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# Energy flux: The link between multitrophic biodiversity and ecosystem functioning

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#### Abstract

Relating biodiversity to ecosystem functioning in natural communities has become a paramount challenge, as links between trophic complexity and multiple ecosystem functions become increasingly apparent. Yet, there is still no generalised approach to address such complexity in biodiversity–ecosystem functioning (BEF) studies. Energy flux dynamics in ecological networks provide the theoretical underpinning of multitrophic BEF relationships. Accordingly, we propose the quantification of energy fluxes in food webs as a powerful, universal tool for understanding ecosystem functioning in multitrophic systems spanning different ecological scales. Although the concept of energy flux in food webs is not novel, its application to BEF research remains virtually untapped, providing a framework to foster new discoveries into the determinants of ecosystem functioning in complex systems.

#### Keywords

ecosystem multifunctionality; food web; interaction network; metabolic theory; trophic cascade; niche complementarity

### Biodiversity and ecosystem functioning in complex systems: challenges and prospects

Anthropogenic effects have put unprecedented pressure on earth's ecosystems [1], which provide crucial goods and services important for human wellbeing [2]. The erosion of

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biological diversity has prompted concern regarding the provisioning and stability of ecosystem services (see Glossary) [2,3], substantiated by a large body of empirical research [4,5]. While the foundation of knowledge was built by examining biodiversity effects on ecosystem functioning of single trophic levels or simple food chains [6], emerging evidence suggests that the relationship between biodiversity and the provisioning and stability of multiple services can only be understood if multiple trophic levels (e.g., [7–9]) and the interactions among them are considered [6,10]. Yet, despite growing empirical evidence of diversity effects on function in food webs, we still lack a unified theoretical framework to quantify and explain the underlying mechanisms of these findings in complex systems.

One key challenge in this frontier is the identification of a common currency for ecosystem functioning across trophic levels and ecosystem types, allowing for the analysis of multitrophic diversity–function relationships. Such an approach is also the prerequisite to link findings from highly controlled experimental tests of biodiversity–ecosystem function (BEF) theory to more complex natural landscapes [11] that are particularly relevant to humanity [12]. In this paper, we address this challenge by integrating concepts from network theory, metabolic ecology, BEF theory, and ecological stoichiometry. We propose that merging perspectives from community and ecosystem ecology by quantifying energy fluxes in food webs [13,14] can provide a powerful approach for mechanistically understanding the link between the diversity of complex multitrophic systems and both single as well as multiple ecosystem functions.

#### Food webs link biological diversity, structure, and ecosystem processes

Food-web ecology addresses how biodiversity is organised across trophic levels according to trophic interactions [13], from microscopic autotrophs to carnivorous megafauna. Research in this field has revealed the non-random structure of feeding links among species [15] and how this structure is determined and stabilised by a range of factors, such as the distribution of energy fluxes [16,17] and species traits [18–20] across interaction networks. These fundamental advances have laid the theoretical and methodological groundwork for assessing multiple aspects of ecological stability that can be captured by synthetic indices useful for policy makers and practitioners [21,22], and for investigating how the structure of complex ecological systems modulates ecosystem functioning [23].

Traditional food-web research has typically described the structure of ecological communities with qualitative feeding relationships. In contrast, quantitative networks [24] that describe fluxes of matter and energy along trophic links [25,26] can be directly associated with multiple functions that are often indicators for ecosystem services (Figure 1), and can allow for comprehensive inference of ecosystem functions that are otherwise difficult to quantify. As one example, herbivory would typically be estimated by assessing leaf damage of host plants, but this excludes any herbivory carried out by sap-feeding herbivores. By quantifying energy flux to all herbivores, however, one can fully assess total herbivory in an ecosystem based on the energetic consumption of the sampled communities. Indeed, a limitation of this approach is in its exclusion of functions driven by non-trophic interactions where energy is often not exchanged among interacting organisms (for example, the mussel-cordgrass mutualism, which has been shown to enhance drought resistance [27]).

More recently, though, studies have begun to incorporate non-trophic interactions into food webs (e.g. [28]) and investigate their role in modulating the functioning of ecological networks [29]. Nevertheless, trophic interactions underpin an extensive range of crucial ecosystem functions characterising a large proportion of total ecosystem performance (Figure 1) and have been a central tenet of ecology since Elton's pioneering work.

In addition to energy flux expressed in carbon (C) per unit area over time, one can also quantify other nutrient fluxes through networks [30,31] to assess whole-ecosystem processes such as the mineralisation of nitrogen (N) and phosphorus (P) [26,31] (Figure 1). Hence, when integrated with metabolic theory and ecological stoichiometry, food-web theory might provide mechanistic predictions of the distribution and stability of biomass, nutrients and their fluxes across populations in natural communities [26]. Accordingly, an energetic network approach provides a unique conceptual framework that mechanistically links community patterns (i.e., species richness and composition) with ecosystem ecology (the flux of energy and matter) [32] (Box 1).

Because energy flux reflects aggregate processes (e.g., primary production, herbivory), it could also be used to provide a standardised index of ecosystem 'multifunctionality.' An emerging concept in biodiversity research, multifunctionality reflects the provisioning of multiple ecosystem functions (see Glossary), although capturing this phenomenon statistically has proved historically challenging[33]. Fluxes reflect most of the functions commonly measured in biodiversity experiments, and could replace or complement these functions in future investigations. Using multitrophic flux to quantify ecosystem multifunctionality, however, ignores functions arising from non-trophic processes, such as those related to cultural ecosystem services. In such cases, aggregate indices incorporating energy flux (including multiple fluxes from different resources) and uncorrelated additional functions may prove particularly insightful [33].

#### Ecological stoichiometry and energy flux

Energy flux in ecological networks characterises the rate of energy flow among nodes, expressing energy consumption by different trophic groups and describing the energetic structure of communities (Figure 1). While this is particularly intriguing for investigating ecological dynamics and processes, researchers might also be interested in how these flows relate to the flux of specific chemical elements. Therefore, while energy flux is often directly related to C flow (as metabolic rates are typically based on organismal respiration and are thus directly related to C uptake [40]), there are techniques that allow for the conversion of energy fluxes to various other elemental fluxes, providing aa range of ecosystem processes. Furthermore, the relative availability of different elements to consumers can have important consequences for the structure of ecosystems [43], the distribution of biomass across populations [44] and the rate of energy flux to consumers [45]. Ecological stoichiometry studies the balance between nutrient requirements of consumers and nutrient availability in their food, and the consequences for the life-histories and dynamics of populations [43]. While many studies in ecological stoichiometry focus on single interactions between a consumer and its resource [46], there is growing interest in the role of stoichiometric effects

in food webs, as stoichiometry might influence the structure, function, and stability of food webs in various ways [47].

Inspired by early research in marine systems, it has been shown that, across different ecosystem types, important elemental ratios (e.g., C to N ratio) in primary producer tissue are highly conserved [48]. Because elemental ratios change along a food chain [49,50], by quantifying the C consumption of organisms (via conversion of energy flux to C consumption per unit time), it is possible to calculate rates of other elemental fluxes such as N and P among trophic nodes in networks [31]. As global element cycles are tightly linked through biotic interactions [51], they are consequently affected by associated changes in biodiversity and energy flux in ecological networks. Thus, quantifying network energy fluxes allows for the exploration of individual relationships of multiple currencies (e.g., C, N, P) of ecosystem functioning with biodiversity (Box 2).

A stoichiometric approach to quantifying energy flux is not only useful for calculating multiple currencies of elemental fluxes, but also allows for more precise quantification of energy flux rates in food webs. This is because consumers might respond differently to arising stoichiometric constraints; e.g., by lowering their production efficiency [52] or by increasing feeding rates [45]. These two responses yield different effects on rates of fluxes, interaction strengths, and, hence, stability [16]. Thus, understanding the stoichiometric composition of food webs allows for the conversion of energy fluxes in ecological networks to a range of specific elemental fluxes, as well as providing crucial information for understanding interaction strengths and rates of energy flux in ecosystems.

#### Integrating food webs, fluxes, and ecosystem functioning

Despite an increasing focus of BEF research on multitrophic systems (primarily on marine food chains [6,53,54]), there has been very little concentration on systems with high species richness and trophic complexity (Box 2). Because of this, BEF research has not yet been able to directly investigate and define the bioenergetic mechanisms underlying the relationship between biodiversity and ecosystem functioning in complex, multitrophic systems [32]. Yet, studies that establish whether and how complex network structure determines ecosystem functioning have been repeatedly called for in recent years [6,10,23,32]. While not necessarily touted in the context of BEF research, food-web studies quantifying energy flux among trophic nodes have already begun to answer this call (e.g., [16,17]). To demonstrate the ease with which existing experimental designs can incorporate energy fluxes, we provide a worked example (Box 2; data and code available in the Online Supplementary Material).

BEF experiments have identified general mechanisms underlying the relationship between biodiversity and ecosystem functioning in simplified systems (e.g., selection and complementarity) [12] that are directly transposable to energy fluxes in a multitrophic context (Box 2). For example, niche complementarity (or trophic complementarity [55]) can be an important mechanism driving ecosystem functioning in food webs, in which greater consumer diversity reduces competition over resources, thus increasing total energy flux to consumers [55,56]. Alternatively, selection effects, whereby species of unique functional

importance come to dominate species mixtures, might also modulate the diversity-function relationship in food webs [57]. Extending beyond the framework of BEF, total energy flux can also depend on network complexity (e.g., species diversity or links per species [58]) due to increased exploitation of additional energy stocks [59,60]; an emergent property of networks that can be independent of total system biomass [61]. In a similar vein, one aspect of network theory that has received considerable attention is that of 'keystone' effects, caused by species that have disproportionate effects on the persistence of other species [13]. This 'keystone' concept can be extended to understand the relationship between diversity and keystone effects on energy fluxes in networks.

Another advantage of integrating network energy fluxes into BEF research is the knowledge that can be gained from patterns in food web stability and resilience and, thus, the stability of ecosystem functions. Network topology, for example, can provide an indication of functional redundancy, whereby food webs with more generalists (consuming energy from multiple stocks) might have a lower likelihood of complete functional losses as other species can replace their functional counterparts [56]. The distribution of energy fluxes (which also infer interaction strengths) is also important for determining stability of networks; trophic loops that contain weak links [17], as well as energetically bottom-heavy food-web structure where energy fluxes are larger at lower compared to higher trophic levels [62], can confer greater stability to food webs. These aforementioned mechanisms that modulate ecosystem functioning and stability depend, at least in part, on biodiversity in ecological networks, supporting our proposal that an understanding of these mechanisms can be advanced by focusing on complex multitrophic systems through the lens of energy fluxes in food webs.

## Promising directions for integrating network energy fluxes into BEF research

#### Linking food web stability and ecosystem function

Food-web research has a long-standing history in tackling the problem of stability [68,69], initiated and sustained by the question of how diversity and complexity of interaction networks affect their stability [70]. While random interaction networks are intrinsically destabilised by the diversity and complexity of a community, natural food webs are stabilised by non-random patterns in their (i) network structure [71], (ii) distribution of interaction strengths across links [16,17,39,72] and body-mass structure [18,73], as well as (iii) adaptive feeding processes [20]. A range of metrics have been developed and employed to assess the stability of ecological networks [e.g., 74–76] Discrepancy between these metrics has been treated by comparing different metrics within studies [18] or developing multi-stability indices [22]. Thus, several decades of research on ecological stability have provided mechanistic insights into the structure and dynamics of communities, as well as a set of well-developed methods to investigate ecological stability.

Applying a multitrophic energy flux approach to BEF research opens the possibility to measure the stability of multiple functions in complex systems. Similar to the aforementioned food-web approaches, estimation of certain aspects of stability such as temporal variability of fluxes between pairs of populations, between functional groups (e.g.,

herbivory as the flux from plants to herbivores), or throughout entire communities is possible within this framework. Empirically, the calculation of energy fluxes has unravelled the stability constraints imposed by network structure [17] and community assembly [78]. More recently, models of multitrophic communities have been used to predict changes in energy fluxes following changes in consumer species diversity [59]. While such studies have quantified time-averaged fluxes as measurements of ecosystem functioning, analyses of temporal variation in fluxes have not yet been investigated. Further exploration in this direction could stimulate entirely new research questions targeting the relationships between the stability of biomass stocks (at the population, feeding guild, or community level) and the temporal stability of the fluxes between these stocks.

#### Understanding species identity effects on ecosystem performance

Human-driven biodiversity change is the combined net effect of local or global species extinctions, changes in species composition and realised interactions, as well as introductions of exotic species. Pursuant to its original theoretical motivations, early BEF research concentrated on the consequences of random species loss [2,79]. While changes in species diversity, itself, can influence ecosystem functioning, the directional or non-random loss (or gain) of particular species can have disproportionate effects on ecosystem properties [57,80]. Such effects often occur as a result of species' interactions that initiate cascading effects through multitrophic systems following the loss or gain of 'keystone species' [13].

One potentially exciting avenue of research would be to extend this concept to understand how strongly interacting species affect energy flux to other populations in complex food webs. For example, the loss of a predator could result in increased herbivory and reduced producer biomass (due to predatory release), destabilisation of herbivore populations (due to increased top-down pressure on producers), and thus destabilisation of remaining predator species (due to increased bottom-up forces on predators). In modelled food webs in which interaction strengths are defined by energy fluxes, keystone species could be identified based on their aggregate effects on energy fluxes across the network. While this application of the keystone species concept contradicts the classic demonstration that demographic and biomass responses best capture keystone effects [13], adapting this concept to per capita (or mass-specific) energy fluxes might provide new insights into diversity-function relationships and how these might depart from diversity-community structure relationships characterized by abundance. Further tests could involve shifting population structure, such as population density or body size distributions; both of which can have important impacts on ecosystem functioning [69].

Following the functional trait approach to BEF work, similar empirical approaches could experimentally remove or introduce species based specifically on functional traits related to energy flux that are predicted to play a central role for ecosystem functioning. Total and per capita energy fluxes can be calculated for these empirical food webs, before and after experimental manipulation, and compared to food webs where species are lost or gained at random. Such experiments could disentangle the importance of extinction and invasion of keystone species for ecosystem functioning, relative to changes in species diversity *per se*. Beyond identifying keystone effects on ecosystem functioning, model simulations based on

results from experimental manipulations of food webs could also focus on identifying species combinations that maximise whole-network energy fluxes to ascertain at which point multitrophic systems will reach peak performance.

#### Cross-ecosystem processes and the spatial scaling of multitrophic ecosystem functioning

Perhaps one of the greatest challenges for operationalising BEF theory in "real world" ecosystems, beyond the carefully controlled experimental conditions used to test hypotheses, is to scale up from plot-level manipulations of communities with relatively low diversity and trophic complexity to highly complex, landscape-scale systems that span multiple habitats [12]. Unlike many other often-measured functions (such as standing-stock biomass), energy flux is not spatially restricted but, instead, mechanistically characterises functions that link populations and communities in space (e.g., via movement or cross-ecosystem interactions and subsidies) [81,82] (Figure 1), allowing for cross-ecosystem predictions of ecosystem functioning [83].

In multitrophic systems, organism mobility (or habitat use) typically increases with body size and trophic level [84], leading to energy export across ecosystem boundaries that is dependent on both body size and trophic structure of communities. In addition, multitrophic systems are open to neighbouring systems via trophic interactions [81], further contributing to outflow of energy (or spillover). Global change drivers, such as habitat fragmentation and climate change, can further influence home range size [85] and dispersal [86], leading to important, scale-dependent impacts on energy flux in ecosystems subjected to various drivers of environmental change.

For a given ecosystem (e.g., a grassland patch of known size), Equation 1 (Box 1) could be modified to account for home range size and across-system energy loss by: (i) including an additional loss term that parameterises the outflow of energy due to, e.g., the body size-dependent emigration from a consumer node, and (ii) reducing energy loss to consumers, L, from Equation 1 (assuming increasing home-range size—scaled by body size—reduces the impact of a consumer on a given resource node). Within this framework, future models can be developed to integrate organism mobility and home range size into energy flux calculations and incorporate permeability properties of system boundaries in several dimensions.

#### Concluding remarks

For the last two decades, intensive efforts have cemented the central role that biodiversity plays in determining ecosystem functioning. Though the central motivation of BEF experiments was to establish the importance of biodiversity for the integrated performance of ecosystems, trophic complexity has been frequently excluded from many of these studies. Furthermore, the majority of BEF studies (both experimental and observational) have focused on standing-stock biomass, rather than measuring fluxes of material and energy [87]. These limitations have been pointed out repeatedly, with calls for the incorporation of multitrophic complexity, as well as the quantification of rates and fluxes to increase realism and, thus, the applicability of BEF theory to natural systems [11,88].

In this review, we have outlined the importance of integrating a network perspective into BEF research. Unlike previous such syntheses, however, we provide an applied framework based on ecosystem energetics within which ecologists can approach the question of how biodiversity determines ecosystem functioning in complex, multitrophic systems. By synthesising past work that has contributed toward this research frontier, we provide examples of how the quantification of energy fluxes in ecological networks opens new avenues of BEF research, expanding previous boundaries of ecological scale, complexity, and context. The application of energy fluxes in ecological networks to BEF research is, however, only a small part of the utility of this framework. In a broader context, energy fluxes can be used to understand the impacts of a vast range of drivers of environmental change (e.g., climate change, species invasions, N deposition, etc.) in highly diverse systems spanning many trophic levels. Thus, by embracing ecosystem complexity through the expression of ecosystem functioning as energy flux in ecological networks, we improve our ability to understand whether and how natural systems will persist and continue to provide multiple ecosystem services in a changing world.

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#### Box 1

#### Quantifying energy flux in ecological networks

Various methods exist to quantify energy fluxes in networks. These methods mainly differ in: i) their approach (theoretical *vs.* empirical), ii) the level of organization from which parameters are obtained and applied (individuals, species, or aggregated feeding guilds such as herbivores or predators), and iii) the assumptions on which they are based (e.g., steady-state systems, closed systems). Examples include a 'production-consumption' approach by Reuman & Cohen [25], and Ecological Network Analysis (ENA), which can be performed in the Ecopath and Ecosim software [34] and more recently has been built into the R package 'enaR'[35].

A third method, namely the 'food web energetics' approach, uses measured biomass stocks, energetic expenditure, and ecological efficiencies to calculate energy flux between network nodes [30,31,36]. Assuming system equilibrium, energy fluxes among nodes are calculated by balancing energetic demands of biomass stocks with energy outflow. Food-web nodes can be aggregated at different organisational levels (i.e., individuals, species, or general feeding guilds), and strengths of links assigned according to consumer feeding preferences (i.e., the proportional likelihood of feeding on different resources) [26,36]. To test the accuracy of this approach, a previous study compared observed versus inferred fluxes in empirical networks and demonstrated that inferred and observed values closely resemble each other [37]. More recently, this approach has been adapted to incorporate individual-level metabolic demands into network nodes [38] (Figure I), thus better accounting for community composition (i.e., taxonomy, body size structure, and trophic topology) and temperature effects [39] (due to the temperature dependence of metabolism [40,41] and assimilation efficiency [42]). In the adapted 'food web energetics' approach, energy flux *F* to each consumer node is calculated using Equation 1:

$$F = \frac{1}{e} \cdot (X + L)$$
 (Equation 1)

where e is the diet-specific assimilation efficiency, X is the summed metabolic demands of individuals in a consumer node, and L is the loss of energy to higher trophic levels via consumption (e.g., predation or herbivory). The process by which energy flux is calculated using the 'food web energetics' approach is practically very straightforward (Figure I), and is therefore an ideal tool for both empirical and theoretical ecologists to robustly quantify energy fluxes in multitrophic systems using readily obtainable data (see Online Supplementary Material S1 and Supplementary Data S1 for a worked example).



#### Figure I.

Using the 'food web energetics' approach, energy flux is quantified following six general steps: For a given community, individual body masses are assigned (Step 1) and used to calculate individual metabolic rates. This can be done using body mass-metabolic rate regressions available from the literature for many taxonomic groups. Alternatively, metabolic rates can be directly measured for study organisms. (Step 2). Network topology is then constructed and feeding preferences defined, either through experimentation or via literature review (Step 3), followed by the calculation of metabolic demands of each node (Step 4) by summing all individual metabolic rates of the respective group. Assimilation efficiencies are assigned (Step 5) based on the resource of a consumer, which can be measured, derived from existing literature for specific consumer types or temperatures (e.g., [31,42]), or scaled depending on resource stoichiometry if e.g. C/N content is measured for organisms in the food web (e.g., [45]). Single fluxes throughout the network are then calculated, starting from the highest trophic level and working to the bottom (Step 6). See Online Supplementary Material S1 for a worked example.

#### Box 2

#### Unifying classical BEF theory with the energetic network concept

Over the last two decades, >600 experiments have attempted to isolate the independent effects of changing biodiversity on ecosystem processes. Most of these experiments were designed to test the central theoretical hypothesis that a diverse mixture would perform differently than predicted based on the mean or maximum monoculture [63]. The typical design contained at least: (i) a diverse mixture comprising species from a local species pool, and, (ii) each constituent species in monoculture. Starting biomass (or density) is equalised among treatments, such that the most diverse mixture has the same total biomass (or density) as corresponding single-species treatments [63]. Under this design, a diversity effect is observed if ecosystem functioning (such as biomass yield) in the mixture deviates positively from the null expectation; i.e., the averaged function of each monoculture (Figure II A).

Early multitrophic BEF experiments tested hypotheses about whether the core BEF relationship within a trophic level varied with food chain length (e.g., [64]), or how diversity at one trophic level affected performance at an adjacent level (e.g., [65,66]). These pioneering studies revealed that diversity effects differed from the null expectation because of, for example, variation in foraging behaviour or intra-guild predation [67]. Such experiments continued to test and expand the basic BEF theoretical framework, grounded in mechanisms of selection and complementarity. However, these mechanisms have not been extended to questions about network complexity and ecosystem function, likely due to logistical constraints of quantifying ecosystem functioning for complex food webs.

Under a network approach, classical BEF hypotheses could be tested by comparing energy fluxes to species in monoculture with multi-species mixtures (Figure II B). This allows for the quantification of diversity effects via manipulation of diversity at one trophic level to create a diversity gradient across networks (e.g., manipulating producer diversity within the same node across multiple identical networks). One can then extract information on node diversity from each replicated network and regress corresponding fluxes on selected diversity variables (Figure II B) to test the hypothesis that node diversity, as a measure of network diversity, affects net ecosystem fluxes. This framework can be further extended to multiple nodes of differing diversity across structurally identical networks, or multiple networks of increasing trophic complexity [10] (Figure III).

To demonstrate the applicability of these methods, we reanalyse a multitrophic BEF experiment that manipulated nine species of estuarine consumers, including fishes, crabs, shrimps and other epifaunal invertebrates [53]. Using reproducible R code (provided in the Online Supplementary Material), we computed energy flux in each replicate of varying diversity (1, 3, 6, or 9 species) and regressed these values against diversity. As in the previous analysis of single functions [53], increasing diversity enhanced multitrophic flux, both within and across trophic levels (Figure II C). This example should convey that quantifying energy flux in multitrophic systems does not require substantially different

experimental designs; indeed, they can be applied without much additional effort to existing BEF experiments.



#### Figure II.

Definition of a 'true' diversity effect in classical BEF experiments (A), with the translation of how one would conceptualise such an effect in ecological networks using energy flux (B). The double-headed arrow in (A) indicates the magnitude of the diversity effect on yield in a hypothetical three-species mixture. In (B), orange nodes denote three hypothetical species consuming a heterogeneous resource (consumption is indicated by coloured segments), with a complementarity effect on total energy flux depicted for the three-species mixture (all resources consumed simultaneously).



#### Figure III.

Different measures of diversity obtained from the network (A) can be directly related to individual energy fluxes for specific functions, or to summed network fluxes to infer ecosystem multifunctionality (B). Line colours in (B) correspond to individual functions depicted in (A), with network multifunctionality indicated by these summed fluxes as 'multitrophic flux' in (B).

#### Glossary

Assimilation efficiency: Proportion of total energy ingested by a consumer that is invested into biomass production, reproduction, and respiration, excluding material excreted as waste.

**Ecosystem multifunctionality:** A measure of the simultaneous provisioning of multiple ecosystem functions.

**Ecosystem service:** An ecosystem function that either directly or indirectly benefits humankind.

**Food web:** An interaction network describing trophic (feeding) interactions among organisms in ecological communities.

**Network node:** Resource or consumer entity in a food web that stores and/or consumes energy. The level of aggregation of a node (e.g., individual, population, functional feeding guild) is defined by the investigator and should be relevant to the research question.

**Network topology:** The distribution of interactions among nodes in a network. This can be derived from qualitative links known to exist among particular nodes and can also incorporate weighted links based on interaction strengths.

**Trophic complementarity:** The degree to which species specialise on different resources in the same location or on the same resources at different times, allowing for greater resource exploitation.

**Trophic link:** Unidirectional feeding interaction between two food web nodes. In qualitative food webs, links describe the presence of interactions, while in quantitative food webs, the strength of this interaction is described.



## **Figure 1. Energy fluxes and their relation to ecosystem services across ecosystems.** Arrows denote the directional flux of energy among functional feeding guilds, indicating how these fluxes permeate ecosystem boundaries (such as terrestrial above and below

ground, freshwater, and marine systems as shown here). All energy fluxes in ecosystems are analogous to respective ecosystem functions, many of which can be directly translated to services that are beneficial to human wellbeing, as indicated by numbered examples. Soil cross-section image courtesy of Julia Siebert.