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1 2	Title: Addition of multiple limiting resources reduces grassland diversity
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60 Summary:

- Niche dimensionality provides a general theoretical explanation for biodiversity: 61
- 62 more niches, defined by more limiting factors, allow for more ways species can
- 63 coexist¹. Because plant species compete for the same set of limiting resources, theory
- 64 predicts that addition of a limiting resource eliminates potential trade-offs, reducing
- the number of species that can coexist². Multiple nutrient limitation of plant 65
- production is common and therefore fertilization may reduce diversity by reducing 66
- the number or dimensionality of belowground limiting factors. At the same time 67
- 68 nutrient addition, by increasing biomass, should ultimately shift competition from
- 69 belowground nutrients towards a one-dimensional competitive tradeoff for light³.
- 70 Here we show that plant species diversity decreased when a greater number of
- 71 limiting nutrients were added across 45 grassland sites from a multi-continent
- experimental network⁴. The number of added nutrients predicted diversity loss, 72
- 73 even after controlling for effects of plant biomass, and even where biomass
- 74 production was not nutrient-limited. We found that elevated resource supply
- 75 reduced niche dimensionality and diversity and increased both productivity⁵ and
- 76 compositional turnover. Our results point to the importance of understanding
- 77 dimensionality in ecological systems that are undergoing diversity loss in response to
- 78 multiple global change factors. 79

80 Text:

- 81 The search for the mechanisms underlying the coexistence of multiple species was inspired by
- 82 Darwin's observations of the problem of the "entangled bank", or how different checks on the
- 83 growth of individuals underlie the number of species found together⁶. One of the most general
- theoretical explanations for this problem is that greater dimensionality, or number of non-84
- overlapping ecological niches, allows for the coexistence of a greater number of species^{1,7}. 85
- However, plant coexistence challenges this understanding: rather than occupying unique 86
- resource niches, plants share and are limited by the same essential resources⁸. The coexistence of 87
- 88 plants competing for the same resources therefore requires stoichiometric and physiological
- 89 tradeoff differences for shared limiting resources². Furthermore, plant resources are spatially
- 90 separated, with elemental nutrients (e.g., nitrogen, phosphorus, potassium) and water acquired
- 91 belowground and light aboveground. This suggests that two, non-independent resource-based
- 92 mechanisms could maintain plant diversity: multi-dimensional tradeoffs for belowground
- 93 limiting nutrients, juxtaposed with a one-dimensional tradeoff for light aboveground.
- 94

95 Resource competition theory predicts that addition of a limiting resource makes that resource

- 96 non-limiting, thereby eliminating a competitive tradeoff contributing to coexistence². Because
- some factor must ultimately limit growth, resource additions will lead to a reduction in the 97
- number and a shift in the identity of growth-limiting factors. In the case of plants, addition of 98
- 99 multiple nutrients should reduce the dimensionality of belowground resource tradeoffs, increase
- biomass production, and ultimately shift the prevailing form of resource competition towards a 100
- single, aboveground limiting resource, light^{3,5}. Support for this hypothesis has been demonstrated 101
- 102 in four grassland experiments. All found plant biomass production was limited by multiple resources, and diversity decreased as a function of the number of belowground resources made
- 103
- non-limiting^{5,9-11}. These results are consistent with the hypothesis that multi-dimensional 104 105 tradeoffs for belowground resources, and light competition mediated by aboveground biomass

- 106 production, might jointly contribute to maintaining plant diversity in natural communities. While
- 107 multiple limitation of primary producer communities is common¹², a recent global study
- 108 demonstrated substantial site-level variation in the number and identity of co-limiting resources,
- 109 with ca. 25% of sites showing no evidence that biomass production was nutrient limited¹³. The
- 110 question remains whether the dimensionality of nutrient resources might contribute to plant
- diversity independently of the presumed importance of indirect effects of biomass on diversity.
- 112
- 113 Here we tested for loss of species diversity in response to multiple nutrient additions⁵ using the
- 114 Nutrient Network, a globally-distributed, nutrient addition experiment, replicated across
- 115 grassland sites on six continents (NutNet; <u>www.nutnet.org</u>)⁴. We added factorial combinations of
- 116 phosphorus (P), nitrogen (N), and potassium ($K_{+\mu}$; the K addition treatment included sulphur and 117 a one-time addition of micronutrients; see Methods), with the aim of removing potential
- 118 limitations from different combinations of the essential nutrient elements that most strongly
- affect plant growth in natural and managed systems worldwide¹³. Our treatments varied in the
- 120 number of elemental resources they contained; hereafter, we use the term "number of added
- resources" (1, 2, or 3) to represent the *minimum* number of potentially limiting elemental
- 122 nutrients added (see Methods).
- 123
- 124 If competition for multiple belowground resources contributes to species coexistence, then
- 125 diversity should decrease as a function of the number of resources added. Species diversity
- 126 decreased as more resources were added, and this effect increased with duration of treatment
- 127 (Fig. 1a; Extended Data Table 1). Greater number of added resources increased the annual rate of
- diversity loss, even after controlling for differences in experiment duration (Fig. 1b). We found a
- similar proportional loss of diversity with a greater number of added resources (using the log-
- ratio effect size of treatment divided by control diversity; Fig. 1b), meaning that in terms of the
- 131 number of potential species lost, relative diversity losses and annual rate of diversity loss were 132 similar. Sites differed in the size of their species pools, which ranged from 13 to 103 observed
- similar. Sites differed in the size of their species pools, which ranged from 13 to 103 observed species over a 3-year period, and we found that the magnitude of diversity loss rate per added
- resource increased with local species pool size (Fig. 1c).
- resource increased with local species p
- 135
- 136 We found that increasing the number of added resources increased live biomass (Fig. 2a), and
- 137 decreased the proportion of photosynthetically active radiation (PAR) transmitted through the
- 138 canopy to the ground surface (Fig. 2b). Further, the amount of litter biomass, which can also
- 139 contribute to light limitation and diversity $loss^{14}$ increased with the number of added resources
- 140 (Fig. 2c). Importantly, despite the complex causal effects of changes in multiple resources on the
- relationship between diversity and biomass, the number of added resources remained a
- significant predictor of diversity loss, even after controlling for the potential contributing effects
- 143 of species pool size, live biomass, total cover (a proxy for total plant abundance), light
- transmittance, and litter mass (Extended Data Tables 2, 3). If species coexist though tradeoffs in
- 145 resource-ratio requirements, changes in belowground resource supply could cause changes in
- 146 competitive dominance and lead to species exclusion², independent of aboveground effects of
- biomass. In a subset of sites that did not show a biomass response to multiple nutrient addition,
- 148 we nevertheless observed declines in diversity consistent with this theory (Fig. 3 a, b: open
- points, n=11), similar to sites where biomass production was multiple-resource limited (Fig. 3 a, 150
- b: filled points, n=34). Overall, 14 sites of 45 sites in this study showed some type of negative
- 151 biomass response to N, P or $K_{+\mu}$ addition suggesting the potential for elevated nutrient

152 concentrations supply to cause negative physiological responses in species not adapted to high nutrient concentrations¹⁵ or to large stoichiometric imbalances in resource supply¹⁶. 153

154

155 Diversity loss increased only weakly with biomass increase in plots receiving all three resources,

156 providing some support for indirect effects of biomass as a contributing, but not a sole,

157 mechanism of diversity loss due to fertilisation (Fig. 3c). If species losses were most strongly

158 associated with biomass increases, we would expect the greatest effects on both responses to be

159 associated with the same nutrient addition treatment, but this was true for only 22 of 45 cases

(Chi-square, p<0.0001). The loss of diversity was not driven by the addition of any single added 160 161 resource (e.g., N); greatest diversity loss occurred with the addition of a combination of two or

162 more resources in 31 of 45 cases. These findings further highlight that biomass production and

- 163 diversity can be controlled differently by multiple resources. Overall, these results support our
- 164 conclusion that resource niche dimensionality can contribute to species diversity independently
- 165 of indirect effects mediated by biomass production.
- 166

167 For resource dimensionality to contribute to species coexistence, species must trade off their

competitive abilities for different limiting resources, and changes in resource supply ratios 168

169 should drive species compositional turnover². We found that a greater number of added resources 170 increased the compositional divergence from control plots (Fig. 4a). Plots receiving a single

- resource treatment (N, P and K_{+u} treatments) diverged as much from each other as they did on 171
- 172 average from the control plots (Fig. 4b), consistent with different species trading off competitive
- 173 abilities for different resources². We found that greater diversity loss was weakly associated with

174 greater community dissimilarity when all three resources were added together (Fig. 4c),

175 suggesting that resource addition caused changes in community composition that were not

176 always associated with diversity loss. Both composition and diversity of communities contribute

177 to ecosystem functioning, and many of the proposed mechanisms of the effect of species diversity on ecosystem function are resource-based¹⁷. Additionally, nutrient enrichment impacts

178 179 some groups of species more than others (e.g., a loss of natives in favor of exotic grasses¹⁸).

180

Because changes in resource supply led to communities of fewer species and of different 181 compositions, we expect changes in resources, acting through diversity loss, to have both direct

and indirect effects on ecosystem functions¹⁹. 182

183

184 While our results are consistent with predictions of the resource niche dimension hypothesis,

185 they are also likely conservative. Our experimental design, a factorial manipulation of three

186 resource treatments, represents a lower-bound estimate of the dimensionality of nutrient

187 resources because our K_{+u} treatment included sulphur and up to 10 other macro- and micro-

188

nutrients, of which more than one may have been limiting¹³. Multiple chemical forms of a limiting nutrient can also contribute to species diversity²⁰, further expanding potential resource 189

190 dimensionality. Stronger tests of the role of multiple resource competition for structuring species

191 coexistence require physiological studies quantifying species-specific functional traits and

192 tradeoffs²¹, and testing whether species respond to resource treatments similarly in different

193 environments. Deeper mechanistic insight can also be gained by asking how resource-dependent

194 diversity patterns and mechanisms change across scales (e.g., from local to regional) in response

to global change drivers such as nutrient pollution²². Our results point to, but do not distinguish 195

among, the presumed resource competition mechanisms² that underlie the resource dimension 196

197 hypothesis. 198

- 199 We found that greater diversity loss was associated with sites with soil P, K, pH and % sand, but
- not with soil N, or with latitude, or mean annual precipitation (Extended Data Table 4),
- suggesting that variation in soil properties may influence the degree to which communities respond to changes in resource availability²³. We did not test or control for other potential
- 203 limiting factors such as herbivory or water, which can interact with nutrients in complex ways,
- and themselves contribute to species coexistence. For example, changes in nutrient availability
- 205 affect photosynthetic tissue quantity and quality, and may alter the pattern and intensity of
- 206 herbivory²⁴, and the level of soil water depletion through transpiration losses. Our multi-year
- 207 experimental results may still under-estimate nutrient effects when considering that global
- 208 eutrophication represents a chronic and cumulative environmental change over many decades.
- 209 Estimating effective upper bounds on ecologically relevant resource dimensionality will depend
- 210 on the degree to which multiple limiting factors covary, how they change in time and space, and 211 how multiple limiting factors interact with each other in promoting coexistence. Global change is
- how multiple limiting factors interact with each other in promoting coexistence. Global change is
 driving environmental conditions beyond multiple planetary boundaries²⁵, and changing the
- 212 limiting factors that structure species diversity²⁶. Understanding the mechanisms that underlie
- diversity loss caused by multiple global change factors is necessary to develop effective
- 215 management strategies for restoring and preserving Earth's biodiversity.

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273 **Supplementary Information** is linked to the online version of the paper at

- 274 <u>www.nature.com/nature</u>.
- 275

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289 Author Contributions:

- 290 WSH analysed the data and wrote the paper with contributions and input from all authors. LS,
- EML and JF contributed to data analysis. WSH, EWS and ETB developed and framed the
- 292 research questions. WSH, EWS, ETB and EML are Nutrient Network coordinators. All authors
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- 296
- The authors have not competing financial interests.
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301 Figure Legends:

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Figure 1. Biodiversity and number of resources.

305 **a**, Loss of species diversity with greater number of added resources (effective number of equally 306 abundant species: ESN_{PIE}); this effect increased with years of treatment 1-8 (Extended Data 307 Table 1); year 0 shows pre-treatment diversity. Bold lines show overall mean responses; y-axis is log-transformed. b, Greater number of added resources increased the mean rates of diversity loss 308 309 per year (filled points; $F_{1,134}=24.8$, P<0.0001), and the proportional loss of species relative to the 310 controls, shown as the effect size (open points; $F_{1,134}$ =46.2, P<0.0001). c, Rate of diversity loss 311 per added resource (nres) was associated with greater total site species number (log), $R^2=0.25$, 312 P=0.0004, n=45). (mean ± 95% c.i.).

313 314

315 Figure 2. Biomass and light.

a, The rate of live biomass change per year increased with an increasing number of added resources($F_{1,1031}$ =55.0, P<0.0001). **b,** The proportion of photosynthetically active radiation (PAR) reaching the ground surface decreased with a greater number of added resources, expressed as annual rate of change ($F_{1,782}$ =62.4, P<0.0001). **c,** The mean rate of litter (dead biomass) change per year increased with the number of added resources ($F_{1,783}$ =4.37, P0.037).

321 (mean \pm 95% c.i.).

322

323

324 Figure 3. Multiple resource limitation.

a, Increased number of added resources resulted in positive and increasing biomass at sites
 showing multiple resource limitation (filled points); sites not limited by multiple resources

- 327 tended to show negative biomass responses with resource addition (open points). **b**, Increased
- number of added resources drove similar diversity loss at sites where biomass production was
- 329 limited by multiple resources (filled points) and at sites where it was not (open points). **c**,
- 330 Negative relationship between the effect of addition of three resources on biomass and diversity
- 331 (1-tail test for negative relationship, $R^2=0.11$, P=0.012, n=45). (mean \pm s.e.)
- 332
- 333

Figure 4. Community composition.

a, Community composition diverged from control plots with greater number of added resources (Bray-Curtis dissimilarity index). Resource addition caused greater dissimilarity of community composition relative to mean pre-treatment dissimilarity, indicated by grey stars. **b,** Addition of single nutrient additions of N, P or $K_{+\mu}$ resulted in communities that diverged as much from each other as they did on average from the control plots. Pre-treatment values indicated by grey stars. **c,** Negative relationship between the effect of addition of three resources on community dissimilarity relative to controls and diversity (1-tail test for negative relationship, R²=0.10,

342 P=0.019, n=45). (mean \pm 95% c.i.).

343

344 Methods:

345

Experiment Design: The Nutrient Network (NutNet) is a collaborative, distributed experimental 346 347 network⁴. Sites are located across herbaceous terrestrial systems on six continents. Vegetation types represented include grasslands, savannas and meadows and occur across a wide range of 348 349 climate and environmental factors (Table S1). At the 45 sites (on five continents) with 350 appropriate experimental data for these analyses, one year of pre-treatment (year 0) data were 351 collected followed by at least 3 years and up to 8 years of treatment data. Individual site 352 experiments share identical design and sampling protocols, with minor site-specific differences 353 in terms of replication and treatment duration (Table S1). We applied factorial combinations of nitrogen (N), phosphorus (P), and potassium plus micronutrients, designated here as the " $K_{+\mu}$ " 354 355 treatment, giving eight treatment combinations including the control with no added resources. N was applied annually at 10 g N m⁻² yr⁻¹ as time-release urea. Ammonium nitrate was used in 356 357 2007 at some sites before switching to urea due to restricted availability of ammonium nitrate; 358 we found no differences in the short-term effects of alternative N sources in a separate experiment at four sites¹⁸. P was applied at 10 g P m⁻² yr⁻¹ as triple-super phosphate, which also 359 included Ca at 8.1 g Ca m⁻² yr⁻¹. The $K_{+\mu}$ treatment added a mix of K and S (10 g K m⁻² yr⁻¹ and 360 361 3.9 g S m⁻² yr⁻¹ as potassium sulphate) and micronutrients (100 g m⁻² yr⁻¹ of a mixture composed 362 of 6% Ca, 3% Mg, 12% S, 0.1% B, 1% Cu, 17% Fe, 2.5% Mn, 0.05% Mo, and 1% Zn). 363 Micronutrients were only applied during the first treatment year to minimise potential for toxic 364 metal accumulation. Plots were 5 m x 5 m and randomised within 1 to 6 blocks (Table S1), with 365 all eight treatment combinations occurring once per block. Sampling occurred at approximately 366 peak biomass times for each site.

367

368 **Response Measurements:**

Biodiversity estimates are scale-dependent²⁷, and increased resource availability can alter 369 diversity-scaling relationships by changing the size of species pools and thus introduce 370 371 differences in the coverage of sampling between treatments, due to larger and fewer individuals per area sampled²⁸, and contribute to the loss of rarer species. We calculated species diversity as 372 the effective species number, which estimates the probability of interspecific-encounter if all 373 374 species are equally abundant (ESN_{PIE}). ESN_{PIE} has been shown to be less sensitive to scaling 375 issues than other metrics²², and is representative of the maximum slope of the species-area accumulation function. We used ESN_{PIE} because NutNet sites vary in their species pools and 376 therefore their species accumulation curves will differ, which creates a challenge to compare 377 species diversity when sampled at a fixed area²². ESN_{PIE} has been shown to be relatively 378 insensitive to such sampling area issues because it essentially measures the maximum change in 379 380 species number as a function of sampling area (i.e., the slope at the x-intercept of the species 381 accumulation curve). Because the resource dimension hypothesis and underlying resource ratio 382 theory assume that species trade off for different limiting factors, predictions for diversity change 383 describe changes in competitive dominance; ESN_{PIF} captures these predicted changes in 384 dominance better than simple measurements of local species extinction (i.e. richness loss). We 385 used the aggregate number of species observed at a site as an estimate of the asymptote of the 386 species accumulation function, and of the regional species pool. We also used simply the number 387 of species (i.e., richness) and found similar results as those using ESN_{PIE} (Extended Data Table 388 1).

389

390 We measured species diversity annually by estimating the % cover of each plant species within a

 $1 \text{ m x 1 m fixed location in each plot; the total cover typically summed to greater than 100% due$

to multiple canopy layers. We quantified species diversity as the probability of interspecific

encounter (PIE), or effective species number (ESN_{PIE}), assuming species relative abundances are
 equal:

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396

 $ESN_{PIE} = \frac{1}{\sum_{i}^{s} p_{i}^{2}}$

eq. 1

397

398 where p_i is the proportion of species *i* in a community of size *s*; ESN_{PIE} is derived from the 399 inverse of Simpson's diversity index²².

400

401 We measured aboveground live biomass by clipping two 1 m x 10 cm strip of vegetation in each

402 plot, sorting the sampled tissue to live (current year's production) and dead (previous years'

403 production) fractions, drying at 60 C for 48 hours and weighing. At most sites,

404 photosynthetically active radiation PAR was measured above the plant canopy and at the ground405 surface and the proportion of transmitted light calculated.

406

We categorised plant communities at sites as multiple-resource limited if biomass responded
positively to fertilisation with combinations of different nutrients. Specifically, we designated
sites as "multiple-resource limited" if biomass increased with the independent addition of
different resources or if biomass responded synergistically to two or more added resources (i.e.,
the response to one nutrient was dependent on the level of another and their combined effect was
super-additive)¹¹. Sites that showed no response or negative biomass response or responded

413 positively to only one resource we categorised as not multiple-resource limited. Thirty-four of

the 45 sites showed increased biomass in response to multiple added resources; eight did not

415 respond positively to resource addition, and three responded positively to a single resource (i.e., 416 single resource limited¹¹).

417

418 **Statistical Analysis:** All analyses used R version 3.2.2. We used linear mixed-effects models (R 419 package lme) to test the interaction of number of added resources and the number of treatment

420 years, on diversity (ESN_{PIE}) and richness. Site and block were modeled as nested random effects.

420 years, on diversity (ESN_{PIE}) and fictilitiess. Site and block were modeled as nested random effects 421 We included in the model an autocorrelation structure, a first-order autoregressive model

421 We included in the model an autocorrelation structure, a first-order autoregressive model 422 (AR(1)), where observations are expected to be correlated from one year to the next, and found a

423 substantial improvement in model fit when we compared this model to a model with no

424 autocorrelation structure (lower AIC = Δ 608 and likelihood ratio tests, L.Ratio = 610, p <

425 0.0001)²⁹. Treatment effects increased in magnitude with time (significantly negative interaction

426 between number of added resources and year; SI Table 2). To allow standardised comparison of

427 sites that differed in the year they were established and in duration of nutrient addition, we used

428 two approaches to quantify the changes in species diversity. First, we calculated the annual rate 429 of change of our response variables to standardise site responses. Second, for analyses that

429 of change of our response variables to standardise site responses. Second, for analyses that 430 required an effect size, calculated as the log ratio of the treatment response divided by the

431 control, we used the most recent year of treatment data, which ranged from 3 to 7 years of annual

432 nutrient application duration (SI Table 1). Log ratio effect size estimates would not have been

433 possible using the rate of change estimates, which can take zero or negative values. Log ratio

- 434 effect sizes tend to be normally distributed, centre zero effects (control levels) at zero log ratios,
- and scale responses to make proportional effects directly comparable between sites³⁰. 435
- 436
- 437 We used linear mixed-effects models (R package lme) to test the effects of number of treatment
- 438 years, site richness, log live biomass, log dead biomass, PAR, total species cover, and the
- 439 number of added resources on diversity (ESN_{pie}), with plot nested in block nested in site as
- 440 random effects. Models using dead biomass and PAR used the subset of 30 sites for which we
- 441 had data for these variables. We calculated mean values at each site for the annual rate of 442 diversity loss and diversity effect size, and tested for linear relationships between these variables
- 443 and the number of added resources using regression with site as a block term. We used step-wise
- 444 linear regression and AIC criteria to test for relationships of loss of diversity (from addition of
- 445 three resources) with latitude, longitude, and environmental covariates of mean annual
- 446 precipitation, and soil N, P, K, pH, % clay, and % sand. Plant community composition changes
- 447 were quantified using Bray-Curtis multivariate distances (R package vegan).
- 448 449

450 **Methods' References:**

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461 **Extended Data Table Legends:**

- Extended Data Table 1. The effects of nutrient addition on diversity loss and richness loss 463 464 increase with time. Linear mixed-effects model of the effects of number of treatment years 465 (ARIMA type-1 autocorrelation) and the number of added resources on diversity (log ESN_{nic}) 466 and richness, with plot nested in block, nested in year, nested in site, as random effects, using all 467 45 sites. There was a significant, negative interaction between the number of added resources
- 468 (nres) and year of treatment (year).
- 469

470 Extended Data Table 2. The number of added resources predicts diversity loss after

- 471 controlling for other variables. Linear mixed-effects model of the effects of number of
- 472 treatment years, site richness, log live biomass, total species cover, and the number of added
- 473 resources on diversity (ESN_{pie}), with plot nested in block nested in site as random effects, using 474 all 45 sites and data from the maximum treatment year for each site. Delta AIC between model
- 475 with number of added resources and model without was 33, log-likelihood ratio 35.0, p<0.0001.
- 476

477 Extended Data Table 3. The number of added resources is an important predictor even

- 478 after controlling for other variables, for sites that had light and litter data. Linear mixed-
- 479 effects model of the effects of number of treatment years, site richness, log live biomass, log

- 480 dead biomass, PAR, total species cover, and the number of added resources on diversity
- 481 (ESN_{pie}), with plot nested in block nested in site as random effects, using data from the
- 482 maximum treatment year for each site, and the subset of 32 sites for which there was dead
- biomass and PAR data. Delta AIC between model with number of added resources and model
- 484 without was 15, log-likelihood ratio 15.6, p<0.0001.
- 485

486 Extended Data Table 4. Diversity loss due to addition of nutrients associated with soil

- 487 **properities.** Stepwise multiple regression (backward with AIC criteria for model comparisons)
- 488 retained soil P, K, pH, and % sand as predictors of diversity loss from the addition of three
- 489 resources, for the 30 sites with soil analysis data (excluding one site for extreme value of P). The
- 490 variables latitude, longitude, mean annual precipitation, and soil % N were not retained. Overall 491 model is significant ($r^2 = 0.375$, $F_{4, 25} = 3.75$, p = 0.016).