Accepted Manuscript

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The definitive version was published in Science on 366(6467), 2019.

DOI: http://dx.doi.org/10.1126/science.aay5945

# 1 Catchment properties and the photosynthetic trait composition of

### 2 freshwater plant communities

**3** Short title: Catchments rule aquatic plant traits

4 One sentence summary: The geographical distribution of bicarbonate use in freshwater plants is
5 controlled by catchment characteristics.

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#### 23 ABSTRACT

24 Unlike land plants, photosynthesis in many aquatic plants relies on bicarbonate in addition to 25  $CO_2$  to compensate for the low diffusivity and potential depletion of  $CO_2$  in water. 26 Concentrations of bicarbonate and CO<sub>2</sub> vary greatly with catchment geology. Here we 27 investigate whether there is a link between these concentrations and the frequency of freshwater 28 plants possessing the bicarbonate use trait. We show, globally, that the frequency of plant species 29 with this trait increases with bicarbonate concentration. Regionally however, the frequency of 30 bicarbonate use is reduced at sites where the CO<sub>2</sub> concentration is substantially above air-31 equilibrium consistent with this trait being an adaptation to carbon limitation. Future 32 anthropogenic changes of bicarbonate and CO<sub>2</sub> concentration may alter the species composition 33 of freshwater plant communities.

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### 35 MAIN TEXT

The biogeography of terrestrial plants is influenced by climatic factors; primarily air temperature 36 37 and precipitation (1). Furthermore, the distribution of biochemical traits such as the two terrestrial CO<sub>2</sub> concentrating mechanisms, C<sub>4</sub> photosynthesis and Crassulacean Acid 38 39 Metabolism, are linked to temperature and water availability (2). Although freshwater 40 angiosperms evolved from terrestrial ancestors (3), their growth is controlled by light, nutrients and inorganic carbon (4) rather than water, and therefore the factors influencing their 41 42 biogeography is likely to be different. Inorganic carbon potentially limits photosynthesis in aquatic systems, because the diffusion of  $CO_2$  is 10<sup>4</sup>-fold lower in water than in air. 43 Consequently, the  $CO_2$  concentration needed to saturate photosynthesis is up to 12 times the air 44

45 equilibrium concentration (5). Moreover, rapid photosynthesis can reduce CO<sub>2</sub> in water
46 substantially below air saturation (4).

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48 In response to carbon limitation, a few aquatic angiosperms evolved the same CO<sub>2</sub> concentrating 49 mechanisms found in their terrestrial ancestors, but the most frequent mechanism, found in about 50 half of studied submerged freshwater plants, is the exploitation of bicarbonate (HCO<sub>3</sub>; (4,6)), 51 derived from mineral weathering of soils and rocks in the catchment. Bicarbonate is the 52 dominant form of inorganic carbon in fresh waters when pH is between  $\sim 6.3$  and  $\sim 10.2$ , and its 53 concentration often exceeds that of  $CO_2$  by 10- to 100-fold (6). The ability to use bicarbonate is present in most taxonomic groups and appears to have evolved independently in cyanobacteria, 54 55 eukaryotic algae and vascular aquatic plants (7). This shows the fundamental importance of 56 bicarbonate use to plant fitness (6); increase of photosynthesis, growth and primary productivity 57 at higher bicarbonate concentrations has been documented (8-10). However, bicarbonate use is 58 not ubiquitous, because it involves costs as well as benefits. Costs include energy since it is an 59 active process (11) and rates of photosynthesis at limiting concentrations of inorganic carbon are greater in  $CO_2$  users than in bicarbonate users (5,12). Thus, where  $CO_2$  concentrations are 60 61 substantially above air saturation, as is often the case in streams, the benefit of bicarbonate use 62 will be reduced (13). Furthermore, obligate  $CO_2$  users can exploit alternative  $CO_2$  sources in the 63 air, lake sediment or in the water overlying the sediment (14), allowing continued photosynthesis 64 without the need to invest in mechanisms required for bicarbonate use.

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66 We hypothesized that since limitation of photosynthesis by inorganic carbon supply is

67 widespread in freshwater plants, the relative concentration of bicarbonate and CO<sub>2</sub> at a particular

site should determine the proportion of plants that are obligate CO<sub>2</sub> users *vs* bicarbonate users.
Since geochemical catchment characteristics determine bicarbonate concentration, there should
be broad biogeographical patterns in the proportion of freshwater plants able to use bicarbonate
while at a smaller scale, both the CO<sub>2</sub> and bicarbonate concentrations in lakes and streams might
structure the functional group composition.

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74 To test these hypotheses, we generated a database of freshwater angiosperms and their ability to 75 use bicarbonate as an inorganic carbon source, based on data found in the literature. These were 76 complemented with new data we gathered on 35 species from mainly tropical regions where few prior data existed (Table S1 and (15)). The resulting 131 species represent approximately 10% 77 78 of known species with a submerged life stage (16) and of these, 58 (44%) could use bicarbonate. 79 In order to quantify the distribution of bicarbonate users vs CO<sub>2</sub> users, we used: i) approximately 1 million geo-referenced plant records; ii) global plant ecoregion species lists; and iii) 963 site 80 81 specific plant compositions from northern hemisphere lakes and streams (Fig. S1). In each of the 82 investigated 963 sites, plant composition was related to measured concentration of CO<sub>2</sub> and bicarbonate. The geo-referenced plant records and ecoregion species lists were linked to local 83 84 bicarbonate concentrations derived from a constructed global map of bicarbonate concentration 85 (Fig. S2 and (15)).

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In the analyzed lake and stream sites, concentrations of both bicarbonate and CO<sub>2</sub> affected the occurrence of obligate CO<sub>2</sub> users *vs* bicarbonate users, but differently within and between lakes and streams (Fig. 1, and Fig. S3). The chance of observing a bicarbonate user in lakes and streams correlated directly with concentrations of bicarbonate and CO<sub>2</sub> ( $\Delta$ Habitat = -0.82 [-1.64;

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91	0.01] (mean [95% confidence intervals]; $\Delta$ represents the difference between streams and lakes
92	in parameter estimates at the log(odds) scale, Fig S3)), Fig. 1A). However, with increasing
93	bicarbonate concentrations, the likelihood of observing a bicarbonate user increased in lakes, but
94	not in streams ( $\Delta\beta_{Bicarbonate} = -0.82$ [-1.10; -0.54] Fig. 1B; see (15) for an explanation of $\beta$ ).
95	Moreover, with an increase in CO <sub>2</sub> , the chance of observing a bicarbonate user decreased in both
96	habitat types ( $\Delta\beta_{CO2}$ = -0.04 [-0.22; 0.13], Fig. 1C). The present study shows that the
97	concentration of bicarbonate has a different effect on the proportion of bicarbonate users in lakes
98	vs streams. Unlike in lakes, no relationship between bicarbonate availability and bicarbonate
99	users was found in streams. This upholds our hypothesis that where concentrations of $CO_2$ are
100	high, the competitive advantage of using bicarbonate as a carbon source for photosynthesis will
101	be reduced even if bicarbonate is available.
102	
103	Across global plant regions (17), the shifting proportions of bicarbonate users vs obligate CO <sub>2</sub>
104	users showed distinct spatial patterns (Fig. 2A). Compared to the overall mean, a higher
105	proportion of bicarbonate users was observed in Africa, temperate Asia, and the northern part of
106	North America (Fig. 2A). Globally, species utilizing bicarbonate were found in areas with higher

bicarbonate concentrations (bicarbonate users -  $CO_2$  users = 0.16 [0.02; 0.30] mM; Fig. 2C; see

108 Fig. 3 for a local example). The proportion of bicarbonate using species increased with

bicarbonate concentrations within ecoregions ( $\beta = 0.14$  [0.05; 0.24], (mean [95% confidence

110 limits]), Fig. 2B). Because catchment geology and geological history shape the distribution of

111 lakes and rivers, as well as the bicarbonate concentrations in freshwater ecosystems (18,19), they

are the chief determinants of plant distribution in freshwaters. CO<sub>2</sub> concentrations are largely

regulated by local CO<sub>2</sub> supersaturated inflow (20) and ecosystem metabolism, making modeling

difficult at large spatial scales (19,21). Thus, future models of freshwater CO<sub>2</sub> concentrations
may improve the prediction of plant distributions even further. Although global lake and river
data exist to some extent as annual means (22), given the temporal variability in CO<sub>2</sub>
concentration, the appropriate concentration would be that during the growing season at the
specific site (20).

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120 Anthropogenic changes as a consequence of deforestation, cultivation of land, application of 121 nitrate fertilizers and reduced atmospheric acid deposition (23) are causing large scale increases 122 in bicarbonate concentrations (24,25). The observed increasing bicarbonate concentrations are expected to cause a severe impact on bicarbonate poor lakes, because higher bicarbonate 123 124 concentrations will markedly change species composition (26) by allowing tall, fast growing 125 bicarbonate users to colonize and suppress smaller species adapted to the use of  $CO_2$  alone in or 126 near the sediment (27). There is evidence for re-establishment of species that are able to use 127 bicarbonate, after bicarbonate has increased because of liming (28) or as a result of reduction in 128 acid deposition (29). Moreover, systematic changes in species composition caused by changes in 129  $CO_2$  concentration has also been demonstrated in a river system where the proportion of  $CO_2$ 130 users declined as  $CO_2$  decreased downstream (13). In contrast, increasing atmospheric  $CO_2$ 131 concentrations, even if they influence dissolved CO<sub>2</sub>, will have little effect on the abundance of 132 bicarbonate users, since increases in CO<sub>2</sub> will be small relative to bicarbonate concentrations and 133 will have little effect on plant photosynthesis rate (30).

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135 Our study shows that bicarbonate use by aquatic angiosperms is widespread in fresh waters

around the globe, and that the proportion of obligate CO<sub>2</sub> users to bicarbonate users is

- 137 significantly related to the bicarbonate concentration. Among terrestrial plants, the evolution of 138 leaf traits and different photosynthetic pathways that enable rapid carbon assimilation and 139 improved water economy (31) has resulted in global biogeographical patterns that are linked to 140 variations in climate (32,33). In contrast, for freshwater plants, we show that biogeographical 141 patterns of bicarbonate use exist and that these are caused by catchment properties that determine 142 the concentration of bicarbonate and CO<sub>2</sub>. This insight will help evaluate the repercussions of future changes in concentration of bicarbonate and CO<sub>2</sub> on the biodiversity and ecosystem 143 144 function for fresh waters. 145 146 **REFERENCES AND NOTES** 147 148 1. M. C. Peel, B. L. Finlayson, T. A. McMahon, Updated world map of the Köppen-Geiger
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351

### 352 ACKNOWLEDGEMENTS

We thank L Adamec for providing data on *Oenanthe aquatica*, Tropica Aquarium Plants for the
generous supply of tropical aquatic plants, and K Murphy for sharing the species list of plants
with a submerged life form. We acknowledge the constructive suggestions by CM Duarte, H
Lambers and HH Bruun.

Funding: L.L.I was funded by the Carlsberg Foundation (CF17-0155 and CF18-0062). L.B.-S.
was funded by the Aage V. Jensen Foundation. D.G was funded by the Polish National Agency
for Academic Exchange (PPN/BEK/2018/1/00401) and K.S.-J. was funded by the Carlsberg
Foundation (grant CF14-0136).

- 362
- 363 Author contributions: L.L.I., A.W., L.B-S., S.C.M., K. S.-J. and O. P. designed the study,
- 364 framed the research questions, and wrote the manuscript, with input from the working group
- 365 (A.B.H., J.A., A.B-P., P.B., P.A.C., F.E., T.F., J.H., T.S.J, S.J.M., T.R., L.S. and O.V.). L.L.I.
- analyzed the data and prepared the figures. A.B.H and O.P. performed the pH-drift experiments
- and together with A.W. searched the literature for bicarbonate uptake in aquatic plants. A.W.,
- L.L.I., and L.B-S. assembled the data for the global analysis. F.E., L.B-S, L.S., S.C.M., S.J.M,
- 369 J.A., and T.F. assembled the site-specific lake data and the site-specific stream data was
- 370 assembled by A. B.-P., P.B., P.A.C., D.G., K.S.-J., T.R, T.S.J., and O.V., A.W., L.L.I., and L. B-
- 371 S. prepared the site-specific data for further analysis.

- **Competing interests:** The authors declare no competing interests.

- **Data availability:** All R scripts and cleaned datasets used for this analysis are available at the
- 376 Dryad Digital Repository.





### Fig. 1

# Bicarbonate use in submerged freshwater plant communities.

(A) likelihood of observing a bicarbonate user vs a CO<sub>2</sub> user in streams (n=172, red) and lakes (n=791, blue); (**B** and **C**), modeled odds of observing a bicarbonate user vs a CO<sub>2</sub> user as a function of bicarbonate (**B**) and  $CO_2$  (**C**) concentrations. Values > 1indicate a higher likelihood (A) or increase in likelihood (**B** and **C**) of observing a bicarbonate user vs a CO<sub>2</sub> user with a one unit increase in bicarbonate (**B**) and CO<sub>2</sub> concentrations (C). The dotted vertical lines show mean estimates and shaded areas the 95% confidence limits around the mean.

413



- 414

CO2 users bicarbonate users

- 415
- Fig. 2 416

#### 417 Global relationship between bicarbonate and the proportion of bicarbonate users in

freshwater plants. (A) Proportion of bicarbonate using species across 52 plant ecoregions. Grey 418

419 areas indicate regions where information on bicarbonate use in local plants is not available. (B)

- Relationship between mean bicarbonate concentration in plant regions and frequency of 420
- 421 bicarbonate users. The line represents the mean proportion of bicarbonate users. (C) Density
- 422 plots of bicarbonate preferences for bicarbonate users (n = 57) and obligate CO<sub>2</sub> users (n = 72).
- 423 The central horizontal black line represents the mean and the boxes indicate the 95% confidence
- 424 intervals around the mean.
- 425
- 426



- 427
- 428 429 **Fig. 3**
- 430 Steep gradients in bicarbonate concentrations and spatial separation in species distribution
- 431 in the British Isles. Distribution of two pondweed species with contrasting bicarbonate use in
- 432 the British Isles. *Potamogeton polygonifolius* (obligate CO<sub>2</sub> user, black triangles) is found in
- 433 areas with lower bicarbonate concentrations compared to *Potamogeton crispus* (bicarbonate user,
- 434 white circles). The top left insert shows the density distribution of the two species across

- 435 bicarbonate concentrations. Bicarbonate concentrations are from the global bicarbonate map
- 436 (Fig. S2) and species data were extracted from the geo-referenced plant occurrences (15).
- 437

### 438 Supplementary Materials

- 439 Materials and Methods (15).
- 440 References (*34-90*).
- 441 Fig. S1 Site-specific observations of bicarbonate use.
- 442 Fig. S2 Global bicarbonate map.
- 443 Fig. S3 The probability of observing bicarbonate use in a species at 963 study sites.
- 444 Fig. S4 Overview of *in situ* lake bicarbonate measurements.
- 445 Fig. S5 Variable importance plot of the Random Forest modelling global bicarbonate446 concentrations.
- 447 Fig. S6 Partial dependence plots of the eight variables used to model global bicarbonate448 concentrations.
- Fig. S7 Histogram of taxonomic distinctness for 1000 random subsamples of a fixed number of
  131 species drawn from a common species pool.
- 451 Table S1 List of freshwater angiosperms and their trait of inorganic carbon use.
- 452
- 453



# Supplementary Materials for

# Catchment properties and the photosynthetic trait composition of freshwater plant communities

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### This PDF file includes:

Materials and Methods Figs. S1 to S7 Table S1

### Other Supplementary Materials for this manuscript include the following:

Data S1 All R scripts and cleaned datasets used for this analysis are available at the Dryad Digital Repository.

### **Materials and Methods**

### Traits of inorganic carbon use in aquatic plants

Information on species ability to use bicarbonate was collected from the literature and *ex-situ* pH drift experiments. A comprehensive scientific literature search was conducted in order to identify and collect data on inorganic carbon use of aquatic angiosperms, resulting in the identification of 104 species with validated information. Nomenclature follows a *sensu* plant list: www.theplantlist.org.

Tropical plant species for experiments were received from an aquatic plant nursery (Tropica Aquarium plants, Egå, Denmark). To ensure expression of bicarbonate use in species capable of doing so, plants were acclimated for 14 days in water with a high bicarbonate concentration (2 mM HCO<sub>3</sub>) under air equilibrium of CO<sub>2</sub> (~20 µM CO<sub>2</sub>) in a temperature controlled room (20 °C). To ensure temperature stability, each aquarium was equipped with a heating element and temperature was increased to 23 °C ( $\pm$  1). Temperature was logged using a HOBO temperature/light sensor (HOBO Pendant, Onset Computer, Bourne, USA). The light regime was 12 h-light/12 h-darkness, with an average photon irradiance of 350  $\mu$ mol photons m<sup>-2</sup> s<sup>-1</sup> (PAR) provided by fluorescent tubes (Luminux cool daylight 39 W/865 HO, Osram GmbH, Munich, Germany). Nine individual plants of each species were divided into three 30 L aquaria (three plants in each). The medium was a modified Smart & Barko (34) solution with 75% KHCO<sub>3</sub> and 25% NaHCO<sub>3</sub> to ensure adequate potassium concentration. The medium was changed twice a week. When possible, plants were kept in the pots with stone wool in which they had been grown by the producer. When this was not possible, dependent on the plant morphology, plants were either planted in sand (0.6-1 mm grain size) or weighed down using a ceramic ring. pH drift experiments were used to identify the ability of plant species to use bicarbonate as a source of inorganic carbon (35). The pH drift experiment relies on the fact that any carbon taken up by a plant results in an increase in pH without influencing alkalinity. If pH increases to more than 9.4, the species is classified as a bicarbonate user as almost no  $CO_2$  is available (< 1  $\mu$ M at 20 °C and with an alkalinity of 1 meq.  $L^{-1}$ ) and it is inferred that HCO<sub>3</sub><sup>-</sup> is being used as a source of inorganic carbon.

Leaf segments weighing 60 mg ( $\pm$  5 mg) fresh mass were taken from the youngest fully developed leaf and cleared of any present epiphytes. The incubation medium was the same as that to which the plants had been acclimated (modified Smart & Barko solution, 2 mM HCO<sub>3</sub><sup>-</sup>). Oxygen concentration was reduced to 20% of air equilibrium by bubbling with N<sub>2</sub> to avoid photorespiration due to high O<sub>2</sub> concentration from photosynthesis. Twenty-five ml glass vials, containing two glass beads to ensure stirring, were used to incubate leaf tissue. Vials with leaves were mounted on a vertically rotating wheel in a temperature controlled water bath at 25 °C for 17 hours with an average photon irradiance of 555 µmol photons m<sup>-2</sup> s<sup>-1</sup> (Phillips Master, TL-D, 18W/840, Phillips, AE Eindhoven, Holland) measured with a 4 $\pi$  sensor (US-SQS/L, Walz GmbH, Effeltrich, Germany). After incubation, pH was measured with a pH electrode (403-M8\_s7/120. Rfill 9811, Mettler Toledo, Glostrup, Denmark; PHM 92, Radiometer, Brønshøj, Denmark).

### A global bicarbonate map

The global distribution of bicarbonate was estimated from existing global maps of runoff accumulated freshwater alkalinity (19) and soil pH in water (36) (Fig. S2). This analytical

approach was chosen in order to match site-specific plant observations to local bicarbonate concentrations. Given the heterogeneous distribution of specific habitats for each of our study species, we expected that local bicarbonate concentration would be the product of downstream routing of alkalinity through the watershed, and that local deviations from these accumulations would have been caused by local soil properties (37). Based on one layer of accumulated alkalinity (19) and seven layers of soil pH in water (cross section of standard depths 0, 5, 15, 30, 60, 100 and 200 cm; (36), we modelled 1806 site-specific measures of bicarbonate (gathered from a global dataset; see Fig. S4). Given that bicarbonate typically accounts for >95% of alkalinity in water (6), we used site-specific alkalinity as a proxy for bicarbonate concentration. The 1806 in situ bicarbonate concentrations were derived from two data sources: The GEMSTAT database (www.gemstat.org) and the WISE4 database of the European Environmental Agency (https://www.eea.europa.eu/data-and-maps/data/waterbase-waterquality). Following a previous study (6), we removed unrealistically high alkalinity values (> 5meq.  $L^{-1}$ ) and calculated mean alkalinity per site. The global map of runoff accumulated freshwater alkalinity (19) slightly underestimates high values of alkalinity, because it did not account for concentrating mechanisms such as evaporation. To prevent violating the premises of input data for the new bicarbonate map (Fig. S2), we excluded alkalinity values of more than 5 meq. L<sup>-1</sup> from the site-specific data prior to analyses. Finally, we calculated mean values per site for the subsequent analyses.

We used random forest models to model site-specific bicarbonate concentrations. Random forest is a nonparametric, machine learning regression tree combining individual decision trees (in this case, 500 trees) into a single ensemble model capable of fitting complex relationships with high predictive performance (38). Our random forest model was built using empirical bicarbonate measures as the response variable (to be modelled) and the corresponding values of the eight global layers as predicting variables. Each random forest model was run with a fixed set of 500 trees and a flexible number of predictors tried at each node (value set to the number of predictors divided by three). Consistency in error rates was visually inspected by plotting error rates against the number of trees in the ensemble. Across all models, the error rate stabilized between 50 and 100 trees. Model performance was evaluated by randomly splitting the 1806 measures into a training set (75%) and a test set (25%). The training data were used to build the model and the test data as an "out-of-bag" sample to compare observed and predicted bicarbonate values. From 1000 repetitions, a mean Pearson product moment correlation (ppmc) coefficient between observed and predicted bicarbonate was calculated for random forest models built on the runoff accumulated alkalinity layer, the seven pH soil maps, and a combination of all layers. The random forest model built on all eight layers produced the highest concordance between observed and predicted bicarbonate values (mean ppmc 0.73, Fig. S2B) supporting the initial inclusion of both accumulated runoff alkalinity and soil pH in the model. Alkalinity and lower levels of soil pH had the highest contribution to the model (Fig. S5) increasing with increasing bicarbonate concentrations (Fig. S6). Using the global coverage of the alkalinity and 7 soil pH maps, and the random forest model, global measures of bicarbonate were predicted at a 1/16 degree spatial resolution reflecting the highest common resolution of the input data (Fig. S2A).

### The global occurrence of bicarbonate users

Following recent global plant trait censuses (39), we used the world geographical scheme for recording plant distributions (TDWG; 1) to map the occurrence of all 131 study species. For each

studied species, we compiled occurrence data for the 52 subcontinental regions of TDWG extracted from the World Checklist of Selected Plant Families (<u>http://apps.kew.org/wcsp/</u>), supplemented with data from the Germplasm Resources Information Network (<u>https://www.ars-grin.gov</u>). We updated these occurrences with geo-referenced records from the Global Biodiversity Information Facility (GBIF; <u>http://gbif.org</u> [downloaded 3<sup>rd</sup> November 2016]). From a raw set of GBIF records, we removed non-geo-referenced and overlapping records within species, as well as obvious outliers (e.g. records from botanical gardens), creating a final dataset of 1,017,608 geo-referenced records. From these we calculated average bicarbonate values for each species based on a spatial overlay between plant records and the bicarbonate map (Fig. S2A). We evaluated differences in average bicarbonate preferences between bicarbonate users and obligate CO<sub>2</sub> users in a Gaussian linear contrast model.

The spatial extent of bicarbonate users vs obligate CO<sub>2</sub> users was analyzed by calculating the proportion of bicarbonate users in 52 TDWG regions. When present, the relationship between the proportion of bicarbonate users and mean bicarbonate concentration (estimated from the global bicarbonate map) in climate regions was analyzed via a beta regression model (*38*) by a logit link, with bicarbonate concentration as a linear predictor and the frequency of species using bicarbonate as the response variable. Statistical significance was evaluated by inspecting the 95% confidence estimates of the slope parameter in the regression model.

From a collective dataset of 963 sites (Fig. S1), we used site-specific observations of our 131 studied species to explore how the presence of bicarbonate user species were affected by local variations in  $CO_2$  and bicarbonate availability. The site-specific data originates from regional and national surveys of aquatic plants and water chemistry (pH and alkalinity) in lakes (40-42) and streams (43-45) that were also monitored for water chemistry variables. Site-specific  $CO_2$  concentrations were calculated based on alkalinity, pH and temperature according to (46). Site-specific temperatures were extracted from a high resolution (30 arc sec) land surface climate model (47) as mean temperature in the warmest quarter.

While increasing bicarbonate has been shown to increase the proportion of bicarbonate users in lakes (26), a similarly strong positive pattern has not been found in streams (43). In contrast, studies in both streams and lakes have shown that increasing CO<sub>2</sub> concentration positively affects the presence of obligate CO<sub>2</sub> users (and thus potentially decreasing the proportion of bicarbonate users) independently of bicarbonate concentration (13,48). From this, we predicted that on a large spatial scale, the probability of observing a bicarbonate user increases logarithmically with an increase in bicarbonate concentration and decreases logarithmically with an increase in bicarbonate and obligate CO<sub>2</sub> users across the 963 sites (having removed two sites with alkalinity measurements below zero).

A multivariable logistic regression model was created, containing interactions between i) habitat type (stream or lake) and bicarbonate concentration; and ii) habitat type and  $CO_2$  concentration as explanatory variables. These parameter interactions were used to test, on a log-odds scale, for differences in the effects of bicarbonate and  $CO_2$  concentrations on the probability of observing a species with bicarbonate use (do the observed species utilize bicarbonate or not). Initial model runs indicated the presence of spatial autocorrelation. Thus, we accounted for residual patterns of

spatial autocorrelation by adding a two dimensional spherical spline based on geographic coordinates in the model (49). Based on Moran's I autocorrelation coefficient of the residual outputs, the final model did not show any indications of spatial autocorrelation (observed Moran's I = -0.0026, Null expectation = -0.0001, P-value = 0.12). Statistical significance in the final model was evaluated by inspecting the 95% confidence estimates of the slope parameter in the regression model. Any significant interaction parameters would suggest different response to  $CO_2$  or bicarbonate gradients between lakes and streams (16). Parameter estimates for lakes and streams (as shown in Fig. 1) were derived from the full model estimates (Fig. S3) and shown as odds and change in odds (Fig. 1).

The 131 species with information about their bicarbonate use represent about 10% of the 1297 species known to have a predominantly fully submerged life stage (16), species list provided by Kevin Murphy. Upscaling the results of this study would require the 131 species to consist of a random sample from the phylogenetic tree of plants. We tested this assumption by comparing our sample from the global list of 1297 species. Owing to lack of a true phylogeny of all aquatic plants of the world, we used taxonomic hierarchies as a proxy for phylogenetic relationships; this approach has been used in several studies dealing with phylogenetic diversity (e.g., 50,51). We used Taxonomic Distinctness (TD), measuring the taxonomic distances between species in an assemblage, as a proxy for phylogenetic diversity (52). We used equal branch lengths and four taxonomic levels for the calculation of taxonomic distances between species: genus, family, order, and class for all of the 1297 species. Following Clarke & Warwick (52), we compared the observed TD with the values expected by randomly sampling 131 species from the entire species pool of 1297. Accordance between our observed TD and the random estimates indicates that the species included in our study represent a random taxonomic sample of the entire species pool. The observed TD of our 131 study species (82.7) did not differ from what would be expected by randomly selecting 131 species from the species pool (95% quantiles from 1000 simulations = 82.0-86.5, Fig. S7).





**Site-specific observations of bicarbonate use.** Spatial distribution of 963 sites used to explore how the presence of species able to use bicarbonate was affected by local variations in  $CO_2$  and bicarbonate concentration. Red dots represent lakes (n=791) and blue dots represent streams (n=172).





**Global bicarbonate map.** (A) Global bicarbonate map with 300×300 meter resolution modeled from bicarbonate data in 1806 lakes (obtained from GEMSTAT database (<u>www.gemstat.org</u>)) and 7 layers of soil pH using a random forest model. (B) Pearson product moment correlation coefficient of observed *vs* predicted bicarbonate using 3 different models. (C) Concentration of predicted bicarbonate as a function of observed bicarbonate.



The probability of observing bicarbonate use in a species at 963 study sites. Parameter estimates from a multiple logistic regression model, including habitat type (stream or lake), log(bicarbonate), and log(CO<sub>2</sub>) as explanatory variables. The dots represent means of log (odds) (for the intercepts) and change in log(odds) (for the slope parameters). Lines depict the 95% confidence limits of the mean.

# Fig. S4.



**Overview of** *in situ* **lake bicarbonate measurements.** Data taken from the GEMSTAT database (<u>www.gemstat.org</u>) and the European Environmental Agency (<u>https://www.eea.europa.eu</u>) provided bicarbonate data from six continents.

**Fig. S5.** 



Variable importance plot of the Random Forest modelling global bicarbonate concentrations. Total increase in node purities from splitting on the variable, averaged over all trees and derived from residual sum of squares. The variables are ordered top-to-bottom as mostto-least important.





**Partial dependence plots of the eight variables used to model global bicarbonate concentrations.** Each plot represents the unique effect of the eight explanatory variables on global bicarbonate concentration. Relationships are derived form a collective Random Forest model (see Methods above).

**Fig. S7.** 



**Histogram of taxonomic distinctness for 1000 random subsamples of a fixed number of 131 species drawn from a common species pool.** The orange shaded areas depict the 95% quantiles of the 1000 random samples. The vertical dotted line shows the taxonomic distinctness value of the 131 study species.

### Table S1.

Species	Trait	Source
Aldrovanda vesiculosa	$CO_2$	(53)
Alternanthera reineckii	$CO_2$	Original data
Aponogeton crispus	$CO_2$	Original data
Aponogeton longiplumulosus	$CO_2$	Original data
Aponogeton madagascariensis	$CO_2$	Original data
Aponogeton ulvaceus	$CO_2$	Original data
Berula erecta	$CO_2$	(54)
Blyxa aubertii	$CO_2$	Original data
Blyxa echinosperma	$CO_2$	(55)
Blyxa japonica	$CO_2$	(55)
Cabomba caroliniana	$CO_2$	(55,56)
Cabomba furcata	$CO_2$	Original data
Callitriche cophocarpa	$CO_2$	(5,54)
Callitriche hamulata	$CO_2$	(53)
Callitriche hermaphroditica	HCO <sub>3</sub> -	(57)
Callitriche longipedunculata	$CO_2$	(58)
Callitriche obtusangula	$CO_2$	Original data
Callitriche platycarpa	$CO_2$	Original data
Callitriche stagnalis	$CO_2$	(54)
Callitriche truncata	HCO <sub>3</sub> -	Original data
Callitriche verna	$CO_2$	Original data
Ceratophyllum demersum	HCO <sub>3</sub> -	(4,55)
Crassula aquatica	$CO_2$	(58)
Crassula helmsii	$CO_2$	(59)
Cryptocoryne albida	$CO_2$	Original data
Cryptocoryne crispatula	HCO <sub>3</sub> -	Original data
Cryptocoryne usteriana	$CO_2$	Original data
Deinostema violacea	$CO_2$	(55)
Echinodorus grisebachii	$CO_2$	Original data
Echinodorus palifolius	HCO <sub>3</sub> -	Original data
Egeria densa	HCO <sub>3</sub> -	(55)
Egeria najas	HCO3 <sup>-</sup>	(60)

Elatine californica	$CO_2$	(58)
Eleocharis acicularis	$CO_2$	(58)
Elodea canadensis	HCO <sub>3</sub> -	(61-63)
Elodea nuttallii	HCO <sub>3</sub> -	(55,64)
Eriocaulon aquaticum	HCO <sub>3</sub> -	(65,66)
Eriocaulon decangulare	$CO_2$	(67)
Eriocaulon setaceum	$CO_2$	Original data
Gratiola aurea	$CO_2$	(65)
Helanthium tenellum	$CO_2$	Original data
Hippuris vulgaris	$CO_2$	(35)
Hydrilla verticillata	HCO <sub>3</sub> -	(55,68,69)
Hygrophila corymbosa	$CO_2$	Original data
Hygrophila polysperma	HCO <sub>3</sub> -	(70)
Isolepis fluitans	$CO_2$	(71)
Juncus bulbosus	$CO_2$	(71)
Lagarosiphon madagascariensis	$CO_2$	Original data
Lagarosiphon major	HCO <sub>3</sub> -	(61)
Lemna trisulca	HCO <sub>3</sub> -	(71)
Limnophila polystachya	$CO_2$	Original data
Limnophila sessiliflora	HCO <sub>3</sub> -	(55,70)
Littorella uniflora	$CO_2$	(35,66)
Lobelia dortmanna	$CO_2$	(66,72)
Ludwigia repens	$CO_2$	(73)
Luronium natans	HCO <sub>3</sub> -	(74)
Marsilea vestita	$CO_2$	(58)
Myosotis laxa	$CO_2$	(54)
Myosotis scorpioides	$CO_2$	(54)
Myriophyllum alterniflorum	HCO <sub>3</sub> -	(4,35)
Myriophyllum aquaticum	$CO_2$	(55)
Myriophyllum salsugineum	$CO_2$	(75)
Myriophyllum spicatum	HCO <sub>3</sub> -	(5,35,55)
Myriophyllum tuberculatum	HCO <sub>3</sub> -	Original data
Myriophyllum verticillatum	$CO_2$	(5)
Najas flexilis	$CO_2$	(76)

Najas indica	HCO3 <sup>-</sup>	Original data
Najas marina	HCO <sub>3</sub> -	(55)
Najas oguraensis	HCO3 <sup>-</sup>	(55)
Nechamandra alternifolia	HCO <sub>3</sub> -	(55)
Nuphar lutea	$CO_2$	(35)
Nuphar pumila	$CO_2$	(55)
Nymphaea lotus	$CO_2$	Original data
Nymphoides hydrophylla	HCO <sub>3</sub> -	Original data
Oenanthe aquatica	$CO_2$	Original data
Ottelia acuminata	HCO <sub>3</sub> -	(77)
Ottelia alismoides	HCO <sub>3</sub> -	(77)
Pogostemon helferi	HCO <sub>3</sub> -	Original data
Potamogeton acutifolius	$CO_2$	Original data
Potamogeton berchtoldii	HCO <sub>3</sub> -	(71)
Potamogeton crispus	HCO <sub>3</sub> -	(14,35,55)
Potamogeton distinctus	HCO <sub>3</sub> -	(78)
Potamogeton friesii	HCO <sub>3</sub> -	(54)
Potamogeton fryeri	$CO_2$	(71,78)
Potamogeton gramineus	HCO <sub>3</sub> -	(79)
Potamogeton lucens	HCO <sub>3</sub> -	(55,73)
Potamogeton maackianus	HCO <sub>3</sub> -	(78)
Potamogeton natans	$CO_2$	(35,55,80)
Potamogeton nodosus	HCO <sub>3</sub> -	(78)
Potamogeton obtusifolius	HCO <sub>3</sub> -	Original data
Potamogeton oxyphyllus	HCO <sub>3</sub> -	(35,55)
Potamogeton pectinatus	HCO <sub>3</sub> -	(54,55)
Potamogeton perfoliatus	HCO <sub>3</sub> -	(35,54,55)
Potamogeton polygonifolius	$CO_2$	(35,81)
Potamogeton pusillus	HCO <sub>3</sub> -	(55,71)
Potamogeton schweinfurthii	HCO <sub>3</sub> -	(82)
Potamogeton x angustifolius	HCO <sub>3</sub> -	(14,35)
Ranunculus aquatilis	HCO <sub>3</sub> -	(14,35)
Ranunculus circinatus	HCO <sub>3</sub> -	(54)
Ranunculus flabellaris	$CO_2$	(83)

Ranunculus fluitans	HCO <sub>3</sub> -	(80)
Ranunculus peltatus	HCO <sub>3</sub> -	(14,63)
Ranunculus penicillatus	HCO <sub>3</sub> -	(71,84)
Ranunculus trichophyllus	HCO <sub>3</sub> -	(54)
Rotala rotundifolia	$CO_2$	Original data
Rotala wallichii	$CO_2$	Original data
Sagittaria sagittifolia	$CO_2$	(54)
Sagittaria subulata	$CO_2$	Original data
Schoenoplectus subterminalis	HCO <sub>3</sub> -	(85)
Schoenoplectus torreyi	HCO <sub>3</sub> -	(71)
Sparganium emersum	$CO_2$	(5,54)
Sparganium erectum	$CO_2$	(54)
Stratiotes aloides	HCO <sub>3</sub> -	(76,86)
Stuckenia filiformis	HCO <sub>3</sub> -	(35)
Stuckenia pectinata	HCO <sub>3</sub> -	(54)
Subularia aquatica	$CO_2$	(66,71)
Utricularia australis	$CO_2$	(53,87)
Utricularia gibba	$CO_2$	Original data
Utricularia graminifolia	$CO_2$	Original data
Utricularia intermedia	$CO_2$	(71)
Utricularia minor	$CO_2$	(53,87)
Utricularia purpurea	$CO_2$	(35,88)
Utricularia vulgaris	$CO_2$	(76)
Vallisneria americana	HCO <sub>3</sub> -	(71,89,90)
Vallisneria nana	$CO_2$	Original data
Vallisneria natans	HCO <sub>3</sub> -	(55)
Vallisneria spinulosa	HCO <sub>3</sub> -	(55)
Vallisneria spiralis	HCO <sub>3</sub> -	(5)
Veronica anagallis-aquatica	$CO_2$	(54)
Veronica beccabunga	$CO_2$	(54)
Zannichellia palustris	HCO <sub>3</sub> -	(71)

List of freshwater angiosperms and their trait of inorganic carbon use. Species names were corroborated using The Plant List <u>http://www.theplantlist.org/</u>

# Data S1. (separate file)

All R scripts and cleaned datasets used for this analysis are available at the Dryad Digital Repository.