1 **Plant species diversity mediates ecosystem stability of natural dune grasslands in** 2 **response to drought**

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Abstract

 How plant species diversity can mediate the temporal stability of ecosystem functioning during periods of environmental stress is still a pressing question in ecology, certainly in the context of predicted increasing frequencies and intensities of climate extremes such as drought. The vast majority of empirical research in this context is based on relatively small 22 scaled experiments, where plant species composition is manipulated and ecosystem functions, such as biomass production, are monitored through time. Results of these studies have generally shown that ecosystem functioning is more stable in more species-diverse communities. Yet, there is very little evidence so far that these relations also hold in naturally assembled plant communities. In this study, we combined historical vegetation and climate data with time series of remote sensed indicators of aboveground biomass production (MODIS-NDVI), to quantify how plant species diversity and plant functional diversity correlate with the temporal stability of biomass production in naturally assembled Dutch dune grasslands under influence of fluctuating drought. We found that the negative NDVI response to drought of grasslands with a higher plant species richness and diversity was significantly lower than the response of less species rich and species diverse grasslands, indicating a stabilizing role of plant species richness and diversity on biomass production through time. We found no relation between plant functional diversity and NDVI-response to drought. This is the first study to generalize experimentally established relations between species diversity and stability of ecosystem functioning to naturally assembled grasslands across a large spatial and temporal scale.

 Keywords: Diversity, Stability, Ecosystem functioning, NDVI, remote sensing, Dune grasslands, drought

Introduction

 How and to what extent plant species diversity mediates the stability of ecosystem properties such as biomass production and nutrient cycling, has become one of the most challenging questions in ecology (Hector and Bagchi, 2007; Naeem et al., 2009; Aerts and Honnay, 2011). Although work on the relation between ecosystem stability and species diversity goes back to Elton (1958) and May (1971, 2001), the acknowledgement that the current biodiversity crisis (Hooper et al., 2005; Butchart et al., 2010) may also have consequences for ecosystem functioning, and may affect the services that ecosystems provide to humans (Cardinale et al., 2012), has renewed interest in how plant species richness may buffer ecosystem responses against disturbances (Roscher et al., 2011; Vogel et al., 2012). This issue has become especially relevant in an era where external disturbances such as climatic extremes are expected to become increasingly frequent (Lloret et al., 2012).

 Central to understanding the mediating effect of plant species richness on temporal ecosystem stability is the phenomenon of compensatory dynamics (Yachi and Loreau, 1999; Loreau and de Mazancourt, 2013). Compensatory dynamics occur when a negative change in the level of functioning of one species is associated with a positive change in the functioning of another species, driving the stabilization of ecosystem properties, such as biomass production. Three specific mechanisms have been proposed to explain how biodiversity may stabilise ecosystem properties through time (Loreau and Mazancourt 2013). The first mechanism implies that interspecific differences in coping with external disturbances leads to asynchrony in species responses to environmental change, while the second mechanism addresses the differences in the speed at which species respond to a changing environment. Both can be regarded as temporal complementarity. The third mechanism involves a decrease in the relative importance of interspecific competition, resulting from the complementarity in resource usage between species. This may cause a relative increase in the biomass production of the species

 present (overyielding). A decrease in one species' functioning thus may result in the increased (or compensatory) overyielding of a complementary species, buffering the change in output of the ecosystem during environmental change (Loreau and Mazancourt, 2013). In this context, plant functional diversity, rather than taxonomic diversity, may be the key factor driving ecosystem stabilization. Functional traits, *i.e.* plant properties that impact growth, reproduction and survival, can be expected to mediate the ability of individuals, populations and even of entire ecosystems to cope with environmental disturbances.

 The vast majority of empirical research in the species diversity *versus* ecosystem stability context so far has been based on relatively small scaled *in situ* and *ex situ* experiments, where plant species composition is manipulated and ecosystem functions are monitored over time (Hector et al., 2010; Aerts and Honnay, 2011). Results of these experimental studies have generally shown that the ecosystem functioning is more stable in more diverse communities (Cardinale *et al*. 2012). Yet, there is very little evidence that these relations also hold in naturally assembled plant communities, as it remains a challenge to upscale this experimental research to larger geographical and temporal scales (Duffy, 2008). Most observational studies have focussed on forest communities, as tree biomass increase can be readily monitored through time, and generally, positive relations have been reported between tree diversity and stability of wood production (DeClerck et al., 2006; Aerts and Honnay, 2011; Paquette and Messier, 2011). Long term observational studies on natural grassland ecosystems, such as the one of Bai et al. (2004), often lack the temporal resolution to measure the relation between ecosystem functioning and environmental change, thus missing the short term effects of the changing environmental drivers. It remains therefore a huge challenge to make accurate observations of ecosystem properties across both larger temporal and geographical scales to test the generality of the experimentally demonstrated diversity-stability relation in naturally assembled plant communities (Grman et al., 2010; Loreau, 2010). The difficulty lies

 predominately in obtaining and combining the required data regarding local plant species composition, plant functional traits, and time series of ecosystem properties.

 Because remote sensing techniques allow the production of ecologically relevant time series of measures indicative for ecosystem functioning, they offer promising avenues for upscaling the current levels of observation in species diversity *versus* ecosystem stability research. Remote sensing through satellites enables systematic monitoring of the earth's surface cover with temporal intervals using reflectance measurements. Numerous remote sensing studies have provided insight into global spatio-temporal patterns of ecosystem properties, including aboveground biomass production through greenness measurements (Zhang et al., 2003; Formica et al., 2004; Fraser et al., 2011). The most widely used proxy for ecosystem productivity is the Normalized Difference Vegetation Index (NDVI) (Rouse et al., 1973; Beck et al., 2011). NDVI gives an indication of how much light is used for photosynthetic activity, and it approximates ecosystem properties such as photosynthetic active biomass and biomass production (Lloret et al., 2007).

 The general aim of this study was to quantify how plant species diversity and plant functional diversity correlate with the stability of aboveground biomass production in naturally assembled dune grassland ecosystems under influence of fluctuating drought. We exploit the unique Dutch National Vegetation Database consisting of over 640,000 vegetation plots (relevés) (Schaminée et al., 2012), and combine available historical vegetation data and climate data with remote sensed indicators of stability in biomass production. Therefore we used Moderate Resolution Imaging Spectroradiometer (MODIS) NDVI images at a 250m resolution. To examine ecosystem responses, two widely used measures of ecosystem stability are used: the variance, *i.e.* the long term variability of ecosystem properties; and resistance, *i.e.* the degree of immediate response on a changing environmental factor (Van Ruijven and Berendse, 2010; De Keersmaecker et al., 2013).

More specific, the aims of this study were to:

 1) Combine long term climate data and MODIS satellite images to quantify effects of drought in calcareous dune grasslands in the Netherlands and to correlate precipitation changes with variance in biomass production.

 2) Quantify how (i) plant species richness and diversity, and (ii) plant functional diversity of natural dune grassland ecosystems mediate biomass production in response to drought events.

Material and Methods

Selection of study sites

 The study focuses on calcareous dune grassland ecosystems in the Netherlands. The Dutch calcareous dune region stretches along the western coast from the Belgian border in the South to the village of Bergen in the North. Phytosociological syntaxonomy classifies these vegetation types predominately into the class of *Koelerio-Corynephoretea* (Schaminée et al., 1996). All studied grasslands are located in an area under the European 'Natura 2000' legislation. Management consists of seasonal grazing with cattle (Fig. 1a).

Selection of remote sensing data

 Time series of the NDVI were used to monitor ecosystem properties through time. NDVI quantifies the amount of greenness of vegetation and can therefore be used to give an approximation of aboveground biomass production (Verbesselt et al., 2010; Zhang et al., 2010; De Keersmaecker et al., 2013). Moderate Resolution Imaging Spectroradiometer (MODIS) NDVI images from the MOD13Q1 and MYD13Q1 product, collected by both the TERRA and AQUA sensor, were obtained from the NASA Land Processes Distributed Active Archive Centre (LP DAAC: http://lpdaac.usgs.gov) (Gu et al., 2013). MODIS NDVI data has 142 a resolution of 250×250 meter pixels. Time series were made from the data covering the time window between the years 2001 and 2012, with an eight daily temporal resolution. A total of 1169 MODIS pixels covered the studied area (Fig. 2).

 Low quality MODIS data were removed based on their associated quality flag, *i.e.* flags indicating the presence of adjacent water bodies, clouds, shadows or aerosols. In order to remove residual noise, the data were smoothed using the Savitzky Golay filter of the TIMESAT software with a window size of 7 (Jonsson and Eklundh, 2002; Jönsson and Eklundh, 2004; Moreno et al., 2014) (Fig. 1c).

Selection of vegetation data

 Vegetation data from the selected areas were acquired from the Dutch National Vegetation database (NVD) (Schaminée et al., 2012). An initial dataset of 12,000 records of calcareous dune grasslands was available. All vegetation recordings used to calculate species and functional diversity were made between 1995 and 2000, prior to the start of the NDVI time series. Records syntaxonomically classified as grasslands were selected, including classes 12 (*Plantaginetea majoris* - wet meadows) to 20 (*Calluno-Ulicetea* – arid heath- and grasslands)) (Schaminée et al., 1996) (Fig. 1b). Phytosociological classification was performed using ASSOCIA (Tongeren et al., 2008), included in the Turboveg software package (Hennekens and Schaminée, 2001). Species cover abundance in all vegetation records was quantified 160 using the adapted Braun-Blanquet scale in 2×2 meter plots. Subsequently, cover scales were transformed to percentages (Schaminée et al., 2011).

Selection of study pixels

 The study pixels were selected, through overlaying the 250x250m MODIS pixels with the vegetation records. Only MODIS pixels including at least three vegetation records, evenly distributed across the pixel area, were selected (Fig. 1c). To guarantee homogeneity of the pixels' vegetation, it was verified whether all vegetation records were classified within the same phytosociological class (Fig. 1d). To minimize heterogeneity in the selection, only pixels were selected situated within the habitat type of grey dune grasslands. Although all pixels fall in areas with comparable abiotic conditions and similar nature management, including controlled ground water tables, some variation in vegetation types is present. An overview of the occurring vegetation types (phytosociological classes) can be found in Supplement I.

 To prevent interference from large water bodies and sandy surfaces (including sea and beach), pixels adjacent to these surfaces were omitted. Additionally, the NDVI time series of all pixels were manually checked for interference factors and noise. Finally, the structural homogeneity of the vegetation in the selected pixels was verified based on *Google earth* and/or by visiting the pixels in the field (Fig. 1f). This series of selection criteria resulted in a final selection of 48 250×250 m MODIS pixels, containing 707 vegetation records.

Species diversity indices

 Based on the vegetation data, species diversity indices were calculated for each of the 48 pixels, using the average value of the combined vegetation records present in a particular pixel. Indices were calculated using the JUICE software package (Tichý, 2002). We calculated

$$
184 \qquad \qquad \text{Species number} \ (Nr)
$$

‐ Shannon-Wiener Index (*H'*) following Equation 1.

$$
H' = \sum_{i=1}^{s} P_i \ln P_i \tag{Eq. 1}
$$

187 Where *S* is the total number of species and P_i is the proportion of the individual species relative to the total cover.

- ‐ Evenness (*E*) following Equation 2.
-

191
$$
E_H = \frac{H^{'}}{H^{'}max} = H^{'} / \ln S
$$
 (Eq. 2)

 For each study pixel, also functional diversity was calculated as Rao's quadratic entropy 193 (FD₀), according to Equation 3, where d_{ij} is the difference between species *i* and *j* as calculated according to equation 4 where *t* is the number of considered traits and *X* is the trait

 value of a specific trait *k* for species *i* or *j (Botta-Dukát, 2005)*. Functional trait data of the species were retrieved from the trait databases LEDA and the *Ecological Flora of the British Isles* (Fitter and Peat, 1994; Kleyer et al., 2008). The following plant traits were selected: specific leaf area (SLA), leaf size, leaf dry matter content, leaf mass, root depth and canopy height. These traits can be expected to mediate biomass production in individual plant species and can be related to resource acquisition (Schumacher and Roscher, 2009). Additionally the flowering onset time and length of the flowering period were included in the analysis to reflect temporal variation in phenology of the vegetation. Selection of traits was constrained 203 by the availability of trait data for the complete plant species data set. Therefore FD_O was based on species occurring in at least 75% of the pixels, to calculate functional diversity. All trait values were quantitative variables and were standardized to values between 0 and 1.

207
$$
FD_Q = \sum_{i=1}^{S-1} \sum_{j=i+1}^{S} d_{ij} P_i P_i
$$
 (Eq. 3)

208
$$
d_{ij} = \frac{1}{t} \sum_{k=1}^{t} (X_{ik} - X_{jk})
$$
 (Eq. 4)

 As the species and functional diversity measures were based on vegetation recordings that were made before the NDVI time series, we implicitly assumed that species and functional diversity did not significantly change within the 2001-2011 time window. This assumption was tested by using long term permanent plot data. Five dune grassland permanent plots were yearly monitored during 24 years. Both species richness (Nr) and Shannon-Wiener index (H) 214 did not change during this time window (Friedman test, $P_{nr}=0.867$, $P_{H}=0.899$).

Meteorological data

 Meteorological data were retrieved from the online databases of the Royal Meteorological Society of the Netherlands (KNMI) (2014). Data were acquired from the Vlissingen monitoring station for the time window 2001-2011. This particular monitoring station was

 chosen for its proximity to the observed dune areas. Data regarding temperature, precipitation and potential evaporation were used for calculating the Standardized Precipitation and Evapotranspiration Index (SPEI) (Vicente-Serrano et al. 2010). The SPEI reflects drought events and the effect on plant life, considering not only precipitation but also the evaporation and transpiration of water from the soil and plant material. A negative SPEI value is associated with the occurrence of drought. Monthly values of SPEI were calculated as 225 measure of drought (Drought indices: C_{SPEI}) taking the previous two months into account. Only SPEI-values during the growth season (March-October) were used between 2001 and 2011 (n=80). Calculations were performed with the *R*-package *SPEI*.

Ecosystem drought response: NDVI anomaly

 Temporal variation of an NDVI time series contains (I) a seasonal component (due to phenology), (II) an anomaly due to external environmental factors, (III) noise through atmospheric influences or sensor noise (Lhermitte et al., 2011) and (IV) trends (e.g. due to long term vegetation changes or sensor degradation (Fensholt and Proud, 2012; Wang et al., 233 2012). These trends can be considered to represent long term changes in the equilibrium state of the grassland, instead of being short term anomalies resulting from climate disturbances. Since it was our aim to quantify short term responses of biomass production to precipitation variability, each NDVI time series was detrended in case of a significant temporal linear 237 trend. The NDVI-anomaly (A_{NDVI}) of each pixel was used as an indicator for ecosystem 238 drought response. NDVI values were available in eight day averages. A_{NDVI} was calculated by removing the seasonal component within the NDVI variation. This was done by subtracting the mean eight daily NDVI over all years, from the original NDVI time series. A monthly NDVI-anomaly was calculated, to match the temporal resolution of the meteorological data. A decrease in NDVI results in a negative NDVI anomaly, thus a decrease of biomass production.

Statistical analyses

 Analyses were performed on all selected pixels (n=48). We calculated response coefficients 246 ($P_{resonose}$) for each pixel (px) as the slopes of the regression lines between A_{NDVI} and C_{SPEI} using Model 1.

$$
P_{response} = (A_{NDVI} \sim C_{SPEI})_{px}
$$
 (Mod. 1)
249

 The response coefficients were subsequently correlated with the diversity indices (Species 251 richness (Nr), Shannon-Wiener index (H') , Evenness index (E_H) and the Functional diversity 252 ($FD₀$)). A linear regression was then performed to analyse the correlation between the diversity indices and the response coefficients to drought of all pixels (Model 2). In this 254 model we also included the phytosociological class $(V_{class}, n=5)$ of the grassland vegetation type as a fixed effect.

$$
256 \tP_{response} \sim I_{Nr/H'/E_H/FD_Q} * V_{class} \t{(Mod. 2)}
$$

257 The pixels were tested for spatial autocorrelation in A_{NDVI} by computing Moran's I for the residuals of the regression model (Mod. 1). Analyses were performed in *R* including R- packages *FD* (Laliberté and Shipley, 2010), *ape* (Paradis et al., 2008), *lme4* (Bates, 2010) and *Vegan* (Oksanen et al., 2007).

262 **Results**

263 No spatial autocorrelation could be detected between the pixels' NDVI anomaly (MORANS's 264 *I:* $I=6.29\times10^{-5}$, $P=0.377$). Therefore, all pixels were further considered to be independent 265 observations.. Ten years of C_{SPEI} and NDVI anomaly data show high variance (Fig. 3), with a 266 strong correlation between both variables β =0.55, P<0.001). C_{SPEI} explained 29% of the 267 variance (P<0.001, r²=0.291) and significantly predicted the average NDVI-anomaly (β=0.55, 268 P<0.001, Fig. 3, Table. 1). This positive correlation between both variables indicates a 269 decrease in the NDVI-anomaly with decreasing C_{SPEI} values.

 The response coefficients (*Presponse*) of the pixels (*i.e.* the slopes of the regression line between A_{NDVI} and C_{SPEI} per pixel) were negatively correlated with species richness ($P=0.007$, $r^2 = 0.11$) and Shannon-Wiener diversity (*P*=0.041, $r^2 = 0.06$). Both Evenness (*P*=0.070, $r^2 = 0.08$) and functional diversity (*P*=0.246) showed no significant correlation with the response coefficient (Table 2, Fig. 4). There was no significant effect of vegetation type, or of the interaction between vegetation type and the diversity indices, on the response coefficients.

Discussion

 The general aim of this study was to upscale the experimentally established positive relations between plant species diversity and the stability of aboveground biomass production in natural systems in both time and space, using remote sensing techniques. A stable primary production is regarded as one of the major ecosystem functions (Loreau, 2010; Isbell et al., 2011). As far as we know this is the first study that reports a positive relation between species diversity and biomass production stability in naturally assembled grasslands at a regional scale.

 Overall, we observed a close correlation between the NDVI-anomaly patterns and the patterns of the Standardized Precipitation and Evapotranspiration Index (SPEI)-values derived from the KNMI meteorological database. Although there was a high variation in the response of each pixel, extreme drought events, reflected by SPEI lows occurring in 2003, 2006, 2009, 2010 and 2011 (Fig.3), also resulted in extremely negative NDVI anomalies. This is 290 supported by the observed significantly positive correlation between the C_{SPEI} -values and the NDVI-anomaly. These results clearly indicate that variation in water availability in these natural dune grassland ecosystems strongly affect above ground biomass production, as reflected by the NDVI.

 Species number, as well as species-based diversity indices, showed a significant interaction with the drought index in its relation with the NDVI-anomaly, and thus mediate the effect of drought on the NDVI response. The immediate effect of drought on the NDVI anomaly was stronger in grasslands with a higher species diversity, indicating an increased resistance against drought of species rich and diverse communities. Plant species richness was a better correlate of grassland ecosystem stability than species diversity, whereas there was no effect of evenness. This indicates that the presence or absence of species is of more importance than

 their relative abundance. Although no causation can be inferred, our results are in agreement with the findings of many experimental studies, which have reported a stabilizing effect of diversity on a variety of ecosystem functions including biomass production in grassland ecosystems (Ives and Carpenter, 2007). In particular, Gross et al. (2014) demonstrated a stabilizing effect of plant species richness on biomass production at the community level in 16 experimental grassland studies. Biomass production at the population level, on the other hand, became less stable during environmental disturbances due to asynchronous species responses. As species richness increases in experimental grasslands, also the degree of asynchrony increases, leading to a higher chance of compensatory dynamics, *i.e.* that declines of some species are compensated by increases of others (Hector et al., 2010; Loreau, 2010; Gross et al., 2014). The net effect is an increased temporal stability of biomass production at the community level. Additionally, also small scale environmental heterogeneity may contribute to increasing stability (Pasari et al., 2013). As dune grassland systems are typically highly variable in water and nutrient availability across small scales (Cain et al., 1999), also spatial heterogeneity, in addition to temporal heterogeneity, may have a role in stabilizing the ecosystems' output. Indeed, a larger local species pool increases the chance of exploiting the variety of available resources, resulting in spatial complementarity (Ozinga et al., 1997; de Mazancourt et al., 2013).

 There was no significant effect of plant functional diversity on grassland ecosystem stability. Petchy and Gaston (2002), indicated that in an assemblage with a limited trait dimensionality, the number of traits considered may affect the observed relation between functional diversity, redundancy and stability. Therefore, we cannot exclude that the absence of a significant correlation is related to both the relatively limited number of quantitative traits that could be taken into account and the number of species for which trait values were available (Pakeman, 2014). In addition, it must be noted that the functional data used, were collected for a wide

 array of applications, mostly others than for this study. However, we believe that the current selection of traits is highly relevant in a context of drought response (Taugourdeau et al., 2014). However, the better correlation of species diversity indices as compared to functional diversity indices is in agreement with the idea that functional redundancy may be of more importance than functional diversity, and that redundancy may limit the influence of functional diversity on the stability of the measured ecosystem function (Pillar et al., 2013). A higher number of species with similar functional trait values, though a differential temporal response to disturbance, increases the probability of functional complementarity, resulting in functional compensation. As dune systems are prone to drought, all species naturally present can be expected to be functionally equipped to cope with this to a certain extent. If this results in a relatively strong convergence in functional traits related to water stress, then individual species have a limited contribution to functional diversity, although they do add to functional redundancy.

 Our findings also support Kreyling et al. (2008), who found contrasting effects in different grassland communities, as well as the conclusions of Dalerum et al. (2012),who showed that an increased functional diversity of an assemblage of plant species does not necessarily lead to a higher stability. Although trait databases are already an important source to find such information, many data are lacking or has a high intra-species variability due to trait plasticity or due to different measurement circumstances (Cordlandwehr et al., 2013). Additional extensive measurements of traits in the field are necessary to fill the data gaps and strengthen the outcome of trait-based analyses. This includes collecting trait data on species with low abundance, which may also contribute to biomass stabilization (Walker et al., 1999). Also *in situ* measurements of trait values of individual species combined with *in situ* measurements of biomass production data may provide important data . This stresses the continuing importance

 for the compilation and supplementation of large observational databases containing data on species and functional traits (Cadotte et al., 2009) .

 Our assumption that species richness and diversity in the studied dune grasslands, remained stable during the observed time window was supported by the analysis of species diversity in permanent quadrants, which showed no significant changes in both species numbers and diversity over a period of 25 years. This was not unexpected, given the constant management regime of the grasslands. Using permanent plots along a water stress gradient, Isermann (2011) showed that plant species diversity was highest and most stable at intermediate levels of water stress, while at the same time these plots showed a high turn-over in species composition. This is consistent with our interpretation that a stabilizing effect of biodiversity mainly occurs through compensatory dynamics.

 It is predicted that climate change will increase the frequency and intensity of ecosystem disturbances (Turner, 2010; Dawson et al., 2011). At the same time, habitat loss, fragmentation and other anthropogenic activities may decrease plant species diversity (Grimm et al., 2013). Although we cannot claim causation based on our analyses, the correlations found in this study strongly suggest that declines in species diversity also decrease the ability of ecosystems to maintain their functioning in an environment which becomes more prone to climate extremes (Cardinale et al., 2012). It is therefore of utmost importance to conserve plant diversity to guarantee the provisioning of ecosystem service.

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Figures

Figure 1

Figure 2

Figure 3

Figure legends

 Figure 1. Flow chart indicating the steps in selecting MODIS pixels and vegetation relevés to study the effects of species diversity on dune grassland response to drought events.

Figure 2. Location of the final selection of MODIS pixels in the calcareous dune grasslands at the western coastal area of the Netherlands.

- **Figure 3.** Time series of both the monthly Standardized Precipitation and Evapotranspiration 563 Index $(C_{SPEI};$ dotted line) and the NDVI-anomaly (average NDVI-anomaly $(A_{NDVI});$ continuous line). Only the months of the growth season (March-October) are shown.
- **Figure 4.** Linear regression between diversity indices (a: Species richness (Nr), b: Shannon-566 Wiener (H'); c: Evenness (E); d: Functional diversity (FD_O)) and the respective response coefficients. The 2.5% and 97.5% confidence intervals are given in the shaded area. Significances are indicated in Table 2.

570 **Tables and Table titles**

571 **Table 1**: **Direct effects of SPEI on the average NDVI anomaly through linear regression.**

573 **Table 2:** Linear regression analysis of diversity indices and the response coefficients 574 including the interaction effect with the vegetation type (phytosociological class) as fixed 575 factor (N=48 pixels).

$Im(Response \sim Div^*V_{class})$							
	df	Sum sq	Mean sq			β	
Regression		$(\times 10^{-3})$	$({\times}10^{-3})$	F	\mathbf{P}		
Nr	$\mathbf{1}$	1.244	1.243	7.911	0.007	-0.39	a
Type	$\mathbf{1}$	0.043	0.043	0.270	0.606		
Nr*Type	$\mathbf{1}$	0.064	0.064	0.403	0.528		
Residuals	42	6.700	0.159				
H	$\mathbf{1}$	0.693	0.693	4.490	0.041	-0.32	a
Type	$\mathbf{1}$	0.025	0.025	0.163	0.689		
H*Type	$\mathbf{1}$	0.213	0.213	1.387	0.247		
Residuals	39	6.024	0.154				
E	$\mathbf{1}$	0.579	0.579	3.461	0.070	-0.26	
Type	$\mathbf{1}$	0.135	0.134	0.804	0.375		
E*Type	$\mathbf{1}$	0.184	0.184	1.101	0.300		
Residuals	44	7.356	0.167				
FD	$\mathbf{1}$	0.237	0.237	1.384	0.246	-0.17	
Type	$\mathbf{1}$	0.072	0.072	0.420	0.521		
FD*Type	$\mathbf{1}$	0.354	0.354	2.071	0.157		
Residuals	43	7.356	0.171				

576

577

Table legends

- 580 **Table 1**: Results from an analysis of variance, comparing two time series of C_{SPEI} (N=80)
- and the average NDVI on 48 pixels as given in Fig. 3, through linear regression.
- **Table 2**: Linear regression analysis of diversity indices and the response coefficients over 10
- 583 years (N=48) according to model 2.

Appendix

Table Supplement I

¹ Plantaginetea majoris: a very common vegetation class in the Netherlands, consisting of common plant species. This class is often associated with minor disturbance systems due to trampling by large grazers.

² Koelerio-Corynephoretea is the dominating vegetation class in the observed dune systems. The

vegetation can be found on relatively nutrient poor to moderately nutrient rich sandy soils and is

dominated by grass species and small herbs.

³ Trifolio-Geranietea sanguinei is vegetation class mostly found on moderately nutrient rich sandy

soils and is associated with calcareous conditions. Grass species are dominating this class.

⁴ Nardetea is a grass dominated vegetation class on relatively poor soils and is often associated with the presence of cattle.

⁵ Calluno – Ulicetea is a vegetation class associated with dry, relatively nutrient poor sandy soils,

although some woody heat species may occur, the system is dominated by grass species (e.g. *Festuca*

and *Deschampsia)*. This class is often found near open sandy surfaces and is associated with cattle or

livestock for grazing.

According to (Schaminée et al., 1996)