

A functional approach reveals community responses to disturbances

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Understanding the processes shaping biological communities under multiple disturbances is a core challenge in ecology and conservation science. Traditionally, ecologists have explored linkages between the severity and type of disturbance and the taxonomic structure of communities. Recent advances in the application of species traits, to assess the functional structure of communities, have provided an alternative approach that responds rapidly and consistently across taxa and ecosystems to multiple disturbances. Importantly, traitbased metrics may provide advanced warning of disturbance to ecosystems because they do not need species loss to be reactive. Here, we synthesize empirical evidence and present a theoretical framework, based on species positions in a functional space, as a tool to reveal the complex nature of change in disturbed ecosystems.

Disturbance and biodiversity: why traits should matter

Despite conservation efforts, biodiversity loss continues apace at regional or global scales across a wide range of ecosystems, due to increasing intensity of disturbances (see Glossary), such as overexploitation of species [1], destruction of habitats [2], climate change [3], or invasion by alien species [4]. As a feedback, biodiversity erosion is imperiling the sustainability of ecological processes and the provision of ecosystem services [5]. Thus, there is an urgent need to quantify and predict the effects of disturbance on biodiversity patterns to guide conservation efforts and the management of ecological resources. Here, we consider the term 'disturbance' in its widest sense as any event, natural or human-driven, that causes temporary and localized shifts in species demographic rates. We classify disturbances in three categories as those caused by (i) direct human impacts; (ii) biotic pressure (mainly imposed by exotic species); and (iii) environmental changes (abrupt shifts in abiotic conditions and habitat degradation).

Until recently, the effect of disturbance on species diversity was largely assumed to be unimodal, with species diversity reaching its maximum at intermediate levels of disturbance [6]. The underlying mechanistic explanation for this pattern is that competitive exclusion may reduce species richness at low levels of disturbance, whereas high levels of disturbance exclude all but the most disturbancetolerant species. However, the unimodal model is far from universal, having been falsified by observational [7], experimental [8], and theoretical studies [9]. Moreover,

Glossary

Disturbance: any event, natural or human driven, that causes temporary and localized shifts in demographic rates.

Fourth-corner analysis: a method that quantifies the correlations between species traits and abiotic variables in a fourth matrix using three input matrices (R, abiotic variables; L, species presences and/or absences or abundances; and Q, species traits).

Functional dissimilarity: the dissimilarity in the functional space occupied by two communities.

Functional divergence: the proportion of total abundance supported by species with the most extreme trait values within a community.

Functional diversity: the distribution of species and their abundances in the functional space of a given community.

Functional evenness: the regularity of the distribution and relative abundance of species in functional space for a given community.

Functional identity: the mean value of functional traits, weighted by abundance, across all species present in a given community.

Functional originality: the isolation of a species in the functional space occupied by a given community.

Functional richness: the volume of multidimensional space occupied by all species in a community within functional space.

Functional space: a multidimensional space where the axes are functional traits along which species are placed according to their functional trait values. **Functional specialization**: the mean distance of a species from the rest of the species pool in functional space.

Functional trait: any trait directly influencing organismal performance.

Linear trait-environment method (LTE): a method that linearly relates species traits to abiotic variables using species abundances across environments.

Maximum Entropy model (MaxEnt): a predictive model assuming that the relative abundance of a given species in a given environment is a function of its trait values.

Monotonic relation: a relation is monotonic if a response or dependent variable consistently increases (or decreases) or stays the same with every increase in an associated predictive or independent variable.

Performance filter: the process by which local abiotic variables determine the performance of a given trait, defined as its fitness, in a given environment.

RLQ analysis: a three-table (R, abiotic variables; L, species abundances; Q, species traits) ordination method testing the relations between species traits and abiotic variables.

Trait filtering: the process by which abiotic variables determine whether a species has the requisite traits to colonize, establish, and persist in a given environment.

Trait: any morphological, physiological, or phenological feature usually measurable at the individual level.

Unimodal relation: a relation is unimodal if a response or dependent variable has a single mode (or peak) along the axis of the predictive or independent variable.

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neutral models [10], where all species are ecologically identical [11], also produce unimodal relations between species richness and disturbance level. This challenges the assumption that the unimodal model is due solely to species differences in terms of tolerance to disturbance or competitive ability. It also indicates that species diversity alone cannot explain whether niche or neutral processes are responsible for the observed patterns.

Functional traits offer a useful alternative approach, providing a means of distinguishing between niche and neutral assembly processes [12–14]. Indeed, accumulating evidence suggests that competitive interactions [15] and species filtering by disturbance [16] are, at least partly, driven by species functional traits. Disturbance generally increases mortality rates and reduces reproduction rates for resident species, causing density-dependent competition to have a weaker influence on community structure (but see [17]). Usually, some species are more severely impacted by disturbance than are others, but this can occur with both niche and neutral models. When disturbance excludes species with particular traits, or severely reduces



Figure 1. Impact of disturbance on the functional structure of a theoretical species assemblage. (a) Eight species comprising the pool (from *Sp1* to *Sp8*). (b) Examples of functional traits measured on individuals: (i) body depth; and (ii) caudal fin surface. (c) Mean trait values calculated for each species. (d) Species plotted in a functional space where axes are mean trait values. (e) Species abundances before and after disturbance. (f) Under the niche hypothesis, loser species [i.e., those with lower abundance after disturbance (proportional to pink circle surface) than before (proportional to blue circle surface)] share common trait values. The winner species are also functionally similar to each other, but are different from loser species. (g) Under the neutral hypothesis, loser and winner species are randomly placed in the functional space.

their abundance, trait differences between species can drive interspecific differences in response to disturbance [18]. This provides evidence for niche processes driving community responses to disturbance and permits falsification of the null hypothesis (that species are identical in their response to disturbance) provided by neutral theory (Figure 1). Rejection of the neutral model for response to disturbance allows prediction of disturbance impacts on the functional trait structure and, hence, the functioning of communities [19]. However, the use of traits to reject the neutral model requires metrics that can detect disturbance impacts on the functional structure of communities. To understand which metrics might be useful for detecting non-neutral disturbance impacts on functional structure, it is helpful to envisage species trait values as coordinates locating species in functional trait space. Here, we define functional space as a multidimensional Euclidean space where axes are ecologically relevant traits (Box 1). Thus, where species diversity, as a sole metric, cannot reliably distinguish between selective (niche) and random (neutral) processes in shaping the response of communities to disturbance [9,10], we propose that a trait-based approach can better quantify, and so predict and anticipate, the impacts of disturbance on ecological communities. In scenarios where both theories apply, species traits provide the means

Box 1. History, definition, and use of functional space

It has long been accepted that the morphology of a species can be a reliable indicator of its ecology [88–90]. However, it was the widespread use of ordination methods that provided a readily accessible methodology to express these relations [91]. Ordinations permitted the simultaneous examination of multiple traits in multiple organisms. One can visualize entire communities or assemblages in terms of the functional abilities of both the assemblage as a whole and the component species [33,59,92]. Thus, complex anatomical structures could be quantitatively compared and variation interpreted in an ecological context. With this association between form and function, a description of functional morphospace was possible as a multidimensional measure of the abilities of organisms.

If non-anatomical traits are included (e.g., biochemical and behavioral traits), the potential information is even greater [51]. The use of morphospace, trait space, or functional morphospace has steadily evolved over the past few decades. All can be easily contained in the single term, functional space; that is, the ecological attributes of species (occurrences or abundances and traits) or assemblages expressed in multidimensional space.

Although popular in paleontological studies, where morphology provides insights into past ecology [23,93], it is in neontology that it has been most widely used. From birds [21], bats [94], and fishes [88] to insects [95] and plants [59], the approach has provided key insights into the functional structure of assemblages. However, mirroring the relation between species diversity and functional diversity [96], the devil is in the detail. From the start, the ecological links were made with caution [92] and links may not always be as strong as one may assume [88,91,97]. Thus, although functional space remains a powerful tool, the strength of the application depends on the extent to which traits really are indicative of functional attributes.

Nevertheless, the evaluation of functional space has proven to be an exceptionally versatile and sensitive approach, offering insights into the changes in assemblages through time [13,23], the impacts of species invasions [32,33], and responses to environmental change [16,42]. This single approach offers a rigorous and powerful methodology to identify and distinguish the functional implications of changes in assemblages. to determine the relative magnitude of niche versus neutral processes in disturbed communities [20]. Moreover, measures of the functional traits within a community are better predictors of ecosystem processes than is species diversity [21]. Thus, quantifying and predicting functional community structure within a context of increasing disturbance intensity and frequency is required to anticipate the potential loss of ecosystem services that is indisputably associated with biodiversity erosion [5].

Here, we first propose theoretical expectations regarding the influence of three common types of disturbance (i.e., direct human impacts, biotic pressures, and environmental changes) on the functional structure of communities. The functional structure of a community is defined as the distribution of species and their abundances in the functional space. We compare expected trends of taxonomic versus trait-based indices of community structure along disturbance gradients to argue that trait-based indices are more likely to show monotonic and predictable relations. We also present empirical evidence supporting this theoretical view. We then review a list of complementary quantitative tools that can be used to assess changes in functional community structure under disturbance, as well as appropriate null models and recent methods to test them. We show why and how a trait-based multidimensional framework may provide advanced signals of disturbance on ecosystems. Finally, we discuss future directions and knowledge gaps regarding this rapidly evolving research field.

Impacts of disturbance on functional community structure: empirical evidence

The use of multidimensional functional space based on species traits (Box 1, Figure 1) is emerging as a particularly useful way to characterize changes in communities or to test various ecological theories [19,22,23]. Here, we use functional space to illustrate and quantify expected changes in community structure after disturbance under the niche hypothesis (i.e., that traits matter). We partition disturbances to ecological communities as direct human impacts, biotic pressure, and environmental changes (Figure 2).

Direct human impacts

We restricted human impacts to those that directly affect species composition and abundances, mainly through resource exploitation. The total trait space occupied by a community declines in a non-random way according to the



Figure 2. Theoretical changes in the functional structure of a species community after three types of disturbance. (a) Functional space defined by two traits where eight species are included. (b) Human impact depletes species populations with high values for trait 1. (c) Biotic pressure, through the presence of a non-native species (solid red circle), depletes the population either of the closest native species in the functional space by competition or of the most vulnerable species to predation. (d) Environmental constraints filter out species with high values for trait 1 and low values for trait 2. As an illustration, one combination of pairs of disturbances (e) is also presented, with some additive impacts in the functional space inducing the extinction of a species.



Figure 3. Illustration of the impact of three types of disturbance on functional community structure. (a) Impact of fishing on coral reefs where large-bodied species are preferentially targeted. Results from the Lau Island group (Fiji) show that fishing pressure explains 63.6% of variation in the weighted average maximum size of the fish community [98]. (b) *Nothofagus* forest in New Zealand before (1970s) and after control of invasive deer, which impact palatable species with high foliar nutrient contents (nitrogen and phosphorous). (c) Drought impact on the forest around Los Alamos (Arizona, USA) before and after drought stress mostly affecting tall, overstory trees as well as shorter trees, shrubs, grasses, and other vegetation beneath the overstory trees.

niche theory because human impact preferentially affects species sharing some vulnerable traits and, thus, certain parts of the functional space (Figure 2b). The most striking example is the disproportionate loss of large-bodied fishes across the world [24]. Indeed, fish communities are not randomly affected by fishing pressure, with a clear preference for predatory species [25] and species that grow larger [26] (Figure 3a). This profoundly affects community composition and ecosystem functions because even moderate levels of exploitation can drive large-bodied components of major functional groups to local extinction or functional irrelevance. Hence, size-based metrics have proven to be powerful indicators of fish community responses to exploitation [27,28].

As an illustration, the most conspicuous fish species losses on coral reefs are from the most heavily targeted species, such as sharks, groupers, snappers, and larger herbivores [29–31] (Figure 3a). These provide the basis for novel fish communities that are dominated by small planktivorous or herbivorous fishes. Although they are able to deliver many ecosystem services and support food webs, these novel communities represent a fundamentally different species assemblage: a functionally depauperate system created by the selective removal of groups driven by burgeoning human population densities and an increasing trade to western markets driven by gastronomic tastes or desires.

Biotic pressure

Biotic impacts, largely induced by non-native species, may change the local species richness of a given community, as well as its functional structure, by altering a part of the functional space occupied by native species. Typically, the greatest impacts result from changing the composition within the community in a non-random way (Figure 2c), particularly affecting species with similar traits through competition or by species sharing traits, thus making them vulnerable to a consumer. Native and non-native species can be similar in functional traits, but a competitive advantage may allow non-native species to establish and ultimately extirpate native species. For instance, non-native perennial grass invaders can establish into nativedominated grasslands, achieving cover values up to 71% over several years and decreasing native perennial grass productivity [32]. Similarly, the range contraction of native fish species in the Colorado River Basin was partly explained by overlapping traits (morphological, behavioral, physiological, trophic, and life history) with non-native species [33]. These results suggest that non-native species do not need functional traits that are different from those of the native communities to succeed, but may competitively establish and then decrease the abundance of, or even exclude, native species with similar traits. Non-native species can also act as both competitors and consumers to decrease native species abundances until potential

extinction. For instance, the invasion of the ladybird species *Harmonia axyridis* in eastern England provoked the decline of some native aphidophagous ladybirds through competition for prey and intraguild predation of eggs, larvae, and pupae, both of which are linked to trait similarity [34].

As an illustration, the flora of New Zealand has evolved in the absence of ungulate herbivores. The widespread introduction of ungulate herbivores by Europeans has reduced populations of palatable species [35] (Figure 3b). This lowers community-weighted means for foliar nutrient (nitrogen and phosphorous) content and increases them for foliar tannin, phenolic, and lignin content [36]. These trait shifts may also have consequences for rates of litter decomposition and photosynthesis.

Environmental changes

Environmental changes may not only alter total species richness at a location, but can also cause a shift in functional space occupation by removing species with traits that are poorly adapted to the new environment and colonization better-adapted species allowing by (Figure 2d). For example, following long-term changes in precipitation, transitions among grassland and scrubland can occur, causing shifts to woody vegetation and, thus, directional modifications to the functional structure of communities [37]. In the same vein, alpine plants with a longer growing season that are taller (more competitive) with larger leaf areas (more productive) may replace other species in snowpatches because climate change is inducing earlier snowmelt [16]. Also, the relation between fire intensity and species mortality in tropical areas has been closely linked to tree traits, such as diameter, height, and wood density [38]. Hence, fire-induced tree mortality may become predictable from appropriate traits.

Within the context of increased drought intensity and frequency under warmer temperature conditions induced by climate change, forests are experiencing severe die-off events [39]. Spatial patterns of mortality are, however, influenced by species life-history traits, with drought-tolerant species having traits consistent with their mode of stomatal regulation, such as deep rooting access to more reliable soil water and cavitation-resistant xylem [40]. Wood density is a key trait in preventing xylem cavitation [41] and plants with higher density tend to have better resistance in more drought-prone environments [42]. As a result, the juniper woody species Juniperus monosperma experienced mortality ranging from 2% to 26% after 15 months of depleted soil water content (2001-2002) in southwestern North America, whereas the overstory tree species Pinus edulis (a piñon pine) experienced mortality of up to 90%, inducing potentially large changes in carbon stores and dynamics. This is of concern for carbon-related polices and management (Figure 3c) [39].

Some environmental changes are also directly mediated by humans and impact the functional structure of communities. For example, extinction risk is higher for smaller and more specialized bird species following habitat loss [43], whereas bats with a high wing-tip shape index, making them adapted to flight in complex canopies, are less prevalent in human-altered agricultural landscapes [44]. Urbanization also shapes functional community structure by filtering out species according to traits that make them more or less tolerant to urban conditions; for example, energy allocation to reproduction or wingspan size for birds [45] and specific leaf area or life span for plants [46].

Combined effects

Typically, disturbances do not occur in isolation and the effect of multiple drivers on an ecosystem must be considered [30,47,48]. The combined effects of environmental changes and direct human impacts are likely to reduce greatly overall species richness and trait diversity by filtering out species not only located in different parts of the functional space, but also acting additionally, or even in synergy, leading to rapid extinctions when their effects overlap in functional space (Figure 2e). For instance, fishing pressure and climate change may impact different fish species according to their traits. Indeed, species that are small and with a short life span responded quickly to changing climates, whereas larger species declined due to size-selective overharvesting [26].

The combined effects of environmental changes and biotic pressure may also result in a change of functional community structure by provoking the decline of species in different parts of the functional space. The fish community in the Colorado River Basin was influenced by both modified environmental conditions and biotic pressure from non-native species [33]. Thus, native communities may experience two combined pressures mediated by functional traits: species were filtered out due to either vulnerable traits associated with environmental changes or competition with non-native species sharing similar traits [33].

Clearly, the functional space occupied by communities can be modified in different ways under varied disturbances that may act on species occurrences and abundances. To embrace the full range of these modifications, we need to rely on appropriate and complementary quantitative tools that may, alone or in combination, reveal nonrandom and directional changes in functional community structure along disturbance gradients.

Assessing changes in functional community structure Complementary indices

The common step to all functional ecology studies is to characterize the functional strategy of each species of interest by identifying a relevant combination of functional traits (Figure 1) [49-51]. It is then possible to build a multidimensional functional space with axes corresponding to raw functional traits or to synthetic traits summarizing several raw traits (e.g., after using a principal component analysis or a principal coordinate analysis) [52,53]. Quantifying the functional structure of communities involves describing the distribution of points (i.e., species) and of their weights (i.e., abundances) in this multidimensional Euclidean space. These distributions cannot be summarized using only one index because the functional structure of communities embraces several complementary components (Box 2). However, some synthetic indices exist, such as the quadratic entropy index [54],

which combines the richness, evenness, and divergence components of functional diversity [55] and which can be decomposed across hierarchical factors [56,57], that is, decomposed across different levels of variation usually along a spatial or temporal scale. This index is widely used to reveal not only phylogenetic and functional assembly rules in ecological communities [56], but also historical and biogeographic processes shaping species assemblages at larger scales [58]. Here, we present a non-exhaustive set of complementary indices that are appropriate for a broad range of ecological contexts (Box 2).

Monotonic relation with disturbance

The rationale behind the use of these components, instead of classical taxonomic-based diversity indices, to reveal impact of disturbances on community structure is that they are likely to show consistent monotonic relations along disturbance gradients [59]. By contrast, taxonomic-based indices mostly show unimodal or idiosyncratic relations [60–62] (Box 3). For instance, species richness is assumed to peak for intermediate disturbance levels and, thus, is unable to unravel low and high disturbance levels, whereas functional richness, through trait filtering,

Box 2. Practical tools for assessing changes in the functional structure of ecological communities after disturbance

We present several indices capable of tracking change in different complementary components of functional community structure (Figure I), as well as functions implemented in the R software to compute them (Table I). In addition, we provide the function *FSECchange* (see the supplementary material online) that calculates all indices presented in Figure I and gives details about loser and winner species (in terms of abundance after disturbance).



Figure I. Potential changes in different components of the functional structure of species communities after disturbance. Species (dots) are plotted in two-dimensional functional space according to their respective trait values, where axes are quantitative traits or synthetic traits extracted from a principal component analysis (PCA) or principal coordinate analysis (PCoA) [52,53]. Circle sizes are proportional to species relative abundances before and after disturbance in blue and red, respectively. (a) Changes in species abundances may change the functional identity (mean values of traits as crosses) of species communities (i.e., abundance-weighted average value for each trait [99]), illustrated on each functional space axis by colored bars. Here, the mean trait value of the assemblage increases after disturbance for trait 1, but does not change markedly for trait 2. (b) Changes in species composition may modify the functional richness (FRic; i.e., the portion of the functional space filled by species communities [52,59]), as illustrated by the change in the convex surface gathering all the species belonging to the community. Here, functional richness is eroded after disturbance. The overall shift in the functional space can be estimated using the percentage overlap between the pre- and post-disturbance convex surfaces. Here, the portion of the functional space filled only by the pre- or post-disturbance assemblage represents 37% of their combined volume. (c) Changes in functional evenness (FEve) measure the modifications in the regularity of abundance distributions in the functional space (along the shortest minimum spanning tree linking all the species) [52]. Here, functional evenness decreases after disturbance. (d) Changes in functional divergence (FDiv) reflect changes in the proportion of the total abundance that is supported by the species with the most extreme functional traits [52] (i.e., far from the center of the functional space filled by the community), here the two colored crosses in the middle of the circle, which represent the mean functional distance from the center for each community. In this example, functional divergence decreases after disturbance. (e) Changes in functional dispersion reflect changes in the abundance-weighted deviation of species trait values from the center of the functional space filled by the community (i.e., the abundance-weighted mean distance to the abundance-weighted mean trait values of the community [53]). Line width is proportional to species abundance. Here, functional dispersion decreases after disturbance. (f) Changes in functional entropy (Rao index) reflect changes in the abundance-weighted sum of pairwise functional distances between species [54]. Line width is proportional to the total abundance of species pairs. This index needs to be expressed as an equivalent number of species to be comparable between communities [57]. Here, functional entropy decreases after disturbance. (g) Changes in functional specialization (FSpe) show how generalist species (i.e., species close to the center of the functional space, here linking all species) or specialist species (i.e., having extreme trait combinations) tend to increase in abundance [62]. In this example, functional specialization decreases after disturbance because specialists are relatively less abundant compared with generalist species. (h) Changes in functional originality (FOri) quantifies how changes in species abundances modify the functional redundancy between species (i.e., black lines are minimal functional distances among species pairs) [78]. Here, species tend to be functionally less original in the pool after disturbance because they tend to share their traits more closely with other species.

Main goal	Specific action	R function	R library
Building the functional space	Standardize continuous traits	scale	base
	Reduce space dimensionality (PCA)	dudi.pca	ade4
	Distance between species for qualitative traits or when missing values (Gower)	daisy	cluster
	Synthetic axes from any distance measure (PCoA)	рсоа	ape
Calculating indices of functional community structure	Functional identity or community-weighted mean trait values	functcomp	FD
	Functional diversity indices (functional richness, evenness, divergence, dispersion, entropy: Rao)	dbFD	FD
Assessing change in functional community structure	Functional dissimilarity using community overlap in the functional space	all.intersect	rccd
	Randomly permuting species abundances and/or occurrences for null models	sample	base
	Trait-environment relations (RLQ analysis)	rlq	ade4
	Predicting functional community structure (MaxEnt analysis)	maxent	FD

Table I. List of functions from R libraries to compute indices and assess changes in functional community structure

is expected to decrease for high disturbance levels when species are filtered out [59,63]. We also argue that indices based on both species traits and abundances (e.g., functional divergence or specialization) are more likely to act as early-warning indicators because they do not need species extirpations or local extinctions to change monotonically along disturbance gradients [62]. Indeed, under the assumption that the environment determines the performance of species according to their combinations of traits (performance filter hypothesis), even low disturbance intensity may deplete populations of species with vulnerable combinations of traits without modifying species composition and, thus, without affecting species and functional richness (Box 3).

Statistical tests

Changes in the functional structure of communities before and after disturbance can be assessed by estimating and comparing indices of functional community structure (Box 2) or by estimating the dissimilarity between these structures, which has been extensively called functional β -diversity or functional turnover between communities [57,64]. The first approach requires statistical tests to assess differences in index values or, more often, null models, because strong correlations may occur between functional and taxonomic structure of communities [63,65]. The second is based on a measure of dissimilarity that can be estimated using the overlap of communities before and after disturbance in the functional space [13], or by decomposing indices into α , β , and γ components across space or

Box 3. A theoretical basis and empirical evidence for monotonic changes in the functional structure of ecological communities along a disturbance gradient

Here, we present a potential mechanistic basis and an empirical example to show how the indices guantifying the various components of functional community structure might vary monotonically with the intensity of disturbance. whereas taxonomic-based indices do not. Furthermore, this example shows how functional indices could provide early warning signals of disturbance impacts. First, we present a hypothetical functional space where eight species are placed (Figure Ia). We illustrate how a disturbance, which affects species with the highest values for trait 1 (trait filtering process), may modify four indices (Figure Ib). Our theoretical example assumes that species richness shows a unimodal and, thus, a non-monotonic relation with disturbance (Figure Ic), in accordance with the intermediate disturbance hypothesis (IDH). When the disturbance intensity increases, the populations of the two species with the highest values for trait 1 are depleted, whereas the two species with medium to low values for trait 1 colonize the community. Functional richness shows a delayed response along the disturbance gradient because its decrease requires local extinction of species with extreme combinations of traits (Figure Id). Here, it would decrease after the extinction of the two species having the highest trait 1 values because the functional space occupied by the community would be abruptly eroded. By contrast, functional divergence displays an early and rapid decreasing relation along the disturbance gradient (Figure le) due to declining abundance of the specialist species that are most impacted by the disturbance (those with high values for trait 1 in this example). After the extinction event, functional divergence is expected to stabilize because the remaining species do not experience any disturbance. Functional evenness shows a continuous decline with increasing disturbance intensity (Figure If). Indeed, at low disturbance levels, the influence of

competitive interactions on community structure relative to disturbance-based trait filtering should be high. According to limiting similarity theory [83], only species with dissimilar combinations of traits would coexist. In this situation, dissimilar species can maintain similar abundances and even distributions throughout functional space. When disturbance intensity increases, the influence of trait filtering increases relative to limiting similarity, potentially causing co-occurring species to become more clustered in functional space, thus decreasing functional evenness. In addition, species abundances have uneven distributions in functional space because disturbance is affecting only species with particular traits. The balance between competitive interactions and trait filtering can thus drive a progressive decrease in functional evenness along a disturbance gradient.

Using published data (ground beetle communities disturbed by flooding), we show that empirical patterns can follow these theoretical predictions. Communities accumulate species when disturbance intensity increases from low to moderate levels according to the IDH. These new species do not bring new combinations of traits, because their addition does not cause an increase in functional richness. Rather, it increases redundancy because more species are packed into a constant volume of functional space. This increase in redundancy causes declines in functional divergence and functional evenness. In the empirical example, functional richness does not decline because the disturbance intensity is not strong enough to cause the local extinction of species with extreme trait values. Conversely, functional divergence and evenness, by incorporating quantitative abundance data, provide an early warning signal of disturbance impacts, even though species richness is not monotonically related to disturbance intensity.



Figure I. Theoretical changes in the structure of a species community along a disturbance gradient. (a) Species (circles) are plotted in a two-dimensional functional space according to their respective trait values and circle sizes are proportional to species abundances. Arbitrarily, disturbance (light to dark green along the gradient) depletes the populations of species with the highest trait 1 values until local extinction. (b) Along this disturbance gradient, species would interact and replace each other: that is, competitive interactions and trait filtering. The theoretical relations between species richness (c), three functional diversity indices (d-f) and the disturbance level are interlaced with empirical data from ground beetle communities sampled along a gradient of flood disturbance in grasslands (Elbe River, Germany) [100]. Data were fitted using generalized linear mixed effects models for linear, quadratic, and logarithmic relations. Species richness shows a unimodal shape, functional richness has no relation with disturbance intensity. Adapted from [100].

time [57,64,66], with β measuring the amount of difference in functional trait distributions before and after disturbance. Here again, null models randomizing species abundances, occurrences or traits are necessary to test statistically the significance of dissimilarity or β -diversity values along disturbance gradients independently of changes in taxonomic composition [13,64,66].

A predictive framework

Beyond statistical tests assessing changes in functional community structure, the next challenge is to predict accurately the functional structure of communities under future disturbances. Some quantitative tools to develop such a predictive ecology are promising, such as those linking mean functional identity to disturbance based on either the three-table ordination method (called RLQ) [67] or the fourth-corner analysis [68]. The latter method has been extended to include species abundances [69] and has been successfully used to link the functional structure of communities to various types of disturbance, such as fire [70], logging [71], or flooding [72]. The linear trait-environment (LTE) method, a linear counterpart to the fourthcorner analysis, relies on multivariate linear regressions for species-site relations and has been recently used to explore the relation between bird population dynamics and climate change [73]. The partial RLQ method has been proposed to avoid confounding effects caused by covariables that may blur trait-environment correlations by partitioning environmental heterogeneity in the RLQ method [74]. With this approach, the effect of grazing on plant traits, such as leaf size, dispersal, and rhizomatous growth, has been demonstrated after removing environmental variation caused by habitats and years [74].

Given that disturbances are likely to increase in intensity and frequency in the near future, modeling tools aiming to predict the functional structure of communities will enable drastic shifts in ecosystem functioning to be anticipated. For instance, the Maximum Entropy (Max-Ent) model, using a performance filter, posits that the relative abundance of every species in a given environment is a function of their trait values [75]. The MaxEnt model was used to predict community-weighted mean trait values along a broad climatic gradient (a range of 12 °C for mean annual temperature) in upland forest communities of the southwestern USA [42]. It was found that environmental factors explained between 31% and 74% of the forest community-weighted mean trait values. This study paves the way, through strong trait–environment relations, toward a trait-based model of community assembly to better forecast shifts in species distributions in a warmer climate and associated shifts in functional community structure.

Concluding remarks

Traditionally, ecologists have explored linkages between the severity and type of disturbance and taxonomic composition of communities, with species richness, evenness, or population abundance often being the sole descriptors [61]. However, the number of species maintained by a community is the result of different combinations of factors acting at various temporal and spatial scales [76]. As a result, these community descriptors are often weak quantitative tools in monitoring studies because different processes may affect species in different ways, potentially providing no signal of disturbance [77], or even a false signal of ecosystem recovery [62]. Here, we synthesized evidence that the functional structure of ecological communities, through an analysis of their functional traits, provides a framework capable of detecting different types of disturbance. These techniques may be useful discriminators of disturbance effects even where community composition is modified only marginally [78], where traitenvironment linkages are weak [20], and where functional diversity remains stable [79]. An analysis of functional space provides a basis for detecting changes in ecosystems that is independent of taxonomic structures or total richness. It measures changes not only to the ecosystem, but also to the species involved [80] and, as such, needs to be considered in applied studies that aim to evaluate management success [81]. However, the level of competitive interactions within communities, which remains controversial along disturbance gradients [82], may blur the influence of disturbance on the functional structure of communities because, under competition, only species with dissimilar combinations of traits would coexist [83] counteracting the disturbance-based trait filtering that increases with disturbance intensity.

Most exciting of all, analyses of functional traits offer the potential for advanced warning [62] because they can detect disturbance impacts before species loss and extinctions occur (Box 3). Indeed, species abundance distributions are expected to be modified deterministically in the functional space after disturbance, with species having combinations of traits under pressure losing abundance, whereas the others may remain stable. Given that these abundance changes will occur before local extinctions, reductions in functional divergence and evenness, which both reflect abundance distributions in the functional space, will reveal disturbance impacts earlier than will functional richness (Box 3, Figure I). Ultimately, if the link between trait combinations and sensitivity to disturbance could be assessed accurately, a predictive ecology of disturbance may be developed that can anticipate which species will be depleted first [42,84]. This would also need to integrate the level of competitive interactions along a disturbance gradient [82], the knowledge of trait-mediated population dynamics, and other processes, such as the dynamic equilibrium model [85]. These kinds of result can pave the way toward predictive trait-based indictors of shifts in ecosystem functioning [86,87]. In a world where novel ecosystems, assemblages, and communities are increasingly prevalent, trait space offers clear insights into the way that ecosystems are changing and what the future may hold for the ecosystems of the world.

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Appendix A. Supplementary data

Supplementary data associated with this article can be found, in the online version, at http://dx.doi.org/10.1016/j.tree.2012.10.004.

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