

Assessing the roles of nitrogen, biomass, and niche dimensionality as drivers of species loss in grassland communities

Nir Band^{a,1}, Ronen Kadmon^a, Micha Mandel^b, and Niv DeMalach^c

Edited by Susan Harrison, University of California, Davis, CA; received July 1, 2021; accepted January 20, 2022

Eutrophication is a major driver of species loss in plant communities worldwide. However, the underlying mechanisms of this phenomenon are controversial. Previous studies have raised three main explanations: 1) High levels of soil resources increase standing biomass, thereby intensifying competitive interactions (the "biomass-driven competition hypothesis"). 2) High levels of soil resources reduce the potential for resource-based niche partitioning (the "niche dimension hypothesis"). 3) Increasing soil nitrogen causes stress by changing the abiotic or biotic conditions (the "nitrogen detriment hypothesis"). Despite several syntheses of resource addition experiments, so far, no study has tested all of the hypotheses together. This is a major shortcoming, since the mechanisms underlying the three hypotheses are not independent. Here, we conduct a simultaneous test of the three hypotheses by integrating data from 630 resource addition experiments located in 99 sites worldwide. Our results provide strong support for the nitrogen detriment hypothesis, weaker support for the biomass-driven competition hypothesis, and negligible support for the niche dimension hypothesis. The results further show that the indirect effect of nitrogen through its effect on biomass is minor compared to its direct effect and is much larger than that of all other resources (phosphorus, potassium, and water). Thus, we conclude that nitrogen-specific mechanisms are more important than biomass or niche dimensionality as drivers of species loss under high levels of soil resources. This conclusion is highly relevant for future attempts to reduce biodiversity loss caused by global eutrophication.

fertilization | meta-analysis | nutrient enrichment | productivity | species diversity

A decline in species richness with increasing resource availability is a universal pattern in plant communities (1-3). This pattern is particularly common in herbaceous plant communities and has been documented in hundreds of experiments worldwide (3-10). The recognition that anthropogenic eutrophication is a major threat to global diversity (11, 12) has accelerated research of the extent and implications of this phenomenon (13, 14). Nevertheless, the mechanisms by which high levels of resources cause a decline in species richness are not fully understood (15-21).

Early attempts to explain the decrease of richness under high levels of soil resources have attributed this pattern to an increase in biomass, leading to intensified interspecific competition (22, 23). According to this hypothesis (hereafter, the "biomass-driven competition hypothesis"), high levels of soil resources provide a competitive advantage for fast-growing and large species, excluding smaller and slow-growing species from the community (22–25). It has also been proposed (23) and demonstrated (26) that such competitive exclusion is primarily related to competition for light. Recent work attributes the pattern to the asymmetric nature of this competition [i.e., tall plants shade shorter ones but not the opposite (27)]. However, other works suggest that root competition may also contribute to species loss under high resource levels (15).

Another hypothesis that has gained support in the last decade has its roots in niche theory (28, 29). This hypothesis, known as the "niche dimension hypothesis" (30), is based on the idea that species coexistence requires niche partitioning via differences in resource requirements (29). According to this hypothesis, limiting resources function as "niche axes." Thus, high levels of soil resources reduce the number of limiting resources, thereby reducing the number of species that can coexist in the community (30). The strongest support for this hypothesis comes from a global-scale experiment (8) where the same experimental protocol was applied in all sites. This initiative is the most extensive experimental effort ever undertaken to evaluate diversity responses to resource addition (45 sites from five continents) and is unique in its factorial design: All communities in all sites received all possible combinations of nitrogen, phosphorus, and potassium (i.e., N, P, K, NP, NK, PK, and NPK). This factorial design allowed

Significance

Nutrient enrichment of natural ecosystems is a primary characteristic of the Anthropocene and a known cause of biodiversity loss, particularly in grasslands. In a global meta-analysis of 630 resource addition experiments, we conduct a simultaneous test of the three most prominent explanations of this phenomenon. Our results conclusively indicate that nitrogen is the leading cause of species loss. This result is important because of the increase in nitrogen deposition and the frequent use of nitrogen-based fertilizers worldwide. Our findings provide global-scale, experimental evidence that minimizing nitrogen inputs to ecological systems may help to conserve the diversity of grassland ecosystems.

Author affiliations: ^aDepartment of Ecology, Evolution & Behavior, The Hebrew University of Jerusalem, 9190401 Jerusalem, Israel; ^bDepartment of Statistics, The Hebrew University of Jerusalem, 9190501 Jerusalem, Israel; and ^cInstitute of Plant Sciences and Genetics in Agriculture, The Hebrew University of Jerusalem, 76100 Rehovot, Israel

Author contributions: N.B., R.K., and N.D. designed research; N.B. performed research; N.B. analyzed data; N.B., R.K., M.M., and N.D. wrote the paper; and M.M. advised on statistical aspects.

The authors declare no competing interest.

This article is a PNAS Direct Submission.

Copyright © 2022 the Author(s). Published by PNAS. This article is distributed under Creative Commons Attribution-NonCommercial-NoDerivatives License 4.0 (CC BY-NC-ND).

 ^1To whom correspondence may be addressed. Email: nir.band@mail.huji.ac.il.

This article contains supporting information online at http://www.pnas.org/lookup/suppl/doi:10.1073/pnas. 2112010119/-/DCSupplemental.

Published March 2, 2022.

the authors to test the effect of the number of added resources on species richness. Consistent with their expectations, species loss in fertilized plots was strongly and positively related to the number of added resources. Similar results were found in other studies (30–32) and were interpreted as support for the niche dimension hypothesis (although see ref. 20).

A third hypothesis suggests that the decline in species richness under high levels of soil resources is specifically related to nitrogen (hereafter, N). High levels of N may reduce plant performance by several mechanisms, including ammonium toxicity (33), acidification (34), changes in soil microbiome (35), and increased susceptibility to various stress agents (13, 14). This "nitrogen detriment hypothesis" is supported by studies showing that N addition has a stronger negative effect on species richness than other soil resources (refs. 4, 9, and 36, although see ref. 18).

In the last few decades, numerous studies, including a large number of meta-analyses, have investigated the drivers of species loss under high levels of resource availability (2, 3, 6–10, 37). However, each of these studies has focused on particular resources or mechanisms, and no study has attempted to test the three hypotheses simultaneously. This is a significant shortcoming because the mechanisms underlying the three hypotheses are not independent. Such a lack of independence increases the likelihood of confounding effects and may result in biased conclusions concerning the effects of the underlying mechanisms.

Here, we test the three hypotheses together using an extensive dataset collected from 630 different resource addition experiments in 99 different sites worldwide (Fig. 1 and *SI Appendix*, Table S1). Our analysis was designed to explicitly test distinct predictions derived from the above hypotheses. The first, derived from the biomass-driven competition hypothesis, is a negative effect of biomass on species richness. The second, derived from the niche dimension hypothesis, is a negative effect of the number of added resources on species richness. The third, derived from the nitrogen detriment hypothesis, is a negative effect of the presence of N on species richness (with all other resources having much weaker effects).

As emphasized above, the three hypotheses are not mutually exclusive, and more than a single mechanism might be involved in causing richness decline in response to resource addition. Thus, rather than considering the three hypotheses as alternatives, we aimed to evaluate the degree to which each hypothesis receives support from previously published experiments. To this end, we analyzed the data in two steps. First, we tested each hypothesis separately in order to verify that the patterns obtained from our dataset are consistent with those obtained in previous studies when testing each hypothesis by itself. Then, in a second step, we tested the three hypotheses simultaneously using two complementary approaches: multiple regression models and structural equation models. These approaches allowed us to quantitatively compare the effects of the three previously proposed drivers of species loss (biomass, number of resources, and presence of N) based on their predictive power and effect size and compare their direct vs. indirect effects on species richness.

Results

The first prediction, a decrease of species richness at high biomass levels, was supported by the data. However, a quadratic model provided a better fit to the data, indicating that the effect of biomass on richness was unimodal rather than negative (Fig. 2*A* and *SI Appendix*, Fig. S1 and Table S2). The quadratic model showed a corrected Akaike Information Criterion value that was lower by 33 units than that of the linear model (evidence ratio of 17×10^6). We, therefore, incorporated the quadratic term of biomass in all further models that included biomass as a predictor variable.

The second prediction, a negative effect of the number of added resources on species richness, was supported by the data (Fig. 2B). The effect was highly significant when tested using a linear mixed-effects model with the number of added resources as a linear predictor (as done in previous studies) (blue line in Fig. 2B; SI Appendix, Table S3). A corresponding model relaxing the assumption of linearity, in which the number of added resources was incorporated using dummy variables, indicated that the effects of one resource, two resources, and three resources were highly significant (red error bars in Fig. 2B; SI Appendix, Table S4). Moreover, the mean values of richness corresponding to the addition of zero, one, two, and three resources fell almost precisely on the linear regression line (Fig. 2B), confirming the linear response. Treatments including all four resources were removed from the latter analysis due to inadequate sample size (n = 3).

The third prediction, a negative effect of the presence of N on species richness, was also supported by the data (Fig. 2*C* and *SI Appendix*, Table S3). Moreover, this N-specific model showed a much better fit to the data (in terms of the model's corrected Akaike information criterion [AICc] value) than the other two models (evidence ratio of 7×10^{12} compared to the biomass model and 3×10^9 compared to the number of added resources model; *SI Appendix*, Table S3). The results further demonstrate that treatments including N (N = 1 in Fig. 2*C*) had lower richness than both control treatments and treatments without N (Fig. 2*C*). Similar results were obtained for a larger dataset, including an additional 374 records for which biomass data were unavailable (*SI Appendix*, Fig. S2).

Thus, all hypotheses were supported by our global dataset. To evaluate the relative importance of the drivers of species loss proposed by the three hypotheses, we incorporated the effects of the three factors in a single, mixed-effects model, with biomass (including its quadratic term), number of added resources, and N as fixed effects. The results of this integrated model indicated that biomass and N had statistically significant negative effects on richness, while the number of resources had a negligible and statistically insignificant effect (Table 1). Moreover, removing the number of added resources as a predictor from the model improved its AICc score by about seven units (evidence ratio of 39; Table 1). Conversely, omitting either biomass or N from the model resulted in a lower predictive power (Table 1). Thus, based on information theoretic criteria, the model providing the best fit to the data was one combining the effects of biomass (including its quadratic term) and N (Table 1).

One limitation of the integrated mixed-effects model is that it does not explicitly account for indirect relationships between model variables. Specifically, both N and the number of added resources are expected to influence richness indirectly through their effects on biomass. A common approach for modeling the combined direct and indirect effects in a single framework is structural equation modeling (SEM) (38). However, this approach is usually limited to linear relationships (38). We, therefore, incorporated a composite variable into the model. This composite variable describes the overall effect of biomass on species richness as the sum of its linear and quadratic terms (39) (Fig. 3). In essence, this approach reduces the



Fig. 1. General characteristics of the data included in our meta-analysis. (*A*) Geographical distribution of the sites included in the meta-analysis [red, sites of the nutrient network included in Harpole et al.'s study (8); green, other sites]. (*B*) The experimental treatments included in the meta-analysis and their prevalence in the dataset.

dimensionality of the biomass effect on richness from two dimensions (the linear and quadratic components) into a single variable that captures the combined effects of the original two dimensions on species richness. This synthetic ("composite") variable is then incorporated within the SEM framework as a linear term, thereby allowing us to quantify the effects of biomass, number of added resources, and N on species richness while accounting for the direct and indirect effects of N and the number of added resources through their effects on biomass [by multiplying the relevant coefficients (38)]. It should be noted, however, that the composite variable is not interchangeable with biomass in this model (e.g., the standardized coefficient for the effect of the composite variable on species richness is not equivalent to the effect of biomass on richness).

The results (Fig. 3 and *SI Appendix*, Table S5) revealed two important patterns. First, the direct effect of N on species richness was much larger than the direct effect of the number of added resources. The latter effect was also insignificant, as in the integrated mixed-effects model. Second, the direct effect of N on species richness was much larger than its indirect effect through the composite variable representing biomass (-0.1197 vs. -0.0150, respectively). Thus, N had both direct and indirect effects on richness, with the direct effect being much larger than the indirect one. This conclusion was also supported by an alternative SEM formulation in which the effect of biomass was introduced to the model in terms of its effect size (the log-response ratio; *SI Appendix*, Fig. S3). However, while this SEM formulation has the advantage that it does not require a

composite variable, it ignores the unimodal nature of the biomass-richness relationship and should therefore be interpreted with caution.

A final analysis was performed to test the effects of all combinations of resources for which we had data (N, P, K, water, NP, NK, PK, NPK, and NPK with water) on both standing biomass and species richness. The results of the biomass model indicated that only two treatments had statistically significant effects on biomass: N and P (Fig. 4A and SI Appendix, Table S6). Thus, both N and P had the potential to reduce richness through their indirect effects on biomass (as predicted by the biomass-driven competition hypothesis). However, a corresponding model with species richness as the response variable showed that only N had a statistically significant effect (blue bars in Fig. 4B; SI Appendix, Table S7). Thus, although P enrichment increases biomass according to our dataset, this increase is not translated into a decrease in richness. Finally, we found that adding biomass as a predictor to the all-resources model (red bars in Fig. 4B; SI Appendix, Table S7) had a negligible effect on the results. This result provides further support that the indirect effect of N on species richness through its effect on biomass was negligible relative to its direct effect.

Overall, our results can be summarized into three major findings: 1) Among the three previously proposed explanations for the negative effect of resource addition on species richness, the nitrogen detriment hypothesis receives the strongest support from published experiments. 2) Although both N and P (and the number of added resources) increase biomass, N is the



Fig. 2. Predicted species richness (mean \pm 95% CI) as a function of (*A*) standing biomass, (*B*) the number of added resources, and (*C*) the presence of nitrogen. (*A*) Prediction is based on a mixed-effects linear model with the linear and quadratic terms of biomass as fixed effects (conditional $R^2 = 0.888$, marginal $R^2 = 0.073$). (*B*) Blue, prediction of a mixed-effects linear

primary driver of species loss in this global-scale dataset. 3) The direct effect of N on richness is much larger than its indirect effect through biomass.

Discussion

We performed a global meta-analysis to test three major hypotheses regarding the decrease of species richness under high levels of soil resources: The biomass-driven competition hypothesis, the niche dimension hypothesis, and the nitrogen detriment hypothesis. The nitrogen detriment hypothesis gained the strongest support, the biomass-driven competition hypothesis gained intermediate support, and the niche dimension hypothesis has gained meager support in our analyses. Although these results do not refute the role of the biomassdriven competition hypothesis or the niche dimension hypothesis in specific systems, they suggest that, on a global scale, the primary mechanism of species loss following resource addition is specifically related to the presence of N. In the following sections, we discuss the interpretation and implications of these results in view of each hypothesis, as well as the limitations and implications of this study.

The Biomass-Driven Competition Hypothesis. The biomassdriven competition hypothesis asserts that the mechanism underlying species loss under high levels of soil resources is an increase in biomass which increases the likelihood of competitive exclusion (22–25). This hypothesis is supported by experimental studies (1, 3, 8, 9, 14). It has often been proposed to explain the decreasing phase of the unimodal biomass–richness relationships observed in many natural communities (2, 40).

In this meta-analysis, we limited our analysis to experimental studies and found that the effect of biomass on species richness was unimodal (Fig. 2*A* and *SI Appendix*, Table S2). This was somewhat surprising, as the prevalent pattern emerging from previous experimental studies is a monotonic decline in richness with increasing biomass. A common explanation for the disparity between experimental studies showing mostly negative relationships and natural gradients often showing a unimodal relationship is that many experimental studies are conducted at systems representing the decreasing phase of the unimodal biomass–richness relationship. Our results are consistent with this hypothesis, showing that, once a sufficiently broad biomass gradient is examined (and controlling for differences between sites), the pattern emerging from experimental studies is also unimodal.

Nevertheless, the biomass-driven competition hypothesis (22) gained only modest support in our analysis. While the total effect of N addition on species richness in our dataset was a reduction of $\sim 20\%$ (Fig. 4*B*), only $\sim 2\%$ was mediated by an increase in standing biomass (as indicated by the difference between the effects of N in models with and without biomass; Fig. 4*B*).

model with the number of resources treated as a continuous variable (conditional $R^2 = 0.879$, marginal $R^2 = 0.024$); red, predictions of a mixedeffects model with the number of resources treated as dummy variables (conditional $R^2 = 0.880$, marginal $R^2 = 0.025$). Data for four added resources are not shown due to small sample size. (C) Predictions are based on a mixed-effects model with three levels of resource addition treatments: control (red, no addition), treatments that do not include nitrogen (blue, N = 0), and treatments that include nitrogen (blue, N = 1, conditional $R^2 = 0.889$, marginal $R^2 = 0.031$). Biomass and richness are in logarithmic scale. See *SI Appendix*, Table S3 for statistical details.

Table	1. Results	of mixed-eff	ects models	testing th	e effects	of va	arious d	combinations	of	biomass	(B),	number	of
added	resources	(NAR), and n	itrogen (N),	on log-tran	sformed	specie	es richr	ness					

	Estimates								
Predictors of species richness	All	NAR + N	B + N	B + NAR					
Intercept	0.67 ***	1.09 ***	0.65 ***	0.68 ***					
·	(0.41 to 0.94)	(1.04 to 1.13)	(0.39 to 0.92)	(0.41 to 0.96)					
Biomass	0.43 ***		0.46 ***	0.46 ***					
	(0.21 to 0.66)		(0.24 to 0.69)	(0.23 to 0.70)					
Biomass ²	-0.11 ***		-0.12 ***	-0.12 ***					
	(-0.16 to -0.06)		(-0.17 to -0.07)	(-0.17 to -0.07)					
Number of added resources		-0.02 **	, ,	`_0.03 *** ´					
	(-0.02 to 0.00)	(-0.03 to -0.01)		(-0.04 to -0.02)					
N presence	_0.06 ***	`0.07 ***	-0.07 ***	, , , , , , , , , , , , , , , , , , ,					
•	(-0.08 to -0.05)	(-0.09 to -0.05)	(-0.09 to -0.06)						
Random effects									
σ^2	0.01	0.01	0.01	0.01					
τ_{00}	0.06	0.06	0.06	0.06					
ICC	0.89	0.89	0.89	0.88					
n	141	141	141	141					
Observations	630	630	630	630					
Marginal R^2 /conditional R^2	0.048/0.895	0.032/0.891	0.050/0.895	0.049/0.888					
AICc	-802.804	-798.651	-810.138	-766.253					

P < 0.01, *P < 0.001; σ^2 , residual (within-cluster) variance; τ_{00} , between-cluster variance; ICC, intraclass correlation coefficient; n, number of clusters; AICc, corrected AIC.



Fig. 3. Results of a structural equation model testing the three hypotheses together (the biomass-driven competition hypothesis, the niche dimension hypothesis, and the nitrogen detriment hypothesis). The model includes two equations; one with composite biomass as the response variable (conditional $R^2 = 0.83$, marginal $R^2 = 0.07$); another with species richness as the response variable (conditional $R^2 = 0.9$, marginal $R^2 = 0.05$). The observed variables are represented in rectangles. The hexagon indicates a composite variable (biomass-predicted species richness, including the linear and quadratic terms of biomass). Arrows show structural relationships (solid arrows indicate a positive effect, while dashed arrows indicate a negative effect). Black arrows represent significant (P < 0.05) relationships, and the gray arrow represents the nonsignificant relationship. Numbers near arrows are standardized coefficients obtained by local estimation. ***P < 0.001. The model was tested against nested unsaturated models and was found to be the best according to the AICc. See SI Appendix, Table S5 for details. Note that interpretation of arrows related to the composite variable within SEM differs from other types of variables (see details in Methods).

The Niche Dimension Hypothesis. The niche dimension hypothesis posits that limiting resources function as niche axes. According to this hypothesis, resource addition reduces the number of niche axes (i.e., the "dimensionality" of the niche space), thereby reducing the number of species that can coexist in the community (30). The most common prediction derived from this hypothesis is that increasing the number of added resources in resource addition experiments should decrease species richness (8, 31, 32, 41). Patterns consistent with this prediction have been observed in several previous experiments (as well as in our analysis; Fig. 2B) and were interpreted as a support for the niche dimension hypothesis (8, 31, 32, 41). However, this interpretation suffers from two limitations. First, previous studies show that increasing the number of added resources also increases aboveground biomass (20, 21). The more acute problem is that the total number of added resources is inherently correlated with the likelihood that any particular resource would be included in the set of added resources. For example, a balanced design of a factorial experiment including all combinations of N, P, and K (e.g., refs. 8, 31, 32, and 41) should include N addition in a third of the plots representing the single-resource treatment, two-thirds of the plots representing the two-resource treatment, and all plots of the threeresource treatment. This inherent correlation is expected to produce a negative response of mean richness to the number of added resources even if N is the only resource that reduces richness. This problem is well recognized in the statistical literature and is usually referred to as the problem of "multiple versions of a treatment" (42). As far as we know, none of the previous tests of the niche dimension hypothesis has considered this inherent confounding effect.

This study controlled for these confounding effects using two alternative modeling approaches: a mixed-effects model and a structural equation model. The latter approach explicitly accounts for possible indirect effects of the number of added resources and N on species richness through their effects on biomass. Our results indicate that, for both models, the effect



Fig. 4. Effects of the four resources examined in our analysis (N, P, K, and water) on (A) standing biomass and (B) species richness. Data shown are estimates of the predicted effects on (A) biomass and (B) richness, as estimated by mixed-effects models including all resources and their combinations (NP, NK, PK, NPK, and NPK with water) as fixed effects, without (blue) and with (red) biomass as a predictor in the model. Interactions are not shown, since they were statistically insignificant. For ease of interpretation, the estimated effects (mean \pm 95% CI) of each resource were transformed into percentage gain/loss of (A) biomass and (B) richness relative to the control (the dashed lines). See *SI Appendix*, Table S7 for the richness model.

of the number of added resources on species richness was insignificant (Fig. 3, Table 1, and *SI Appendix*, Fig. S4 and Table S5). This result contrasts the strong negative effect obtained in a simple model that ignores such confounding effects (Fig. 2*B*). Moreover, removing the number of added resources from the mixed-effects model increased the predictive power of the model (based on the AICc criterion; Table 1). These results seriously question previous studies interpreting the decrease in richness with an increasing number of added resources as evidence for the niche dimension hypothesis (8, 30–32).

The Nitrogen Detriment Hypothesis. Of all resource combination treatments included in our analysis (N, P, K, water, NP, NK, PK, NPK, and NPK with water; Fig. 1*B*), N had the largest and most significant effect on species richness (*SI Appendix*, Table S7). This pattern did not change when standing biomass was incorporated as an additional predictor in the model (*SI Appendix*, Table S7). Further analyses in which each resource was characterized by its amount (in grams per square meter per year or millimeters per year) provided similar results (*SI Appendix*, Table S7). This highly consistent finding aligns with previous meta-analyses indicating that N addition is the primary driver of richness decline in resource addition experiments (refs. 3, 4, 7, 9, and 36, although see ref. 18).

In principle, N addition could reduce species richness through its effect on biomass or through N-specific mechanisms not related to biomass (the essence of the nitrogen detriment hypothesis). There are two indications in our analysis for dominance of the latter hypothesis. First, in the SEM analysis, the standardized coefficient of the direct path from N to species richness was roughly an order of magnitude larger than that of the indirect path through biomass (-0.1197 vs. -0.0150, respectively). Second, a mixed-effects model incorporating the effects of all combinations of resources on species richness, with and without biomass, indicated that the total effect of N (direct + indirect) was larger by only 2% than its direct effect (a reduction of species richness by 20% vs. 18%, respectively; Fig. 4B). These results support our conclusion that the decline in richness under high levels of nutrients is related to N-specific effects.

In fact, more than three decades ago, Goldberg and Miller (43) proposed that the reduction in species richness following N enrichment might be related to resource-specific effects rather than an indirect effect through biomass. These authors compared the effects of adding water and N (as well as other nutrients) on both biomass and species richness. They found that water addition had a greater effect on biomass than N addition, but only N addition caused a decline in species richness. Based on these findings, they concluded that the decline in richness in their experiment was not related to an effect of N through biomass. They suggested, instead, that a differential phenology of limitation by different resources was the mechanism responsible for the change in richness. While their explanation cannot be tested with our dataset, our global-scale results are consistent with their experimental findings.

Several mechanisms can drive a "direct" negative effect of N on species richness. Besides direct toxicity of ammonia (33), N addition often causes soil acidification (13, 14, 34, 44–47). The acidification of the soil subsequently leads to lower availability of nutrients (13). Soil acidification also has adverse long-term effects, such as increased litter accumulation and concentrations of toxic metals (13). Experiments comparing the effects of N addition with and without soil buffering (using lime) have shown that the effect of N addition on species richness is much smaller once soil acidification is prevented (34). Consistent with these results, soil cation exchange capacity, which measures the soil's buffering capacity to acidification, is a major predictor of species loss following N addition in various systems (3, 6).

Another potential mechanism of species loss following N addition involves excessive N uptake. Extreme levels of N availability could increase N uptake and may result in toxic levels of N in plant tissue. Such levels of N can cause elongation of the vegetative phase in plants, delaying or preventing maturation, as well as increased susceptibility to temperature-related stress or drought (13, 33, 48).

N addition may also change the composition, diversity, and abundance of the microbial community (47, 49, 50). Such changes can alter various processes of plant-soil feedbacks, thereby favoring certain species over others and ultimately leading to competitive exclusions (35, 49).

While our results support the conclusion that N is the main driver of species loss in resource addition experiments, further experiments are necessary to better understand the mechanisms underlying this effect.

Methodological Issues. An inherent limitation of meta-analyses focusing on experimental studies is among-studies variability in the experimental design. In our meta-analysis, this variability is expressed by differences in the kinds of resources added, their absolute and relative amounts, the size of the experimental plots, the number of replicates, the duration of the experiment, etc. Additionally, our data are strongly unbalanced in the representation of the various experimental treatments, with some treatments, particularly N addition, having a much larger sample size than other treatments (Fig. 1*B*). These sources of variance, together with potential publication bias, could have affected our results and conclusions.

To evaluate the sensitivity of our results to these issues, we repeated all our analyses using two independent subsets of the data: the 45 sites of the standardized "NutNet" experimental network (8) and all other sites for which we had data (a total of 54 sites). Since data obtained from the "NutNet" network do not suffer from any of the above issues, a comparison of the results obtained from the two subsets of data allowed us to assess the sensitivity of our results to noise caused by inconsistency in the experimental design and publication bias. Furthermore, a strong consistency in the results obtained from the two datasets can be interpreted as significant support for our conclusions.

Comparing the patterns obtained for the two independent datasets revealed a high degree of similarity in both the general patterns (*SI Appendix*, Figs. S5–S9) and the statistical models (*SI Appendix*, Tables S8–S10). This strong consistency indicates that our findings are not mere artifacts of noise or biases in the data and further supports our conclusions.

Still, it should be emphasized that our study does not cover all previously proposed explanations for the negative effect of nutrient enrichment on species richness. For example, one particular hypothesis that could not be tested with our data is that the decline of richness under high levels of resources reflects a pure sampling effect of a decrease in the number of individuals (51). According to this hypothesis, increasing soil resources leads to an increase in average plant size, and this increase leads to a corresponding increase in the skewness of the plant size distribution (i.e., an increase in the relative frequency of relatively small plants). Since smaller plants are more likely to die than larger plants, this process reduces the number of individuals and decreases the number of species by a pure sampling effect (51, 52).

Finally, it should also be pointed out that we do not claim that competition is not important as a driver of species loss under high levels of soil resources. On the contrary, there are strong experimental indications that high levels of soil resources may reduce richness by increasing competition for light (26, 27). Nevertheless, what can be learned from our analysis is that the overall contribution of this mechanism to species loss in resource addition experiments is lower than that of N-specific effects.

Conclusion and Implications. This global-scale analysis provides strong support for the nitrogen detriment hypothesis, modest support for the biomass-driven competition hypothesis, and insufficient support for the niche dimension hypothesis.

The finding that N enrichment leads to the most detrimental effect on species richness has major implications for nature conservation (9, 13, 53), since N eutrophication is one of the main threats to biodiversity in this century (11). The fact that a low-diversity state could persist even decades after the reduction of N inputs makes this problem even more acute (54). Our results support previous suggestions concerning the need to reduce anthropogenic N emissions. Such efforts have been successful in some countries, but, in most parts of the world, the N deposition rate is still increasing (55). They also imply that future research should devote more efforts to identifying the specific mechanisms underlying the negative effect of N on species richness.

Methods

Literature Search. The basic criterion for inclusion of a study in the dataset was reporting results of species richness of herbaceous plants in experiments that include manipulation of at least one of the following soil resources: N, P, K, and water. We focused on these resources because other resource manipulations were too rare for statistical analyses.

We conducted our initial search in the Web of Science search engine, using the following phrase: "(richness OR *diversity OR "species loss" OR composition OR "community") AND ("resource addition*" OR "resource availability" OR "nutrient addition*" OR "nutrient enrichment*" OR "nutrient availability" OR (nitrogen AND addition*) OR (nitrogen AND enrichment*) OR "nitrogen availability" OR (phosphorus AND addition*) OR (phosphorus AND enrichment*) OR "phosphorus availability" OR (potassium AND addition*) OR (potassium AND enrichment*) OR "potassium availability" OR (water AND addition*) OR "water availability" OR irrigation) AND experiment* AND (grassland* OR herbaceous OR annual*)". This search yielded 2,213 results (1 April 2021). After screening manually through the titles and abstracts, 319 papers were found to be potentially relevant. An additional 107 studies were collected from references within these papers. A deeper scanning of the main text of these papers produced a final directory of 164 papers that reported richness responses to resource manipulations (*Sl Appendix*, Appendix 1).

Dataset Construction. Based on the data obtained from the 164 papers, we constructed a unified database where each record (row) represents the application of a single experimental treatment in a specific site and at a specific time. An experimental treatment was defined as the addition of a certain amount of a given resource to a set of replicated plots or, in cases of multiple resources, the application of a particular combination of resources to a set of replicated plots. Sets of control plots were also regarded as treatments with respect to their representation in the database. If a study reported data for multiple years, we recorded only the last year of observation. In cases where the same plot was sampled several times during the same year, a single time (the one with the highest mean richness in control plots) was selected for the analysis. When data were only reported in figures, we used the digitizing program GetData (56) to extract the relevant numerical data. This procedure resulted in 1,737 records, where each record represents the application of a single resource (e.g., P), a combination of resources (e.g., N and water), or a control group, and the corresponding species richness and biomass data (if available). Only treatments for which there was an appropriate control group were included in this dataset, and a given control group could be used as a reference to one or more resource addition treatments in the same site. We, therefore, coded the treatments in a manner that allowed us to relate each treatment to its relevant control. We termed this code "Cluster ID" and used it as a random variable in all analyses.

The above dataset was further refined to exclude several undesirable characteristics. Some studies were removed due to the use of unconventional measures that proved troublesome compared to the majority of the papers (e.g., reporting average species richness of specific functional groups rather than the entire community). When the same resource was added using different fertilizers, one type was chosen at random to prevent the disproportional weight of such studies in the analysis. In cases of studies reporting richness at multiple scales within the same plot (e.g., 1 m² and 10 m²), a single spatial scale was chosen based on the most common sampling unit size in the dataset (1 m²) to prevent pseudoreplication. Two studies showing extreme values of biomass or richness (at least 5 times greater than any other paper) were also removed from the dataset, as they were considered outliers.

Our statistical analyses (see below) were designed to distinguish between two types of predictors representing resource addition: quantitative data (the amount of each resource in the relevant treatment) and binary data (the presence or absence of each resource in a given treatment). We, therefore, created two subsets of data: 1) a quantitative dataset including all treatments where each treatment was characterized by the amount of each resource added; and 2) a binary dataset, where treatments were characterized by the presence or absence of each resource. The latter dataset was further reduced to equalize the weight of experiments applying single versus multiple amounts of resources when using the binary dataset. Specifically, if different amounts of the same (single) resource were applied in the same experiment, only a single amount was selected for the binary dataset-the one that was most common in the rest of the experiments (10 $g \cdot m^{-2} \cdot y^{-1}$ for nutrients and 180 mm for water). The final binary dataset included 1,004 records distributed over 150 different locations (Fig. 1 and SI Appendix, Appendix 1 and Table S1). Biomass data were available for 630 of these records, distributed over 99 locations.

Most of our analyses used the binary dataset, except for testing the effects of all combinations of resources on species richness, which was applied on both datasets to test robustness.

Data Analysis. All our analyses are based on mixed-effects models with cluster IDs treated as a random effect to account for differences between sites. To meet the assumption of the model, we have log₁₀-transformed biomass and species richness which improved the normality and minimized heteroscedasticity of the data. All statistical analyses were performed in R version 4.1.1 using the packages MuMIn, Ime4, ImerTest, and piecewiseSEM (57–60).

We started by testing each hypothesis separately. First, the prediction that increasing biomass reduces richness was tested using both linear and quadratic models. Next, we tested the effect of the number of added resources on species richness. The number of added resources was treated as a continuous variable or a set of dummy variables for each resource level. In the dummy variable model, each treatment was assigned to one of five categories based on the number of resources added in that treatment (zero, one, two, three, or four resources). However, the last category was omitted due to the small sample size (n = 3). Lastly, we tested the prediction that the presence of N reduces species richness while other resources do not. In this model, all combinations of experimental treatments were classified into three groups: control treatments (no addition), resource addition treatments without N, and resource addition treatments without N should not differ in richness from the control treatments, and both treatments should show higher richness than resource addition treatments with N.

In the second step, we incorporated the effects of biomass (including its linear and quadratic terms), the number of added resources, and N in a single integrated model. Two types of models were used for this purpose: a multiple regression model and a SEM. To better interpret the regression model results,

- C. J. Stevens, N. B. Dise, J. O. Mountford, D. J. Gowing, Impact of nitrogen deposition on the species richness of grasslands. *Science* 303, 1876-1879 (2004).
- L. H. Fraser *et al.*, Plant ecology. Worldwide evidence of a unimodal relationship between productivity and plant species richness. *Science* **349**, 302–305 (2015).
- G. Midolo et al., Impacts of nitrogen addition on plant species richness and abundance: A global meta-analysis. Glob. Ecol. Biogeogr. 28, 398–413 (2019).
- L. Gough, C. W. Osenberg, K. L. Gross, S. L. Collins, Fertilization effects on species density and primary productivity in herbaceous plant communities. *Oikos* 89, 428–439 (2000).
- K. N. Suding *et al.*, Functional- and abundance-based mechanisms explain diversity loss due to N fertilization. *Proc. Natl. Acad. Sci. U.S.A.* **102**, 4387–4392 (2005).
- C. M. Clark *et al.*, Environmental and plant community determinants of species loss following nitrogen enrichment. *Ecol. Lett.* **10**, 596–607 (2007).
- A. D. Schrijver et al., Cumulative nitrogen input drives species loss in terrestrial ecosystems. Glob. Ecol. Biogeogr. 20, 803–816 (2011).
- W. S. Harpole *et al.*, Addition of multiple limiting resources reduces grassland diversity. *Nature* 537, 93–96 (2016).
- M. B. Soons et al., Nitrogen effects on plant species richness in herbaceous communities are more widespread and stronger than those of phosphorus. *Biol. Conserv.* 212, 390-397 (2017).
- N. DeMalach, E. Zaady, R. Kadmon, Contrasting effects of water and nutrient additions on grassland communities: A global meta-analysis. *Glob. Ecol. Biogeogr.* 26, 983–992 (2017).
- O. E. Sala *et al.*, Global biodiversity scenarios for the year 2100. *Science* 287, 1770–1774 (2000).
- 12. D. Tilman *et al.*, Forecasting agriculturally driven global environmental change. *Science* **292**, 281–284 (2001).

we also compared the predictive power of regression models incorporating all possible combinations of biomass, the number of added resources, and N, based on their AICc (61). Differences in AICc values obtained for selected pairs of models were also expressed as evidence ratio [the ratio between their Akaike weights (62)] to interpret the magnitude of the observed differences more intuitively.

The second type of model (SEM) was designed for separating the direct and biomass-mediated effects of N and the number of added resources on species richness. The first equation of the SEM included the number of added resources and N as predictors of a composite variable representing the predicted species richness by the linear and quadratic terms of biomass. The second equation included the composite variable, the number of added resources, and N as predictors of species richness. Biomass was incorporated as a composite variable to account for its unimodal effect on species richness (see ref. 39 for details on incorporating guadratic relationships in SEM using composite variables). This approach enables calculating indirect effects through biomass by multiplying the relevant coefficients (arrows in Fig. 3). However, caution is needed in interpreting the signs of the arrows; for example, a negative effect of nitrogen on the composite variable does not represent a negative effect on biomass but a negative effect on species richness as predicted by biomass. In other words, the coefficients related to the composite variable should not be interpreted as effects of, or on, biomass.

The analysis of the SEM started with a saturated model that included all the potential paths, which we later compared to simpler models by removing paths (19). We compared the AICc scores of all potential submodels and ultimately chose the saturated model because it best fitted the data (i.e., had the lowest AICc score). We have also built an alternative SEM in which biomass and richness were incorporated in terms of their effect size instead of their actual values (everything else was the same). The effect size was calculated as the log₁₀-transformed ratio between treatment and control values (63).

The third phase of the analysis aimed to compare the effects of the four types of resources (N, P, K, and water) on biomass and species richness using multiple regressions. Specifically, we tested whether each combination of the four resources affects biomass, and whether the effects of the resources on species richness are mediated by biomass. For the second aim, we compared the effects of each resource on species richness in a model that included only the resources and a model that also included biomass. The model without biomass estimates the combined effects of the direct and biomass-mediated effects, while the model that includes biomass estimates the direct effect of each resource combination.

Data Availability. The csv files and R file have been deposited in Figshare, https://figshare.com/s/d2933788bc55814b47f3 (64). Previously published data were used for this work (8, 27, 34, 43, 44, 53, 65–196).

ACKNOWLEDGMENTS. We thank all colleagues who conducted and published the studies included in this research, particularly W. S. Harpole and M. B. Soons, who generously provided their data. The study was supported by Israel Science Foundation Grant 192/19 and the Hebrew University Advanced School of Environmental Studies.

- R. Bobbink et al., Global assessment of nitrogen deposition effects on terrestrial plant diversity: A synthesis. Ecol. Appl. 20, 30–59 (2010).
- C. J. Stevens et al., Nitrogen deposition threatens species richness of grasslands across Europe. Environ. Pollut. 158, 2940-2945 (2010).
- T. K. Rajaniemi, V. J. Allison, D. E. Goldberg, Root competition can cause a decline in diversity with increased productivity. J. Ecol. 91, 407–416 (2003).
- E. G. Lamb, S. W. Kembel, J. F. Cahill, Shoot, but not root, competition reduces community diversity in experimental mesocosms. J. Ecol. 97, 155–163 (2009).
- T. L. Dickson, B. L. Foster, Fertilization decreases plant biodiversity even when light is not limiting. Ecol. Lett. 14, 380–388 (2011).
- T. Ceulemans, R. Merckx, M. Hens, O. Honnay, Plant species loss from European semi-natural grasslands following nutrient enrichment – is it nitrogen or is it phosphorus? *Glob. Ecol. Biogeogr.* 22, 73–82 (2013).
- 19. J. B. Grace *et al.*, Integrative modelling reveals mechanisms linking productivity and plant species richness. *Nature* **529**, 390–393 (2016).
- N. DeMalach, R. Kadmon, Light competition explains diversity decline better than niche dimensionality. *Funct. Ecol.* 31, 1834–1838 (2017).
- W. S. Harpole et al., Out of the shadows: Multiple nutrient limitations drive relationships among biomass, light and plant diversity. Funct. Ecol. 31, 1839–1846 (2017).
- 22. J. P. Grime, Competitive exclusion in herbaceous vegetation. *Nature* **242**, 344–347 (1973).
- 23. E. I. Newman, Competition and diversity in herbaceous vegetation. Nature 244, 310 (1973).
- R. Aerts, Interspecific competition in natural plant communities: Mechanisms, trade-offs and plant-soil feedbacks. J. Exp. Bot. 50, 29–37 (1999).

- T. K. Rajaniemi, Explaining productivity-diversity relationships in plants. *Oikos* 101, 449-457 (2003).
- Y. Hautier, P. A. Niklaus, A. Hector, Competition for light causes plant biodiversity loss after eutrophication. *Science* **324**, 636–638 (2009).
- N. DeMalach, E. Zaady, R. Kadmon, Light asymmetry explains the effect of nutrient enrichment on grassland diversity. *Ecol. Lett.* 20, 60–69 (2017).
- 28. G. E. Hutchinson, Concluding remarks. Cold Spring Harb. Symp. Quant. Biol. 22, 415–427 (1957).
- D. Tilman, *Resource Competition and Community Structure* (Princeton University Press, 1982).
 W. S. Harpole, D. Tilman, Grassland species loss resulting from reduced niche dimension. *Nature* 446, 791–793 (2007).
- Z. Ren et al., Effects of resource additions on species richness and ANPP in an alpine meadow community. J. Plant Ecol. 3, 25–31 (2010).
- W. S. Harpole, K. N. Suding, A test of the niche dimension hypothesis in an arid annual grassland. *Oecologia* 166, 197-205 (2011).
- D. T. Britto, H. J. Kronzucker, NH4+ toxicity in higher plants: A critical review. J. Plant Physiol. 159, 567-584 (2002).
- M. J. Crawley et al., Determinants of species richness in the Park Grass Experiment. Am. Nat. 165, 179–192 (2005).
- E. C. Farrer, K. N. Suding, Teasing apart plant community responses to N enrichment: The roles of resource limitation, competition and soil microbes. *Ecol. Lett.* 19, 1287–1296 (2016).
- N. DeMalach, Toward a mechanistic understanding of the effects of nitrogen and phosphorus additions on grassland diversity. *Perspect. Plant Ecol. Evol. Syst.* 32, 65–72 (2018).
- L. Korell, H. Auge, J. M. Chase, W. S. Harpole, T. M. Knight, Responses of plant diversity to precipitation change are strongest at local spatial scales and in drylands. *Nat. Commun.* 12, 2489 (2021).
- 38. J. B. Grace, *Structural Equation Modeling and Natural Systems* (Cambridge University Press, 2006).
- S. Soliveres *et al.*, Plant diversity and ecosystem multifunctionality peak at intermediate levels of woody cover in global drylands. *Glob. Ecol. Biogeogr.* 23, 1408–1416 (2014).
- G. G. Mittelbach *et al.*, What is the observed relationship between species richness and productivity? *Ecology* 82, 2381–2396 (2001).
- C. D. Molina, P. M. Tognetti, P. Graff, E. J. Chaneton, Mowing does not redress the negative effect of nutrient addition on alpha and beta diversity in a temperate grassland. J. Ecol. 109, 1501–1510 (2021).
- K. Kimmel, L. E. Dee, M. L. Avolio, P. J. Ferraro, Causal assumptions and causal inference in ecological experiments. *Trends Ecol. Evol.* 36, 1141–1152 (2021).
- D. E. Goldberg, T. E. Miller, Effects of different resource additions of species diversity in an annual plant community. *Ecology* 71, 213-225 (1990).
- 44. W. J. Roem, H. Klees, F. Berendse, Effects of nutrient addition and acidification on plant species diversity and seed germination in heathland. *J. Appl. Ecol.* **39**, 937–948 (2002).
- D. Tian, S. Niu, A global analysis of soil acidification caused by nitrogen addition. *Environ. Res.* Lett. 10, 024019 (2015).
- S. M. Simkin *et al.*, Conditional vulnerability of plant diversity to atmospheric nitrogen deposition across the United States. *Proc. Natl. Acad. Sci. U.S.A.* **113**, 4086-4091 (2016).
- D. Chen *et al.*, Direct and indirect effects of nitrogen enrichment on soil organisms and carbon and nitrogen mineralization in a semi-arid grassland. *Funct. Ecol.* 33, 175–187 (2019).
- S. Güsewell, N : P ratios in terrestrial plants: Variation and functional significance. New Phytol. 164, 243–266 (2004).
- J. W. Leff et al., Consistent responses of soil microbial communities to elevated nutrient inputs in grasslands across the globe. Proc. Natl. Acad. Sci. U.S.A. 112, 10967–10972 (2015).
- J. Zeng *et al.*, Nitrogen fertilization directly affects soil bacterial diversity and indirectly affects bacterial community composition. *Soil Biol. Biochem.* 92, 41–49 (2016).
- J. Oksanen, Is the humped relationship between species richness and biomass an artefact due to plot size? J. Ecol. 84, 293-295 (1996).
- 52. J. Weiner, Size hierarchies in experimental populations of annual plants. *Ecology* **66**, 743–752 (1985).
- C. M. Clark, D. Tilman, Loss of plant species after chronic low-level nitrogen deposition to prairie grasslands. *Nature* 451, 712-715 (2008).
- F. Isbell, D. Tilman, S. Polasky, S. Binder, P. Hawthorne, Low biodiversity state persists two decades after cessation of nutrient enrichment. *Ecol. Lett.* 16, 454-460 (2013).
- J. N. Galloway et al., Transformation of the nitrogen cycle: Recent trends, questions, and potential solutions. Science 320, 889–892 (2008).
- GetData, Graph digitizer. Version 2.26.0.20. http://getdata-graph-digitizer.com/. Accessed 12 May 2020.
- R-Forge, MuMIn multi-model inference: Project home. Version 1.43.17. https://r-forge.r-project. org/projects/mumin/. Accessed 28 November 2020.
- D. Bates, M. Mächler, B. Bolker, S. Walker, Fitting linear mixed-effects models using Ime4. J. Stat. Softw. 67, 1-48 (2015).
- A. Kuznetsova, P. B. Brockhoff, R. H. B. Christensen, ImerTest package: Tests in linear mixed effects models. J. Stat. Softw. 82, 1–26 (2017).
- J. S. Lefcheck, piecewiseSEM: Piecewise structural equation modelling in r for ecology, evolution, and systematics. *Methods Ecol. Evol.* 7, 573–579 (2016).
- H. Akaike, "Information theory and an extension of the maximum likelihood principle" in Selected Papers of Hirotugu Akaike, E. Parzen, K. Tanabe, G. Kitagawa, Eds. (Springer Series in Statistics, Springer, 1998), pp. 199-213.
- K. P. Burnham, D. R. Anderson, K. P. Huyvaert, AIC model selection and multimodel inference in behavioral ecology: Some background, observations, and comparisons. *Behav. Ecol. Sociobiol.* 65, 23–35 (2011).
- J. Gurevitch, S. Nakagawa, "Research synthesis methods in ecology" in *Ecological Statistics*, G. A. Fox, S. Negrete-Yankelevich, V. J. Sosa, Eds. (Oxford University Press, 2015), pp. 200–227.
- N. Band, R. Kadmon, M. Mandel, N. DeMalach, Assessing the roles of nitrogen, biomass, and niche dimensionality as drivers of species loss in grassland communities. Figshare. https:// figshare.com/s/d2933788bc55814b47f3. Deposited 17 February 2022.
- J. M. Alatalo, C. J. Little, A. K. Jägerbrand, U. Molau, Vascular plant abundance and diversity in an alpine heath under observed and simulated global change. *Sci. Rep.* 5, 10197 (2015).
- S. G. Baer, J. M. Blair, S. L. Collins, A. K. Knapp, Soil resources regulate productivity and diversity in newly established tallgrass prairie. *Ecology* 84, 724-735 (2003).

- S. Báez, S. L. Collins, W. T. Pockman, J. E. Johnson, E. E. Small, Effects of experimental rainfall manipulations on Chihuahuan Desert grassland and shrubland plant communities. *Oecologia* 172, 1117–1127 (2013).
- B. Beltman, J. H. Willems, S. Güsewell, Flood events overrule fertilizer effects on biomass production and species richness in riverine grasslands. J. Veg. Sci. 18, 625–634 (2007).
- 69. R. Bobbink, Effects of nutrient enrichment in Dutch chalk grassland. J. Appl. Ecol. 28, 28-41 (1991).
- E. T. Borer, E. W. Seabloom, C. E. Mitchell, J. P. Cronin, Multiple nutrients and herbivores interact to govern diversity, productivity, composition, and infection in a successional grassland. *Oikos* 123, 214–224 (2014).
- W. D. Bowman, T. A. Theodose, J. C. Schardt, R. T. Conant, Constraints of nutrient availability on primary production in two alpine tundra communities. *Ecology* 74, 2085–2097 (1993).
- A. J. Britton, J. M. Fisher, Interactive effects of nitrogen deposition, fire and grazing on diversity and composition of low-alpine prostrate Calluna vulgaris heathland. J. Appl. Ecol. 44, 125–135 (2007).
- L. Calvo, I. Alonso, E. Marcos, E. D. Luis, Effects of cutting and nitrogen deposition on biodiversity in Cantabrian heathlands. *Appl. Veg. Sci.* 10, 43-52 (2007).
- A. Chalmers, S. McIntyre, R. D. B. Whalley, N. Reid, Grassland species response to soil disturbance and nutrient enrichment on the Northern Tablelands of New South Wales. *Aust. J. Bot.* 53, 485–499 (2005).
- H. Chen, L. Ma, X. Xin, J. Liu, R. Wang, Plant community responses to increased precipitation and belowground litter addition: Evidence from a 5-year semiarid grassland experiment. *Ecol. Evol.* 8, 4587–4597 (2018).
- W. Chen et al., Plant diversity is coupled with beta not alpha diversity of soil fungal communities following N enrichment in a semiarid grassland. Soil Biol. Biochem. 116, 388-398 (2018).
- W. Chen, Y. Zhang, X. Mai, Y. Shen, Multiple mechanisms contributed to the reduced stability of Inner Mongolia grassland ecosystem following nitrogen enrichment. *Plant Soil* **409**, 283–296 (2016).
- Z. Chen *et al.*, Grassland productivity and diversity changes in responses to N and P addition depend primarily on tall clonal and annual species in semiarid Loess Plateau. *Ecol. Eng.* 145, 105727 (2020).
- C. Cusell, A. Kooijman, L. P. M. Lamers, Nitrogen or phosphorus limitation in rich fens? Edaphic differences explain contrasting results in vegetation development after fertilization. *Plant Soil* 384, 153–168 (2014).
- T. Dias, S. Malveiro, M. A. Martins-Loução, L. J. Sheppard, C. Cruz, Linking N-driven biodiversity changes with soil N availability in a Mediterranean ecosystem. *Plant Soil* 341, 125–136 (2011).
- T. L. Dickson, B. L. Foster, The relative importance of the species pool, productivity and disturbance in regulating grassland plant species richness: A field experiment. *J. Ecol.* 96, 937–946 (2008).
- T. L. Dickson, K. L. Gross, Plant community responses to long-term fertilization: Changes in functional group abundance drive changes in species richness. *Oecologia* **173**, 1513–1520 (2013).
- T. L. Dickson, G. G. Mittelbach, H. L. Reynolds, K. L. Gross, Height and clonality traits determine plant community responses to fertilization. *Ecology* 95, 2443–2452 (2014).
- 84. E. Du, Integrating species composition and leaf nitrogen content to indicate effects of nitrogen deposition. *Environ. Pollut.* **221**, 392–397 (2017).
- L. Fan, Y. Li, L. Tang, J. Ma, Combined effects of snow depth and nitrogen addition on ephemeral growth at the southern edge of the Gurbantunggut Desert, China. J. Arid Land 5, 500–510 (2013).
- Y. Fang, F. Xun, W. Bai, W. Zhang, L. Li, Long-term nitrogen addition leads to loss of species richness due to litter accumulation and soil acidification in a temperate steppe. *PLoS One* 7, e47369 (2012).
- 87. B. L. Foster, K. L. Gross, Species richness in a successional grassland: Effects of nitrogen enrichment and plant litter. *Ecology* **79**, 2593–2602 (1998).
- E. I. Gasarch, T. R. Seastedt, Plant community response to nitrogen and phosphorus enrichment varies across an alpine tundra moisture gradient. *Plant Ecol. Divers.* 8, 739–749 (2015).
- F. S. Gilliam, A. W. Hockenberry, M. B. Adams, Effects of atmospheric nitrogen deposition on the herbaceous layer of a central Appalachian hardwood forest. *J. Torrey Bot. Soc.* **133**, 240–254 (2006).
- 90. E. S. Gornish, T. E. Miller, Plant community responses to simultaneous changes in temperature, nitrogen availability, and invasion. *PLoS One* **10**, e0123715 (2015).
- L. Gough, P. A. Wookey, G. R. Shaver, Dry heath arctic tundra responses to long-term nutrient and light manipulation. Arct. Antarct. Alp. Res. 34, 211–218 (2002).
- L. Gough, J. B. Grace, Herbivore effects on plant species density at varying productivity levels. Ecology 79, 1586–1594 (1998).
- K. L. Gross, G. G. Mittelbach, H. L. Reynolds, Grassland invasibility and diversity: Responses to nutrients, seed input, and disturbance. *Ecology* 86, 476–486 (2005).
- T. Hao, L. Song, K. Goulding, F. Zhang, X. Liu, Cumulative and partially recoverable impacts of nitrogen addition on a temperate steppe. *Ecol. Appl.* 28, 237–248 (2018).
- W. S. Harpole, D. L. Potts, K. N. Suding, Ecosystem responses to water and nitrogen amendment in a California grassland. *Glob. Change Biol.* 13, 2341–2348 (2007).
- S. E. Hartley, T. H. Jones, Plant diversity and insect herbivores: Effects of environmental change in contrasting model systems. *Oikos* 101, 6–17 (2003).
- E. Harvey, A. S. MacDougall, Noninteracting impacts of fertilization and habitat area on plant diversity via contrasting assembly mechanisms. *Divers. Distrib.* 24, 509–520 (2018).
- F. He, Z. Tong, L. Wang, G. Zheng, X. Li, Effect of fertilizer additions on plant communities and soil properties in a temperate grassland steppe. *Pol. J. Environ. Stud.* 27, 1533–1540 (2018).
- M. Hejcman, M. Češková, J. Schellberg, S. Pätzold, The Rengen Grassland Experiment: Effect of soil chemical properties on biomass production, plant species composition and species richness. *Folia Geobot.* 45, 125–142 (2010).
- M. Hejcman, M. Klaudisová, J. Schellberg, D. Honsová, The Rengen Grassland Experiment: Plant species composition after 64 y of fertilizer application. *Agric. Ecosyst. Environ.* **122**, 259–266 (2007).
- S. S. Hoeppner, J. S. Dukes, Interactive responses of old-field plant growth and composition to warming and precipitation. *Glob. Change Biol.* 18, 1754–1768 (2012).
- M. Hu et al., Fire rather than nitrogen addition affects understory plant communities in the short term in a coniferous-broadleaf mixed forest. Ecol. Evol. 8, 8135–8148 (2018).

- R. Huber, Changes in plant species richness in a calcareous grassland following changes in environmental conditions. *Folia Geobot.* 29, 469–482 (1994).
- J. Kidd, P. Manning, J. Simkin, S. Peacock, E. Stockdale, Impacts of 120 years of fertilizer addition on a temperate grassland ecosystem. *PLoS One* 12, e0174632 (2017).
- F. W. Kirkham, J. O. Mountford, R. J. Wilkins, The effects of nitrogen, potassium and phosphorus addition on the vegetation of a Somerset peat moor under cutting management. J. Appl. Ecol. 33, 1013–1029 (1996).
- 106. J.-H. Kwak, S. X. Chang, M. A. Naeth, Eleven years of simulated deposition of nitrogen but not sulfur changed species composition and diversity in the herb stratum in a boreal forest in western Canada. *For. Ecol. Manage.* **412**, 1–8 (2018).
- L. Gough, J. B. Grace, The influence of vines on an oligohaline marsh community: Results of a removal and fertilization study. *Oecologia* **112**, 403-411 (1997).
- L. M. Ladwig *et al.*, Above- and belowground responses to nitrogen addition in a Chihuahuan Desert grassland. *Oecologia* 169, 177–185 (2012).
- M. Lai, S. He, S. Yu, G. Jin, Effects of experimental N addition on plant diversity in an old-growth temperate forest. *Ecol. Evol.* 8, 5900–5911 (2018).
- Z. Lan, Y. Bai, Testing mechanisms of N-enrichment-induced species loss in a semiarid Inner Mongolia grassland: Critical thresholds and implications for long-term ecosystem responses. *Philos. Trans. R. Soc. Lond. B Biol. Sci.* 367, 3125–3134 (2012).
- Z. Lan et al., Testing the scaling effects and mechanisms of N-induced biodiversity loss: Evidence from a decade-long grassland experiment. J. Ecol. 103, 750-760 (2015).
- 112. J. Lepš, Nutrient status, disturbance and competition: An experimental test of relationships in a wet meadow. J. Veg. Sci. **10**, 219–230 (1999).
- J. Li et al., Grazing and fertilization influence plant species richness via direct and indirect pathways in an alpine meadow of the eastern Tibetan Plateau. Grass Forage Sci. 72, 343–354 (2017).
- 114. K. Li *et al.*, Response of alpine grassland to elevated nitrogen deposition and water supply in China. *Oecologia* **177**, 65–72 (2015).
- 115. W. Li et al., Plant functional diversity can be independent of species diversity: Observations based on the impact of 4-yrs of nitrogen and phosphorus additions in an alpine meadow. PLoS One 10, e0136040 (2015).
- W. Li, S. Wen, W. Hu, G. Du, Root-shoot competition interactions cause diversity loss after fertilization: A field experiment in an alpine meadow on the Tibetan Plateau. J. Plant Ecol. 4, 138–146 (2011).
- W. Li *et al.*, Community-level trait responses and intraspecific trait variability play important roles in driving community productivity in an alpine meadow on the Tibetan Plateau. J. Plant Ecol. 10, 592–600 (2017).
- J. Liira et al., Grassland diversity under changing productivity and the underlying mechanisms -Results of a 10-y experiment. J. Veg. Sci. 23, 919–930 (2012).
- 119. B. Lisa, G. Renato, Recovery of subalpine dwarf shrub heath after neighbor removal and fertilization. *Plant Ecol.* **183**, 227-235 (2006).
- J. Liu et al., Biodiversity explains maximum variation in productivity under experimental warming, nitrogen addition, and grazing in mountain grasslands. *Ecol. Evol.* 8, 10094–10112 (2018).
- 121. Y. Liu *et al.*, Direct and indirect influences of 8 yr of nitrogen and phosphorus fertilization on Glomeromycota in an alpine meadow ecosystem. *New Phytol.* **194**, 523-535 (2012).
- F. Louault et al., Complex plant community responses to modifications of disturbance and nutrient availability in productive permanent grasslands. J. Veg. Sci. 28, 538–549 (2017).
- X. Lu, J. Mo, F. S. Gilliam, G. Zhou, Y. Fang, Effects of experimental nitrogen additions on plant diversity in an old-growth tropical forest. *Glob. Change Biol.* 16, 2688–2700 (2010).
- X. Lu et al., Effects of experimental nitrogen additions on plant diversity in tropical forests of contrasting disturbance regimes in southern China. Environ. Pollut. 159, 2228–2235 (2011).
- R. Luo et al., Nitrogen and phosphorus enrichment accelerates soil organic carbon loss in alpine grassland on the Qinghai-Tibetan Plateau. Sci. Total Environ. 650, 303–312 (2019).
- N. J. Madan, L. J. Deacon, C. H. Robinson, Greater nitrogen and/or phosphorus availability increase plant species' cover and diversity at a High Arctic polar semidesert. *Polar Biol.* 30, 559–570 (2006).
- T. J. Massad et al., Interactions between repeated fire, nutrients, and insect herbivores affect the recovery of diversity in the southern Amazon. Oecologia 172, 219–229 (2013).
- T. J. Massad *et al.*, Early recruitment responses to interactions between frequent fires, nutrients, and herbivory in the southern Amazon. *Oecologia* **178**, 807–817 (2015).
- J. O. Mountford, K. H. Lakhani, F. W. Kirkham, Experimental assessment of the effects of nitrogen addition under hay-cutting and aftermath grazing on the vegetation of meadows on a Somerset peat moor. J. Appl. Ecol. 30, 321–332 (1993).
- C. Neill *et al.*, Influence of soil properties on coastal sandplain grassland establishment on former agricultural fields. *Restor. Ecol.* 23, 531–538 (2015).
- 131. M.-C. Nilsson, D. A. Wardle, O. Zackrisson, A. Jäderlund, Effects of alleviation of ecological stresses on an alpine tundra community over an eight-year period. *Oikos* **97**, 3–17 (2002).
- A. Nishimura, S. Tsuyuzaki, Plant responses to nitrogen fertilization differ between postmined and original peatlands. *Folia Geobot.* 50, 107-121 (2015).
- 133. D. Niu *et al.*, The impact of nitrogen enrichment on grassland ecosystem stability depends on nitrogen addition level. *Sci. Total Environ.* **618**, 1529–1538 (2018).
- K. Niu et al., Fertilization decreases species diversity but increases functional diversity: A three year experiment in a Tibetan alpine meadow. Agric. Ecosyst. Environ. 182, 106–112 (2014).
- J. Olofsson, H. Shams, Determinants of plant species richness in an alpine meadow. J. Ecol. 95, 916–925 (2007).
- R. Ostertag, J. H. Verville, Fertilization with nitrogen and phosphorus increases abundance of nonnative species in Hawaiian montane forests. *Plant Ecol.* 162, 77-90 (2002).
- J. J. Pan, B. Widner, D. Ammerman, R. E. Drenovsky, Plant community and tissue chemistry responses to fertilizer and litter nutrient manipulations in a temperate grassland. *Plant Ecol.* 206, 139–150 (2010).
- 138. D. Pauli, M. Peintinger, B. Schmid, Nutrient enrichment in calcareous fens: Effects on plant species and community structure. *Basic Appl. Ecol.* **3**, 255–266 (2002).
- M. Pierik, J. van Ruijven, T. M. Bezemer, R. H. E. M. Geerts, F. Berendse, Recovery of plant species richness during long-term fertilization of a species-rich grassland. *Ecology* 92, 1393–1398 (2011).
- J. N. Price, J. W. Morgan, Vegetation dynamics following resource manipulations in herb-rich woodland. *Plant Ecol.* 188, 29–37 (2007).

- 141. Q. Quan, H. Nianpeng, Z. Zhen, Z. Yunhai, G. Yang, Nitrogen enrichment and grazing accelerate vegetation restoration in degraded grassland patches. *Ecol. Eng.* **75**, 172–177 (2015).
- H. L. Reynolds, G. G. Mittelbach, T. L. Darcy-Hall, G. R. Houseman, K. L. Gross, No effect of varying soil resource heterogeneity on plant species richness in a low fertility grassland. *J. Ecol.* 95, 723–733 (2007).
- T. R. Seastedt, L. Vaccaro, Plant species richness, productivity, and nitrogen and phosphorus limitations across a snowpack gradient in alpine tundra, Colorado, U.S.A. Arct. Antarct. Alp. Res. 33, 100–106 (2001).
- J. Serafini, P. Grogan, L. Aarssen, Summer precipitation limits plant species richness but not overall productivity in a temperate mesic old field meadow. J. Veg. Sci. 30, 832–844 (2019).
- M. H. Song *et al.*, Grazing offsets nitrogen enrichment effects on species richness by promoting the random colonization of local species in an alpine grassland. *Ecosystems (N. Y.)* 23, 278–291 (2020).
- M.-H. Song, F.-H. Yu, Reduced compensatory effects explain the nitrogen-mediated reduction in stability of an alpine meadow on the Tibetan Plateau. *New Phytol.* 207, 70–77 (2015).
- M. P. Srinivasan, S. K. Gleeson, M. A. Arthur, Short-term impacts of nitrogen fertilization on a montane grassland ecosystem in a South Asian biodiversity hotspot. *Plant Ecol. Divers.* 5, 289–299 (2012).
- M. Sternberg, V. K. Brown, G. J. Masters, I. P. Clarke, Plant community dynamics in a calcareous grassland under climate change manipulations. *Plant Ecol.* 143, 29–37 (1999).
- 149. F. Su et al., Sensitivity of plant species to warming and altered precipitation dominates the community productivity in a semiarid grassland on the Loess Plateau. Ecol. Evol. 9, 7628-7638 (2019).
- J. Su, X. Li, X. Li, L. Feng, Effects of additional N on herbaceous species of desertified steppe in arid regions of China: A four-year field study. *Ecol. Res.* 28, 21–28 (2013).
- X. Sun, K. Yu, H. H. Shugart, G. Wang, Species richness loss after nutrient addition as affected by N:C ratios and phytohormone GA3 contents in an alpine meadow community. J. Plant Ecol. 9, 201–211 (2016).
- M. K. Sundqvist, Z. Liu, R. Giesler, D. A. Wardle, Plant and microbial responses to nitrogen and phosphorus addition across an elevational gradient in subarctic tundra. *Ecology* 95, 1819–1835 (2014).
- K. B. Suttle, M. A. Thomsen, M. E. Power, Species interactions reverse grassland responses to changing climate. *Science* **315**, 640–642 (2007).
- 154. Q. Tian *et al.*, A novel soil manganese mechanism drives plant species loss with increased nitrogen deposition in a temperate steppe. *Ecology* **97**, 65–74 (2016).
- 155. K. Tielbörger *et al.*, Middle-Eastern plant communities tolerate 9 years of drought in a multi-site climate manipulation experiment. *Nat. Commun.* **5**, 5102 (2014).
- D. Tilman, Species richness of experimental productivity gradients: How important is colonization limitation? *Ecology* 74, 2179-2191 (1993).
- P. M. Tognetti, E. J. Chaneton, Community disassembly and invasion of remnant native grasslands under fluctuating resource supply. J. Appl. Ecol. 52, 119–128 (2015).
- J. M. Valliere, I. C. Irvine, L. Santiago, E. B. Allen, High N, dry: Experimental nitrogen deposition exacerbates native shrub loss and nonnative plant invasion during extreme drought. *Glob. Change Biol.* 23, 4333–4345 (2017).
- P. Verma, R. Sagar, H. Verma, P. Verma, D. K. Singh, Changes in species composition, diversity and biomass of herbaceous plant traits due to N amendment in a dry tropical environment of India. J. Plant Ecol. 8, 321–332 (2015).
- P. Verma, P. Verma, R. Sagar, Variations in N mineralization and herbaceous species diversity due to sites, seasons, and N treatments in a seasonally dry tropical environment of India. *For. Ecol. Manage.* 297, 15–26 (2013).
- 161. G. L. Vourlitis, Chronic N enrichment and drought alter plant cover and community composition in a Mediterranean-type semi-arid shrubland. *Oecologia* **184**, 267-277 (2017).
- G. L. Vourlitis, S. C. Pasquini, Experimental dry-season N deposition alters species composition in southern Californian mediterranean-type shrublands. *Ecology* 90, 2183–2189 (2009).
- C. A. Walter, M. B. Adams, F. S. Gilliam, W. T. Peterjohn, Non-random species loss in a forest herbaceous layer following nitrogen addition. *Ecology* 98, 2322–2332 (2017).
- D. A. Wardle, M. J. Gundale, A. Jäderlund, M.-C. Nilsson, Decoupled long-term effects of nutrient enrichment on aboveground and belowground properties in subalpine tundra. *Ecology* 94, 904–919 (2013).
- D. A. Wedin, D. Tilman, Influence of nitrogen loading and species composition on the carbon balance of grasslands. *Science* 274, 1720–1723 (1996).
- J. H. Willems, R. K. Peet, L. Bik, Changes in chalk-grassland structure and species richness resulting from selective nutrient additions. J. Veg. Sci. 4, 203–212 (1993).
- S. D. Wilson, D. Tilman, Interactive effects of fertilization and disturbance on community structure and resource availability in an old-field plant community. *Oecologia* 88, 61–71 (1991).
- S. D. Wilson, D. Tilman, Component of plant competition along an experimental gradient of nitrogen availability. *Ecology* 72, 1050–1065 (1991).
- S. D. Wilson, D. Tilman, Quadratic variation in old-field species richness along gradients of disturbance and nitrogen. *Ecology* 83, 492–504 (2002).
- A. Xing *et al.*, Long term effect of nitrogen addition on understory community in a Chinese boreal forest. *Sci. Total Environ.* **646**, 989–995 (2019).
- D. Xu et al., Influences of nitrogen, phosphorus and silicon addition on plant productivity and species richness in an alpine meadow. AoB Plants 7, plv125 (2015).
- F.-W. Xu *et al.*, Resource enrichment combined with biomass removal maintains plant diversity and community stability in a long-term grazed grassland. *J. Plant Ecol.* **13**, 611–620 (2020).
- X. Xu *et al.*, Response of aboveground biomass and diversity to nitrogen addition along a degradation gradient in the Inner Mongolian steppe, China. *Sci. Rep.* 5, 10284 (2015).
- Z. W. Xu, S. Q. Wan, H. Y. Ren, X. G. Han, Y. Jiang, Influences of land use history and short-term nitrogen addition on community structure in temperate grasslands. J. Arid Environ. 87, 103–109 (2012).
- Z. Xu et al., Effects of water and nitrogen addition on species turnover in temperate grasslands in northern China. PLoS One 7, e39762 (2012).
- G.-J. Yang et al., Mowing mitigates the negative impacts of N addition on plant species diversity. Oecologia 189, 769–779 (2019).
- 177. H. Yang et al., Diversity-dependent stability under mowing and nutrient addition: Evidence from a 7-year grassland experiment. Ecol. Lett. **15**, 619–626 (2012).

- H. Yang *et al.*, Plant community responses to nitrogen addition and increased precipitation: The importance of water availability and species traits. *Glob. Change Biol.* **17**, 2936–2944 (2011).
- H. Yang et al., Community structure and composition in response to climate change in a temperate steppe. Glob. Change Biol. 17, 452–465 (2011).
- X. Yang *et al.*, Nitrogen fertilization, not water addition, alters plant phylogenetic community structure in a semiarid steppe. J. Ecol. **106**, 991–1000 (2018).
- H.-W. Yu, W.-M. He, Increased rainfall and nitrogen alter colonization and extinction during postgrazing steppe succession. J. Veg. Sci. 30, 75–85 (2019).
- L. Yu et al., Responses of plant diversity and primary productivity to nutrient addition in a *Stipa baicalensis* grassland, China. J. Integr. Agric. **14**, 2099–2108 (2015).
 E. S. Zavaleta et al., Grassland responses to three years of elevated temperature, CO₂,
- L. S. Zavarete *et al.*, Orasiana responses to three years or elevated temperature, CO₂, precipitation, and N deposition. *Ecol. Monogr.* **73**, S85–604 (2003).
 D.-H. Zeng *et al.*, Effects of nitrogen addition on vegetation and ecosystem carbon in a semiarid
- grassland. *Biogeochemistry* 98, 185–193 (2010).
 T. Zhang, R. Guo, S. Gao, J. Guo, W. Sun, Responses of plant community composition and
- I. Zhang, K. Guo, S. Gao, J. Guo, W. Sun, Responses of plant community composition and biomass production to warming and nitrogen deposition in a temperate meadow ecosystem. *PLoS One* **10**, e0123160 (2015).
- X. Zhang, W. Liu, Y. Bai, G. Zhang, X. Han, Nitrogen deposition mediates the effects and importance of chance in changing biodiversity. *Mol. Ecol.* 20, 429–438 (2011).
- Y. Zhang et al., Nitrogen addition does not reduce the role of spatial asynchrony in stabilising grassland communities. Ecol. Lett. 22, 563–571 (2019).

- X. Zhao *et al.*, The effects of nutrient addition on plant species diversity in desert grassland, Xinjiang, northwest China. *Quat. Int.* **298**, 152–160 (2013).
- Y. Zhao et al., Community composition, structure and productivity in response to nitrogen and phosphorus additions in a temperate meadow. Sci. Total Environ. 654, 863–871 (2019).
- Ž. Zheng, W. Bai, W.-H. Zhang, Root trait-mediated belowground competition and community composition of a temperate steppe under nitrogen enrichment. *Plant Soil* **437**, 341–354 (2019).
- 191. M. Zhong *et al.*, Asymmetric responses of plant community structure and composition to precipitation variabilities in a semi-arid steppe. *Oecologia* **191**, 697–708 (2019).
- X. Zhou, M. A. Bowker, Y. Tao, L. Wu, Y. Zhang, Chronic nitrogen addition induces a cascade of plant community responses with both seasonal and progressive dynamics. *Sci. Total Environ.* 626, 99–108 (2018).
- X. Zhou *et al.*, The effects of fertilization on the trait-abundance relationships in a Tibetan alpine meadow community. J. Plant Ecol. 9, 144–152 (2016).
- J. Zhu, Y. Zhang, X. Yang, N. Chen, L. Jiang, Synergistic effects of nitrogen and CO₂ enrichment on alpine grassland biomass and community structure. *New Phytol.* 228, 1283–1294 (2020).
- N. Zong, P. Shi, Enhanced community production rather than structure improvement under nitrogen and phosphorus addition in severely degraded alpine meadows. *Sustainability* 11, 2023 (2019).
- N. Zong et al., Nitrogen critical loads for an alpine meadow ecosystem on the Tibetan Plateau. Environ. Manage. 57, 531–542 (2016).