.720
VPD \times TIME	-0.033	-0.071	-0.005	-1.987	0.047

Supplemental Figures

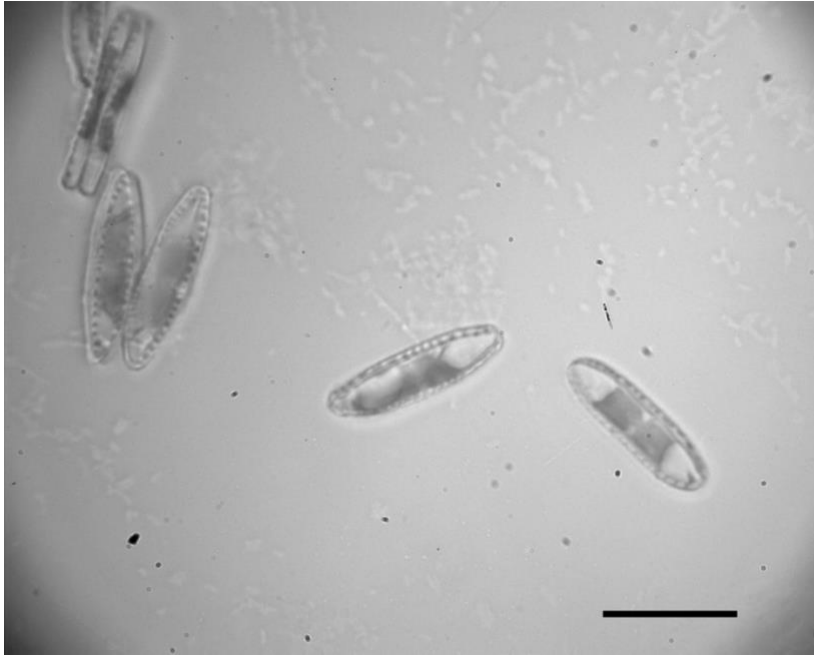


Figure S1: Micrograph (1000x) of preserved material provided by Kathryn Thomas, and identified based on morphological characteristics to be *Nitzschia pusilla* Grunow. Scale bar is approximately 10 μm .

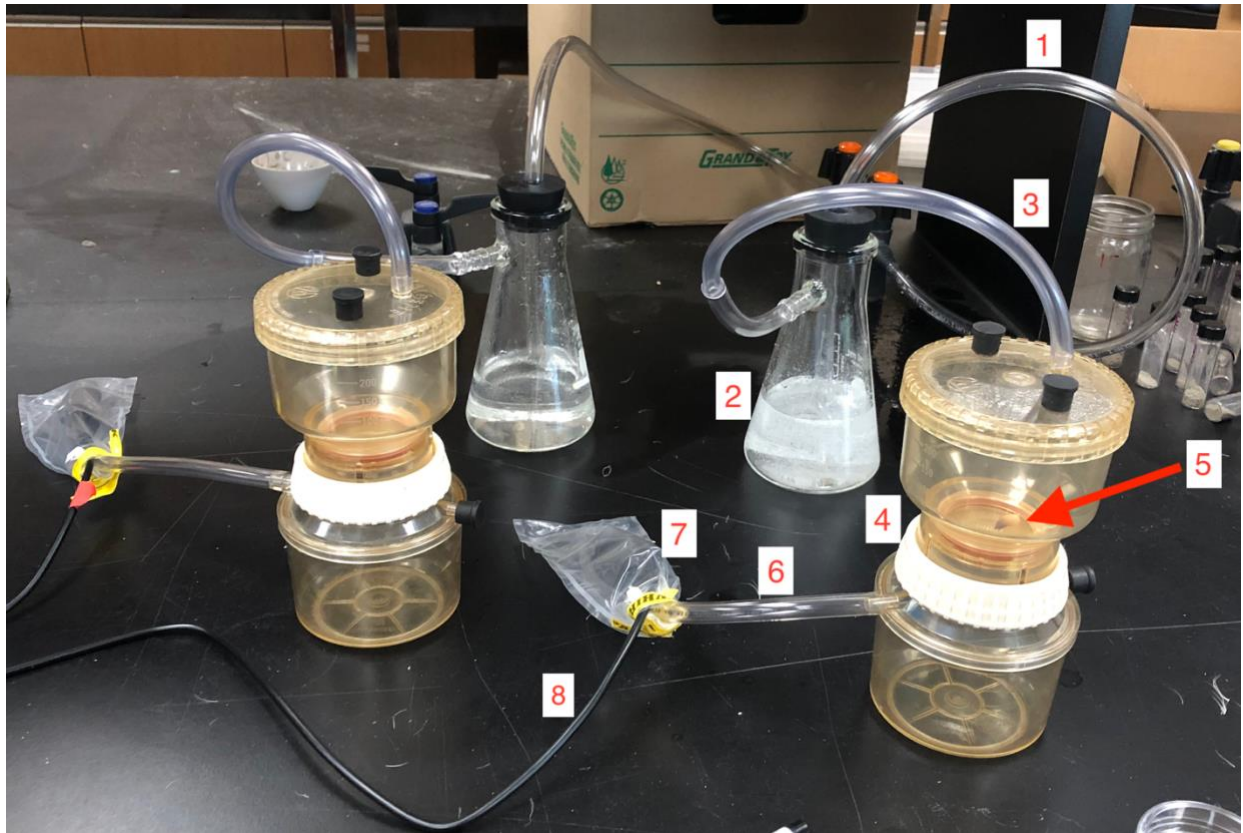


Figure S2: Two experimental apparatuses. In the right-hand apparatus, the red numbers correspond to: (1) tubing attached to benchtop air valve, connecting to (2) a flask with a glycerol solution that moderates relative humidity. This flask is connected by (3) tubing to (4) a makeshift airflow chamber, in which (5) the feather is secured by clamping the shaft in the seal. This chamber is then connected by (6) tubing that takes outflow air from the chamber to (7) the Whirlpack® bag containing the hygrometer. (8) The black cable exiting the Whirlpack® bag is the hygrometer cable, which connects to a datalogger (not shown).

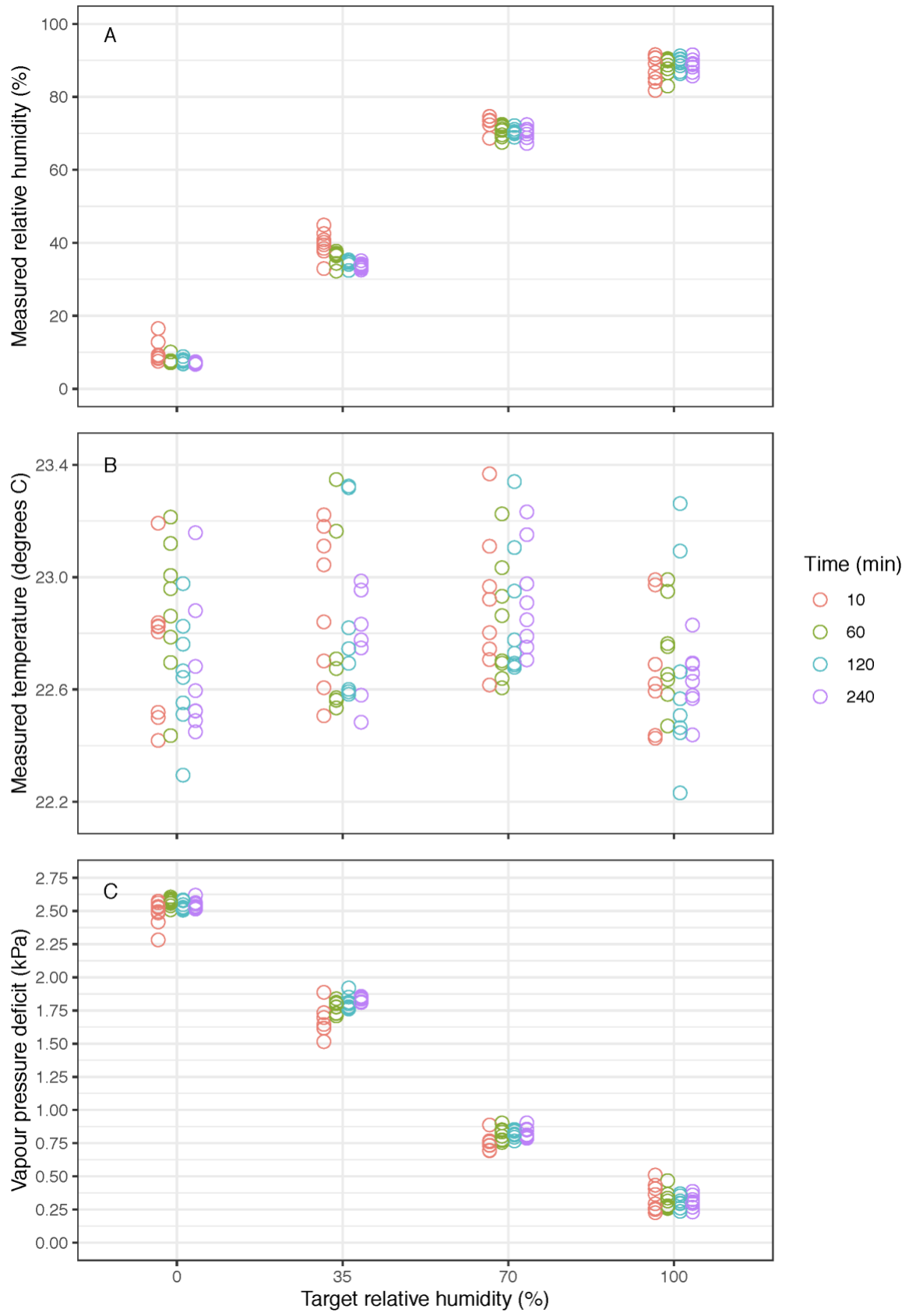


Figure S3: The time-averaged (A) relative humidity, (B) temperature measured in each experimental replicate plotted against the target relative humidity levels (with the 0 and 100 targets representing the "near-0" and "near-100" target values), and grouped by duration treatment. Panel (C) shows the corresponding calculated vapour pressure deficit values. There were $n = 8$ replicates per combination of target relative humidity and duration. Temperature values in panel B are jittered in the vertical direction to avoid overlapping points.

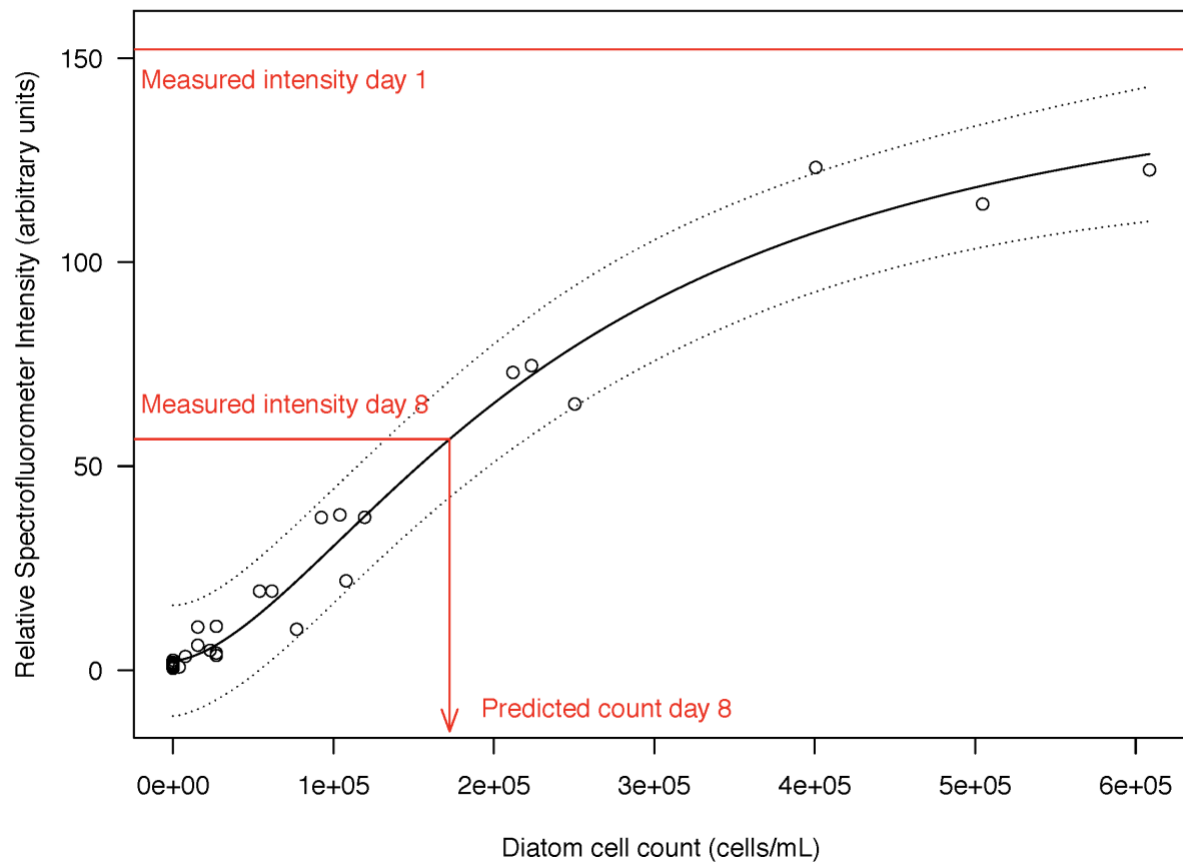


Figure S4: Calibration curve for estimating diatom cell density in the cell culture. The solid black line depicts the best-fit 4-parameter non-linear model, and the dotted lines depict the 95% confidence bands. The cell density of the culture on the final day of the experiment (day 8) was estimated to be 1.72×10^5 cells \cdot mL $^{-1}$. See the section "Estimating Cell Density" in the R Markdown script for methodological details.

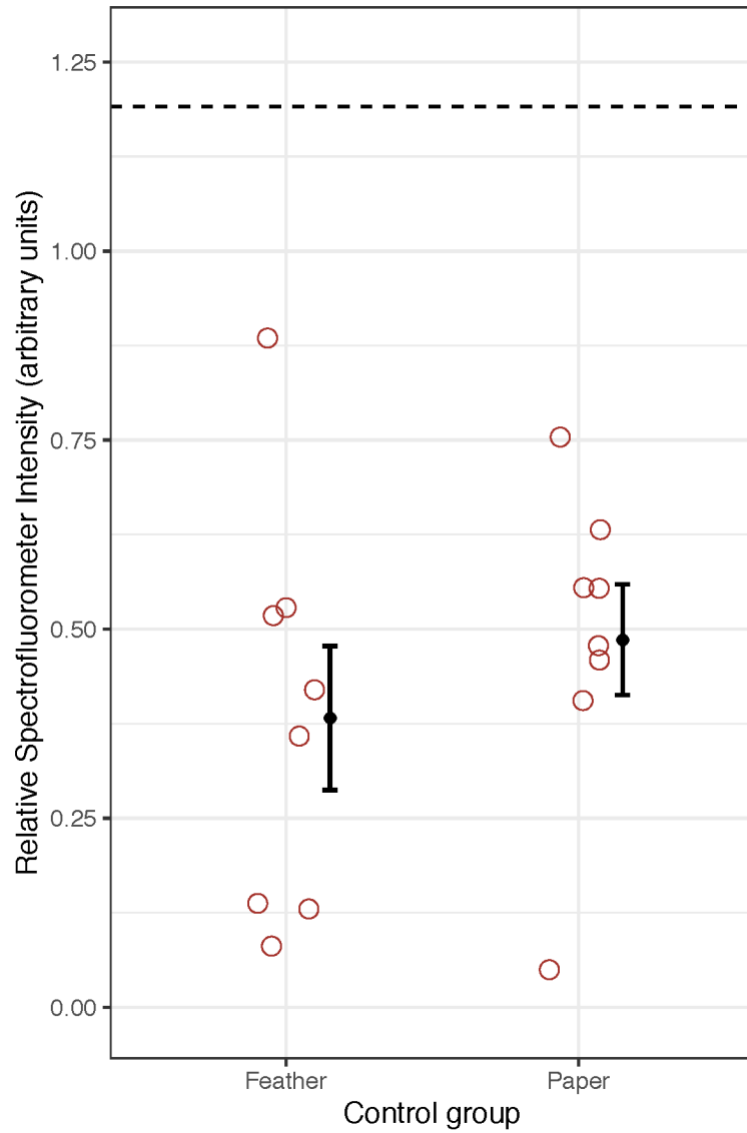


Figure S5: Spectrofluorometer readings for the feather and paper control groups (n = 8 per group). Solid black dots represent groups means, and bars extend to +/- one standard error. The horizontal dashed line depicts the limit of detection (LOD), calculated as the mean intensity from the Feather control group + 3 standard deviations.

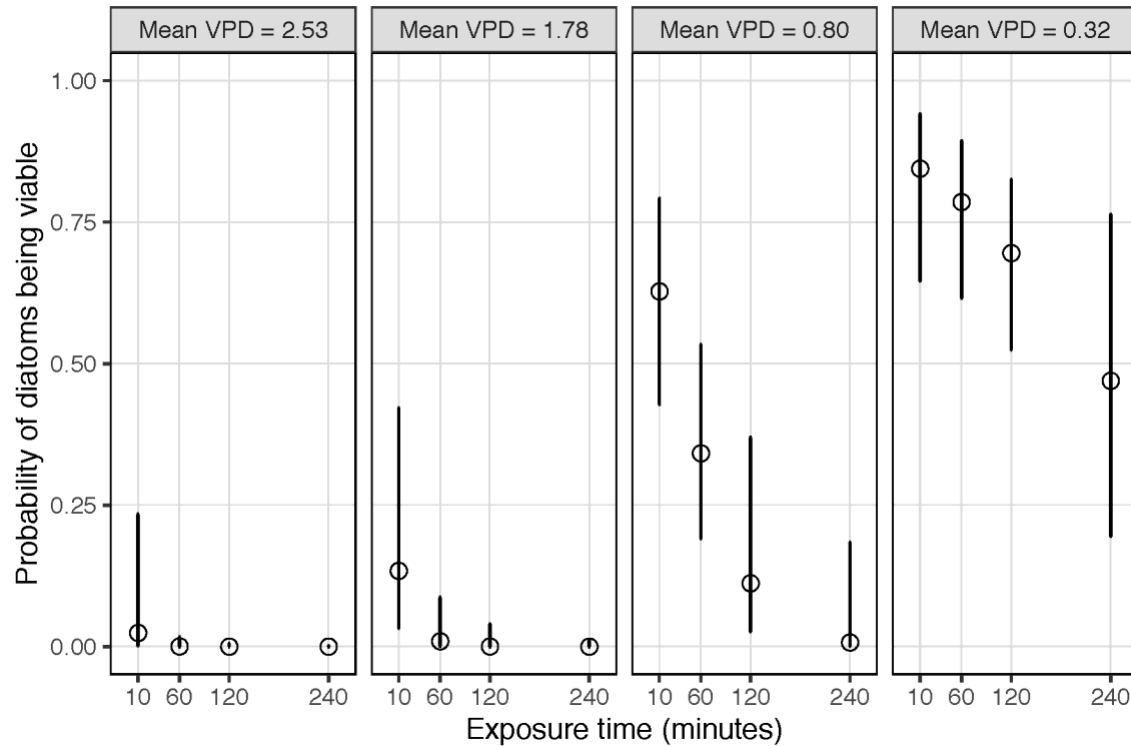


Figure S6. Predicted probability (circles) of *Nitzschia pusilla* Grunow diatoms being viable as a function of vapour pressure deficit and exposure time. Bars indicate 95% confidence intervals. Panels display results grouped by vapour pressure deficit (from highest to lowest, left to right), and panel labels show the mean vapour pressure deficit (calculated using measured relative humidity and temperature) across replicates of the corresponding group. All experimental trials occurred at temperatures between 22.7 and 22.9 °C. Predictions are based on a GLM with a binomial link, and use marginal responses, the default approach in the R package ggeffects (Lüdecke, 2018).

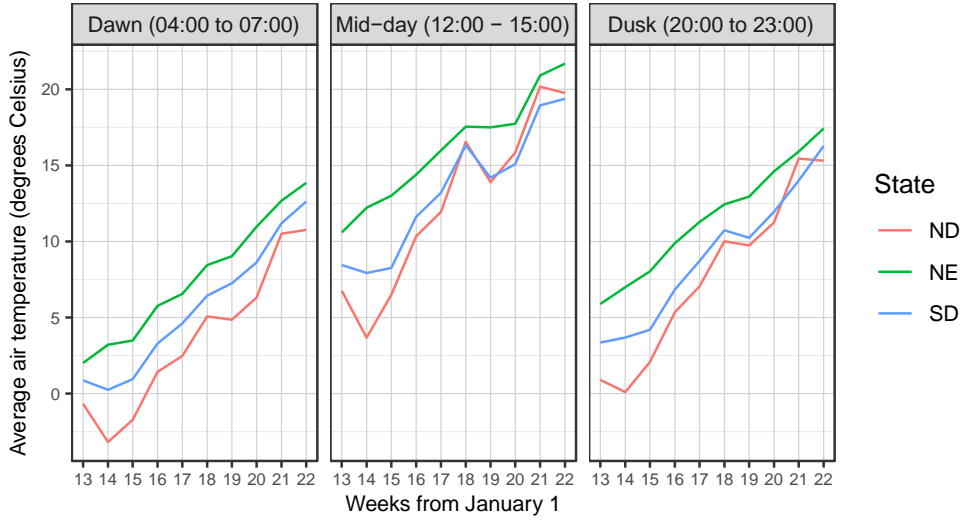
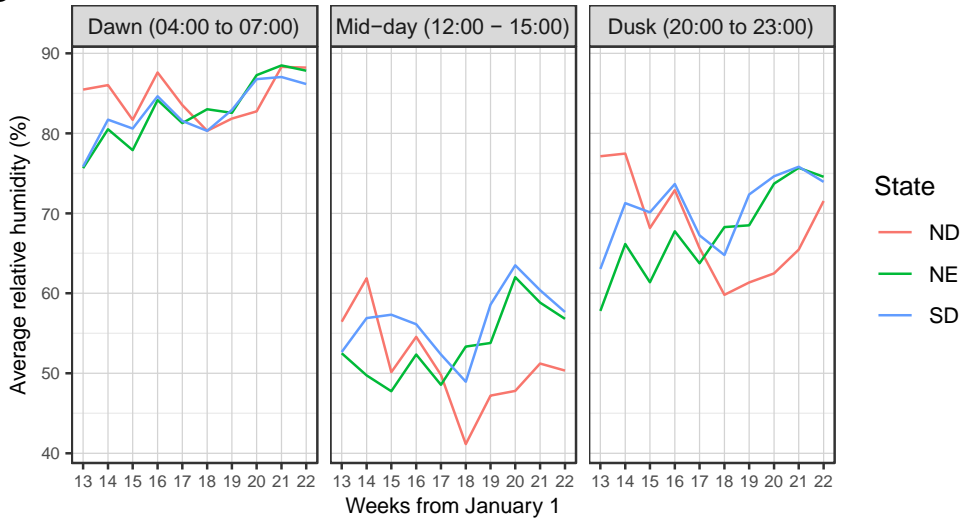
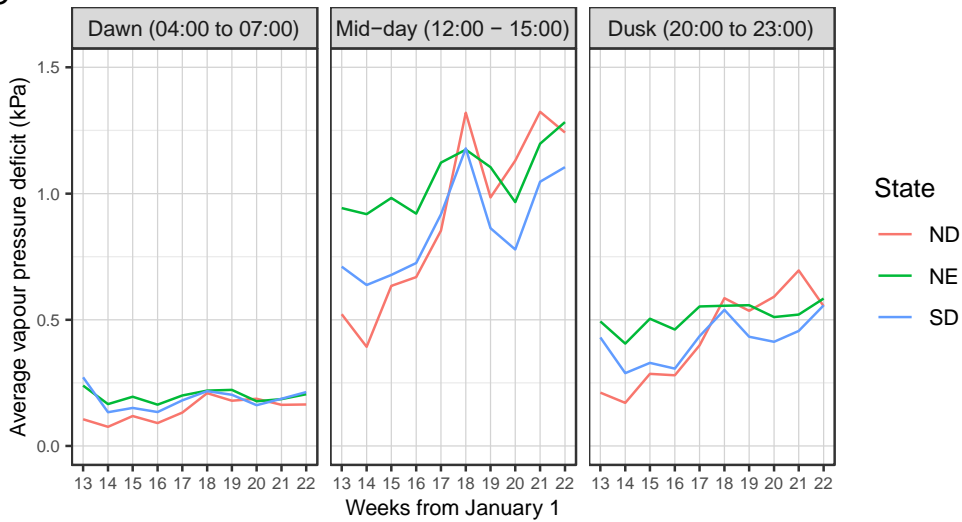
A**B****C**

Figure S7: Average values of (A) air temperature, (B) relative humidity, and (C) vapour pressure deficit for the three states in the study region, during the months of April and May, averaged over the six years spanning 2015 to 2020. Averages were calculated using data from 35, 21, and 40 ASOS station locations across North Dakota (ND), South Dakota (SD), and Nebraska (NE), respectively, and from three distinct time periods daily (panels left to right). Week 13 overlaps with the first week of April, and week 18 overlaps with the first week of May, which is used for generating geospatial predictions (Fig. 4).

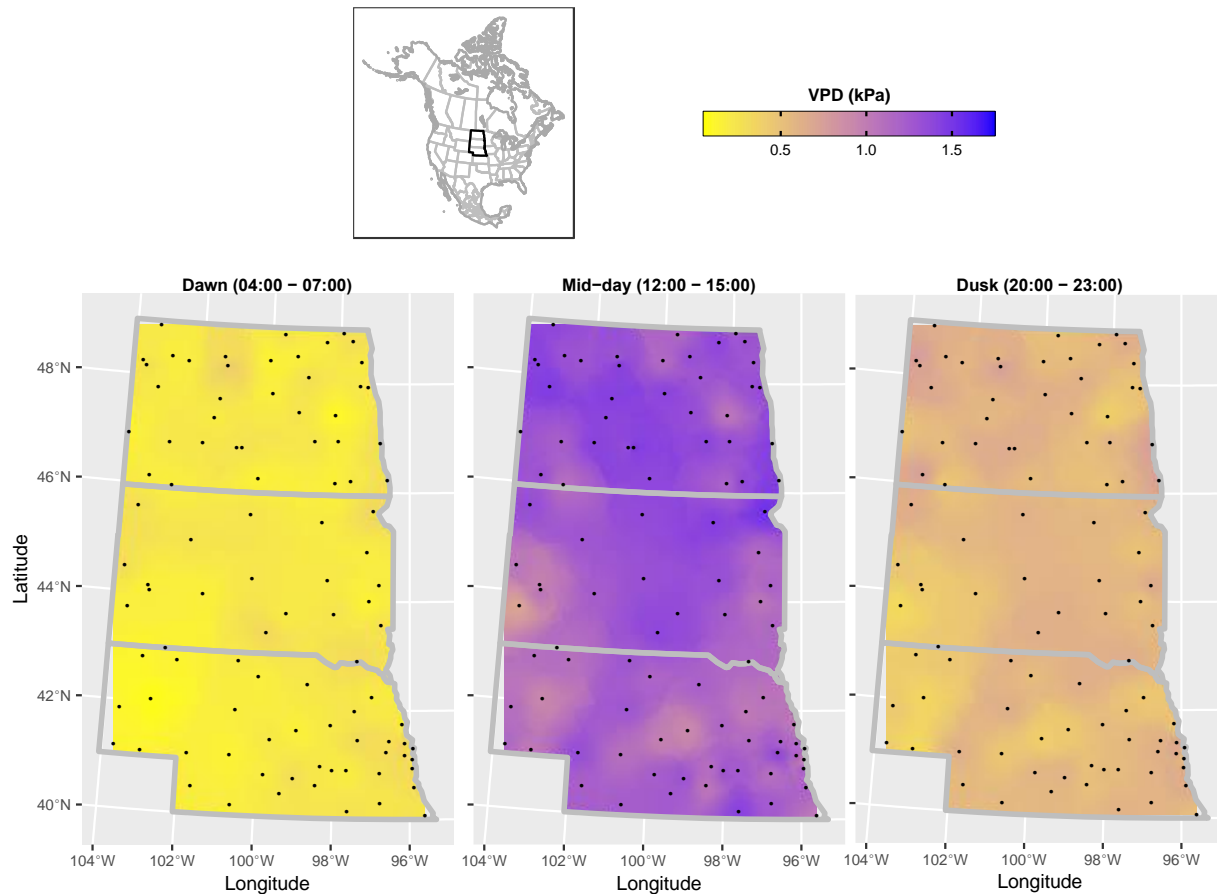


Figure S8. Inverse-distance weighted interpolations of vapour pressure deficit (VPD) based on relative humidity and air temperature readings from ninety-eight ASOS stations (black dots) for the first week of May, averaged over the years 2015 through 2020, and for three different times of day (dawn, mid-day, and dusk). In the three map panels the projection is North American Equidistant Conic. The map at the top shows the study region outlined in black within North America (North American Lambert Conformal Conic projection).

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