

A network perspective for sustainable agroecosystems

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Trends in Plant Science

A network perspective for nature-based agroecosystem management

--Manuscript Draft--

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22 November 2021

Dear Dr. Susanne Brink,

Thank you for commissioning our manuscript titled "*A network perspective for nature-based agroecosystem management*" as an Opinion article for Trends in Plant Science. We are pleased to now submit the complete manuscript for review.

As you know, plant-based agroecosystems support many of Nature's Contributions to People and are increasingly challenged to meet sustainability goals in the face of global change. Increasing biodiversity through nature-based management (e.g. crop diversity, companion plantings, pollinator supplementation, biological control) presents a promising path towards sustainable agroecosystem production, but its efficacy to date has been variable. The reasons for this variable efficacy are not systematically understood, although the complex networks of species interactions that underpin nature-based management are likely a major source.

In this article, we argue that nature-based agroecosystem management can be significantly improved by considering the underlying networks of species interactions that affect and explain ecosystem functioning and stability, and which can be manipulated through the addition or removal of different species or genotypes. Tools now exist to predict species' roles and interaction network structure based on functional traits, integrate multiple types of species interaction, and predict indirect effects across spatial and temporal scales. Thus, we have a growing understanding of the levers with which species interactions and ecosystem functioning can be manipulated, and applying these tools to nature-based management of agroecosystems could help address the urgent need for sustainable food production. We aim to stimulate research that will lead to improved design of nature-based management in agroecosystems, and believe that this manuscript will be of interest to agroecosystem ecology researchers, policy makers, and practitioners.

The manuscript was conceptualised during a two-day workshop over 13-14 April 2021. Should it ultimately be accepted, we would like to request permission to include all workshop participants as authors. Our team brings together leading experts with theoretical and applied knowledge in agroecology, interaction networks, biological invasions, below- and aboveground mutualisms, and functional trait ecology, and all authors made valuable contributions.

We thank you for your time and consideration of our manuscript.

Sincerely,

Dr. Warwick Allen and co-authors

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[Click here to view linked References](https://www.editorialmanager.com/plants/viewRCResults.aspx?pdf=1&docID=5043&rev=0&fileID=118823&msid=fc4723cc-7620-4151-b125-253b742fff11)

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Abstract

 Nature-based management promises to improve sustainable agroecosystem production, but its efficacy has been variable. Here we argue that nature-based agroecosystem management could be significantly improved by explicitly considering and manipulating the underlying networks of species interactions. A network perspective can link species interactions to ecosystem functioning and stability, identify influential species and interactions, and suggest optimal management approaches. Recent advances in predicting species' network roles from functional traits create opportunities for the direct manipulation of network architecture through targeted species additions or removals. Combined with improved understanding of the structure and dynamics of networks across interaction types (including social-ecological) and spatial and temporal scales, applying these tools to nature-based management can contribute to sustainable agroecosystems.

 Keywords: ecological intensification; ecosystem functioning; functional traits; stability; species interactions; sustainability

The challenge of sustainable agroecosystems

 Over 40% of global land area has now been converted to **agroecosystems** (see Glossary 63 for definitions of keywords)¹, which supports many of **Nature's Contributions to People** (NCP)². At the same time, the management of agroecosystems is increasingly required to deliver **sustainability** goals while maintaining production, economic viability and social license to operate. Agroecosystems are further faced with the effects of global change, 67 including pest, pathogen, and weed invasions³, pollinator declines⁴, and climate change⁵.

 Increasing biodiversity through **nature-based management** presents a promising path 69 towards sustainable production in agroecosystems⁶. Approaches and policy goals include high crop diversity (e.g. genetic diversity, intercropping, or crop rotation), restoration of non-crop diversity with set-aside land and companion plantings (e.g. flower strips, beetle banks, in-field trees, or conservation headlands), and targeted introductions of biological control agents, 73 pollinators, dung beetles, soil biota, and endophytes⁶. Yet simply manipulating diversity *per se* is a blunt instrument that has seen mixed success as a proxy for increasing the range and effect 75 of species interactions^{7,8}. Instead, the power of any nature-based management approach relies on our ability to effectively predict and manipulate underlying species interactions. However, relatively few studies to date have explicitly considered the complex **species interaction networks** that underpin nature-based management and their potential contributions to **ecosystem functioning**, **stability**, and NCP provision.

 In this article, we argue that the efficacy of nature-based agroecosystem management can be significantly improved by considering and manipulating the underlying networks of species interactions through the addition or removal of species or genotypes to promote direct or indirect interactions that benefit the crop. We outline how a network perspective reveals the functional roles of species (e.g. contributions to pollination, predation, resource acquisition) and can mechanistically link network properties with ecosystem functioning and stability. We

 then describe how recent advances in our understanding of species interaction networks have opened a toolbox with which to better predict the impacts of global change and management, and improve stakeholder communication within the broader social landscape.

Network properties indicate ecosystem functioning and stability

 Agroecosystems comprise networks of **mutualistic** and **antagonistic** species interactions (Fig. 1), with the importance of each type of network depending on agroecosystem type and management. Species interaction networks can be studied from the perspective of individual nodes (e.g. species, genotypes, or individuals), **motifs**, networks of one interaction 95 type, or **multi-interaction networks**⁹. The use of networks as a research tool has enhanced our understanding of ecological and evolutionary processes that shape communities, how energy 97 flows through ecosystems, and the supply of NCP^{9-11} .

 Agroecosystem functions (e.g. pollination, nutrient provisioning, biological control) are 99 mediated by both the diversity and strength of species interactions¹². For instance, ecosystem functioning should increase when competing species partition interaction partners, described 101 in both communities and networks as '**complementarity**¹³. Greater complementarity is 102 correlated with increased community-level pollination¹⁴ and natural enemy attack rates¹⁵ (Fig. 2A). Other network-level metrics could also be related to agroecosystem functioning, such as high network **connectance**, which could reduce mutualist quality for crop species via 105 competition for mutualists or cross-pollination¹⁶ (but see Tylianakis and Morris 2017¹⁰ for limitations to this metric). In antagonistic networks, the potential for indirect interactions like **apparent competition** (e.g. pathogen spillover) should increase with high connectance and low **modularity** (Fig. 2C). This may lead to adverse outcomes in agroecosystems where weeds, wild plants, or companion plantings host generalist pathogens or pests that also affect the $\,$ $\,$ \rm{cop}^{17} . Conversely, apparent competition between pest species can be beneficial, particularly 111 where crop and non-crop habitats hold similar communities¹⁸, but not all non-crop habitats 112 provide pest control services¹⁹. Thus, the effect of different network properties in 113 agroecosystems depends on the type of interaction and extent of species sharing.

114 Because species contribute unequally to ecosystem function and stability, metrics for 115 species within the network also link with functioning and productivity. For example, **generalist** 116 plants with high **centrality** in plant-pollinator networks attract a higher diversity and 117 abundance of pollinators²⁰, meaning that highly central crops produce more and heavier s_{seeds}^{21} . Moreover, these benefits are greatest when the generalist crop's interaction partners are **specialists**, a characteristic structure of mutualistic networks known as **nestedness**²² (Fig. 120 2B). Invasive plant species can play disproportionate roles in pathogen and pest outbreaks, 121 often serving as **network hubs**²³. Managing plants with generalist pathogen interactions may 122 therefore prevent unwanted apparent competition with crops.

123 Ensuring stability of agroecosystems is another major challenge, especially in the face 124 of accelerating global change. Mutualistic networks with higher nestedness and connectance 125 tend to be more stable^{24,25} with greater **functional redundancy**, meaning species loss is less 126 likely to result in collapse, yielding high spatial and temporal consistency²². In antagonistic 127 networks, highly connected and less modular networks containing generalist pathogens and herbivores can be less stable²⁴, but there is also evidence for stabilizing effects of connectance, 129 depending on the measure of stability (e.g. robustness, vulnerability, resilience)²⁶. Species may 130 also differ in their contributions to stability within a network. For example, species providing 131 NCP in salt marsh food webs did not generally play a stabilizing role, whereas species that 132 support NCP through their interactions were critical to the stability of both food webs and $NCP²⁷$. Examining agroecosystem networks in a similar fashion could identify species that 134 contribute strongly to stability as well as multiple functions and NCP.

 Finally, interaction network structure can also affect ecosystem resistance to or recovery from invasions. Several theoretical and empirical studies have linked the success of 137 invading species to the interaction network structure of recipient ecosystems³, which can 138 bredict invader impacts²⁸. For example, invasion success of an agricultural plant pathogen (*Ralstonia solanacearum*) declined where rhizosphere bacteria competition networks had low nestedness and high connectance²⁹. Generalist pathogens or plants that associate broadly with 141 mutualists may be more likely to invade networks³⁰. Furthermore, high modularity and low 142 connectance should limit the spread of invasion impacts through ecosystem networks.

Incorporating interaction networks into the design of agroecosystems

145 Agroecosystems can be surprisingly diverse³², affording scope to manipulate biodiversity through species additions or removals to optimise species interactions and benefit sustainable production. Network manipulations could be informed by research that has approached this challenge from the opposite direction - elucidating the mechanisms (including species additions or losses) that underpinned observed changes in networks under changing 150 environmental conditions¹⁰. Thus, we argue that species' traits, the network type (including social-ecological) being manipulated, and spatio-temporal scale can inform which species or genotypes to add to or remove from agroecosystems to promote desired NCP.

Linking functional traits with ecological interaction networks

 Species- and genotype-level traits, functional groups and community trait abundance distributions can be manipulated to enhance functioning and stability in an agroecosystem network³³ . **Functional traits** reflect an organism's response to its environment (i.e. response traits) and/or its contribution to an ecological function (i.e. effect traits)³⁴. Which species prevail following agroecosystem intensification will depend on their response traits, while functioning and NCP provision will depend on effect traits.

 In addition to directly influencing ecosystem functioning and environmental responses, species' traits are an important driver of interactions^{35,36} and their functional consequences³⁷, such that species interactions provide an additional pathway through which traits influence ecosystem functioning. Therefore, building response trait diversity and effect trait redundancy into agroecosystem mutualist networks (e.g. via floral traits enhancing generalist pollinator 166 visits) may increase stability following environmental perturbations³⁷ because key interactions are retained, even if species losses occur. The extent to which such knowledge can be used to manipulate agroecosystem networks hinges on the predictive utility of traits. Tools exist to 169 predict both species' network roles and whole-network properties using functional traits $35,38$, and to predict indirect effects of species, such as biological control agents, before their 171 introduction³⁹. However, interactions involving generalists and exotic species tend to be predicted poorly by traits⁴⁰, and are instead better explained by species' relative abundances⁴¹. Therefore, agroecosystem design should consider how both species' functional traits and relative abundances influence interaction network structure.

 Specialist species have the most distinct traits, and thereby contribute most to functional diversity³⁶, suggesting that both functional diversity and interaction complementarity could be maximised by introducing specialists. Since partner specialisation relates directly or indirectly to many network structural properties (e.g. nestedness, connectance, modularity) and the 179 community assembly processes that generate them⁴², multiple aspects of agroecosystem network structure can be modified through the introduction, retention, or removal of specialists or generalists, which often have traits that are, respectively, far from or close to the community α average³⁶.

Multi-interaction networks in agroecosystems

 The simultaneous consideration of multiple types of species interaction networks is essential to maximise benefits of nature-based management by identifying synergies and trade- offs between network types. For example, flower strips should increase pollination and pest 188 control, but could also create pest and pathogen reservoirs (Fig. $2C$)¹⁷. These multi-interaction impacts may be predicted by functional traits, like the floral area of candidate species for 190 companion plantings⁴³. Knowledge of multi-interaction networks could further improve these predictions by considering traits and effects across a range of interaction types to select species that optimise crop benefits and avoid trade-offs.

Research into the interplay between different network types has been growing rapidly⁴⁴⁻ 47 , including the development of analytical tools to unify multiple interaction networks into a 195 single framework $48,49$. These approaches could be incorporated into agroecosystem management. For example, a recent study that combined mutualistic and antagonistic networks from Spanish olive (*Olea europaea*) farms found that low agrochemical use promoted beneficial plant-pollinator and prey-predator/parasitoid motifs, whereas intensive agriculture favoured generalist and intraguild predation interactions, which may inhibit agroecosystem services⁵⁰. The same approach of dissecting multi-interaction networks into motifs could be applied to examine the impacts of global change threats or nature-based management in agroecosystems. Other benefits of a multi-interaction approach include the integration and analysis of social-ecological networks (Box 1).

 Species' multi-trophic effects should be carefully considered in agroecosystem design because species can link co-occurring interaction networks of different types. For example, an abundant generalist plant may act as a network hub and connector across multiple networks by 207 interacting with both generalist insect pollinators and generalist herbivore species⁴⁶. The addition of generalist hub or connector species may promote agroecosystem stability and

209 function through the maintenance of a variety of interactions. However, Pocock et al. $(2012)^{44}$ found that while stability of individual agroecosystem networks varied in response to species loss, effects did not propagate across the different networks. Thus, the potential to achieve net benefits by manipulating subnetworks independently will depend on the extent to which a species has a similar impact on all its interaction partners. Fortunately, plants that share 214 mutualists do not necessarily share herbivores⁴⁵, suggesting that interaction complementarity could be optimised for beneficial interactions without exacerbating harmful ones (Fig. 2C). Understanding species' network roles in a multitrophic context is therefore important for 217 identifying species with disproportionate effects on biodiversity, functioning, or NCP, thereby underpinning new strategies towards stable and sustainable production in agroecosystems.

Agroecosystem networks across spatial scales

 Nature-based management is often focused at the field scale, yet targeted species manipulation could create spillover effects between habitats within a landscape. For example, where hosts in neighbouring habitats share parasitoids, host abundance is coupled across spatial 224 boundaries via the shared parasitoids (apparent competition)¹⁸. The magnitude of spillover effects on interaction networks depends partially on habitat permeability. Cross-habitat 226 pollinator movement, for example, can be altered by boundary effects, barrier effects⁵¹, and 227 dilution by adjacent land covers⁵². Designing landscapes that facilitate desirable and restrict 228 undesirable cross-network flows must account for spatial configuration of habitat patches⁵³. Furthermore, describing interaction networks in neighbouring agroecosystems could help 230 identify habitat-connecting species⁴⁶, which are most likely to support stability⁵⁴. Future studies may be able to use networks to identify organisms that disproportionately contribute to 232 bidirectional resource flow⁵⁵ between different crops or management types, and to evaluate the feasibility of independent management of agroecosystems across the landscape.

Evolution within agroecosystem interaction networks

 Evolution influences nature-based management in two key ways. First, pest or pathogen 237 impact can be exacerbated by their evolutionary responses to chemical⁵⁶ or biological⁵⁷ control. However, evolutionary responses to a single pressure can be diluted or traded off when a species experiences multiple pressures. Thus, natural enemies can delay the evolution of pest 240 resistance to Bt crops⁵⁸ and multiple parasitoid species can slow the evolution of host resistance to parasitism⁵⁷ (Fig. 2D). In this sense, properties of interaction networks (e.g. natural enemy redundancy) can have evolutionary impacts, alongside the ecological impacts discussed above. Moreover, a species' population size influences its evolutionary potential, such that the impact of enemies on pest population size influences the evolution of pest resistance to enemies. These 245 eco-evolutionary feedbacks can be manipulated through harvest management⁵⁹. Tools now 246 exist that can incorporate eco-evolutionary feedbacks into interaction network analysis^{60,61}, and these adaptive network models may help to develop a predictive understanding of how species manipulations affect agroecosystem network structures over evolutionary timescales.

 Second, environmental changes can affect a large range of species interactions and although crop plants typically are not evolving *in situ* themselves, their mutualists and enemies both undergo natural selection in response to the environment. This selection can influence 252 interaction network structure⁶² and interactions with enemies can influence the fitness response 253 of plants⁶³ and pests⁶⁴ to environmental changes, such that network architecture can both influence and respond to evolutionary processes. Maximising evolutionary plasticity of beneficial species is therefore essential to accommodate ongoing ecosystem perturbations, both biotic and abiotic. This could be manipulated by ensuring that any species introduced to the agroecosystem (e.g. biological control agents) is sourced from diverse geographical and ecoclimatic conditions.

Concluding remarks and future perspectives

 Agroecosystems are made up of multiple, complex networks of species interactions, with cross-network flows within habitats and across the wider landscape. Because agroecosystems consist of relatively few crop species, network approaches may be most impactful if they focus on species' roles within the network and motifs that include the focal crop. For example, the introduction of specialists can improve complementarity, functioning and some aspects of stability, whereas generalists will promote redundancy and stability across multiple interaction networks and landscape-scale networks.

 With the increasing availability of molecular data, and continued theoretical and analytical advances, we now have the tools needed to apply a network perspective to nature- based management of agroecosystems. For example, functional traits can predict species' roles and their direct and indirect interactions, allowing for influential species to be identified and added or removed from the agroecosystem. Furthermore, understanding how networks join different interactions or habitats together can improve functioning and stability at multiple spatial scales, and adaptive network models show promise to incorporate eco-evolutionary changes. Future research should explore agroecosystem networks from plant to landscape scales, integrating ecological and social sub-networks. This would serve to quantify the impacts of nature-based management on agroecosystem interaction networks, clarify mechanisms through which these impacts can be predicted and optimised, and parameterise adaptive eco-evolutionary network models (see Outstanding Questions). Ultimately, applying these tools can predict the short- and long-term impacts of intentional or accidental species additions and removals (i.e. nature-based management) on ecosystem functioning, stability, and NCP provision, from the plant to landscape scale.

Glossary

 Agroecosystem: ecological systems modified to produce food, fibre, fuel and other products for human consumption and processing (e.g. intensive and extensive pastures, orchards, vineyards, forestry, etc.), and with strong interactions between ecological processes and management.

 Antagonistic: an interaction between two organisms that benefits one to the detriment of the other (e.g. plant-herbivore, plant-pathogen and prey-enemy interactions).

 Apparent competition: indirect negative interaction between two or more organisms which is mediated by changes in the population or behaviour of shared natural enemies, including pathogen spillover/spillback.

 Centrality: a set of network metrics (e.g. closeness centrality and betweenness centrality) that reflect the extent to which one node is directly connected to other nodes.

 Complementarity: the degree to which nodes in a given network partition resources or interaction partners.

 Connectance: the proportion of possible links between nodes that are realised, which describes the structural complexity of the interaction network.

Ecosystem functioning: the collective life activities of plants, animals, and microbes and their

effects on the biotic and abiotic processes that sustain an (agro)ecosystem.

Functional redundancy: when multiple species share similar ecological functions, such that

the loss of one species would not impact overall ecosystem functioning.

 Functional traits: morpho-physio-phenological traits that determine species' effects on processes and their responses to the environment.

 Generalist: an organism that interacts with many others in the community often across a broad taxonomic range.

Modularity: a network characteristic where interactions are primarily within subgroups (or

compartments) rather than across the broader network.

Motifs: recurrent patterns of interactions within and across networks.

Multi-interaction network: networks combining different species interaction types.

Mutualistic: an interaction between two organisms where both benefit (e.g. plant-pollinator,

plant-mycorrhiza, plant-rhizobia).

Nestedness: network characteristic where specialists tend to interact with generalists, while

generalists interact with both generalists and specialists.

Network hub: a generalist node with high centrality in the network.

Nature-based management: using specific components of biodiversity to complement or

 replace artificial inputs and increase agricultural productivity (also known as ecological intensification). Practices include increasing crop diversity, set-aside land and companion plantings, active soil management, and biotic introductions.

 Nature's Contributions to People (NCP): all the contributions, both positive and negative, of living nature to quality of life for people. Beneficial contributions include food production, climate mitigation, and nutrient cycling, whereas harmful contributions include zoonotic disease transmission and pest and pathogen outbreaks.

 Specialist: an organism that interacts with few other organisms in the community, often within a restricted taxonomic range.

 Species interactions network: a graphical representation of the biotic interactions in an ecosystem, where nodes (e.g. species, genotypes, or individuals) are connected by links (e.g. pairwise interactions) that can range from mutualistic to antagonistic.

 Stability: the capacity to resist and recover from perturbation to provide temporal and spatial constancy of agroecosystem outputs. We use this term in a broad sense to incorporate other more specific terms such as vulnerability, robustness, and resilience.

- **Sustainability:** the ability to maintain agroecosystem outputs while avoiding the depletion of
- natural, social, and economic resources.

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470 **Box 1 References**

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 Figure 1. Generalised schematic of important species-interaction networks in different types of agroecosystems and neighbouring habitat. Networks shown include the interactions of focal crop plants and/or livestock (highlighted with black outlines) with different types of interaction partners (each here represented by a single characteristic species): weeds, mycorrhizal fungi, N-fixing bacteria, pollinators, pathogens, and herbivores, as well as second- tier interactions involving predators, parasitoids, and endophytes. Some of these interaction partners will be shared with networks in neighbouring habitats. Interactions shown represent only a subset of the potential interactions that occur in agroecosystems (e.g. hyperparasitoids, parasites, decomposers, and other soil biota have been excluded for simplicity). Also shown is the potential for cross-network flows among habitat patches (blue arrows), the strength of which depends on how species connect networks across habitat boundaries. Red lines represent negative interactions (antagonism) and blue lines positive interactions (mutualism). Within crop habitats, dashed and solid lines indicate interactions that are generally considered harmful and beneficial to yield (crop or livestock), respectively. We selected two example agroecosystems to demonstrate broad variation in network structure: (A) Beetroot (*Beta vulgaris*) is a widely-grown annual crop that is non-mycorrhizal, largely wind-pollinated, and susceptible to many pests and pathogens. (B) Grazing pastures that consist of many species interactions, including biological control of pests and weeds, pollination, and other mutualisms.

 Figure 2. Hypothesised impacts of species additions and removals on simplified example agroecosystem interaction networks. Shown are examples of how knowledge of interaction network structure could improve the efficacy of nature-based agroecosystem management. For each management intervention, a hypothetical network is shown prior to management intervention (left), after management that did not consider interaction networks (middle), and after targeted changes to biodiversity based on knowledge of interaction networks, and where functional traits may be used to predict interactions (right). Different symbol shapes represent different species for each interaction partner. (A) Impact of increased crop diversity on the complementarity of belowground plant-mutualist networks. Management of belowground mutualist networks has the potential to improve sustainable production in agroecosystems, although more research is needed to understand their importance and tractability. (B) Impact of pollinator supplementation on the richness and strength of interactions in plant-pollinator networks. The red box highlights the nested crop module of the broader plant-pollinator network. (C) Impact of companion planting on pollinator-plant-herbivore networks. Depicted is a trade-off for crop plants when plantings do not consider multi-interaction networks (increased pollination but also herbivory), but a synergy (increased pollination but not herbivory for crop plants, plus increased weed herbivory) when plantings consider the resident network. (D) Introduction of biological control agents of weeds and crop pests into plant- herbivore-parasitoid networks. Incorporating interaction redundancy of biological control agents will increase stability of the service and minimise the evolution of host resistance.

Box 1. Linking social networks with agroecosystems

 Network analyses can identify opportunities to enhance sustainable agroecosystem production by selecting species for manipulation. However, one species that is rarely integrated into agroecosystem networks is humans. This is surprising given that multiple community groups, including farmers, industry, consumers, indigenous peoples, local communities, policy-makers, and researchers, are responsible for creating and benefitting from 535 agroecosystems, applying management and receiving NCP⁶⁵. In many cases, communication and collaboration among these groups are essential for successful implementation of nature-537 based management⁶⁶. Therefore, a better understanding of the interactions within and between these groups and their relationships with agroecosystems could inform policy that addresses their multiple, and sometimes conflicting, values. The use of social-ecological network 540 analyses may facilitate progress in these areas^{67}.

 First, social network analyses can be used to describe the degree to which institutions 542 are aligned with the structures and processes of the ecosystems they govern (institutional fit)⁶⁸. Analysis of these institutional-level networks could identify conflicts or gaps in governance that can be resolved to support the implementation of nature-based management. Second, analysing social networks can be used to identify influential stakeholders and improve the spread of information among land users. For example, one study found that the uptake of rotational grazing by farmers in the United States depended upon strong linkages both within 548 social groups and between different types of stakeholder institutions⁶⁹. Another study of farmers in Northern Spain found that those who used modern intensive irrigation dominated the social network and were better able to control information flow within the community, potentially jeopardising sustainable practices associated with more traditional farming 552 . practices⁷⁰. Future studies that identify generalisable traits of influential stakeholders and other important social network properties could improve uptake of nature-based management in

 agroecosystems (see Outstanding Questions). Third, social networks could also prove valuable at larger geographic scales, such as using international trade networks to quantify the flow of $NCP⁷¹$ or to identify high-risk introduction pathways for invasive pest, pathogen and weed 557 species⁷². Finally, visualising ecological networks themselves can be an effective 558 communication tool to incentivise farmers to adopt nature-based management practices⁷³. Taken together, we argue that integrating ecological and social networks can unify broader community support, and promote the uptake and efficacy of biodiverse, multifunctional and economically viable agroecosystem landscapes.

Box 2. Practical recommendations for applying network principles to nature-based agroecosystem management.

 In addition to future research priorities (see Outstanding Questions), we suggest a series of practical steps to incorporate interaction network principles with nature-based management in the field:

- 1) Identify the species or services that need to be promoted or controlled by measuring the key NCPs that are targeted for improvement.
- 2) Focusing on these species, and the focal crop(s), characterise the existing species networks, considering both the field and neighbouring habitats. As networks vary substantially across crop types, environmental gradients, and within different landscapes, this step will need to be done on locally representative fields. Interactions could be observed or inferred through databases or eDNA, providing key information for further interventions that can also be shared via local to global social networks (Box 1).

 3) Use existing knowledge of species and their functional traits, including local and indigenous knowledge, scientific studies and network models, to estimate how adding or removing species will change network properties and the presence and strength of direct and indirect interactions (motifs). Evaluate whether these changes are likely to have a net positive or negative effect on the desired NCP. This can be done both by predicting the specific interactions likely to be affected and by examining the change in network properties or species' roles (e.g. connectance, complementarity, centrality). Where possible, select species for manipulation which are least likely to have complex indirect effects which will be hard to predict, for example by selecting specialist biological control agents instead of generalists.

- 4) Evaluate which other management actions (e.g. synchrony of harvest timing, leaving overwinter stubbles), additional to direct species addition or removal, are likely to result in the desired species composition changes. Analysing the changes to indirect interactions or multi-interaction networks can be used to screen for effective management options.
- 5) After implementing management, re-assess the desired NCP and interaction network to confirm the predicted effects, inform future management and improve our understanding of interaction network manipulation as a management tool.

Highlights

- Nature-based management uses biodiversity and targeted biotic introductions to improve sustainable agroecosystem production, but results have been variable.
- A network perspective can improve the design and efficacy of nature-based agroecosystem management.
- Species interaction networks affect and explain ecosystem functioning and stability. Recent advances in network research provide tools for predicting species' roles and interaction network structure based on functional traits, integrating multiple types of species interaction, and predicting indirect effects across spatial and temporal scales.
- Applying these tools can help predict the impacts of intentional or accidental species additions and removals on ecosystem functioning and stability and contribute to sustainable agroecosystem production through nature-based management and in the face of global change.

Outstanding Questions

- *How does nature-based management affect agroecosystem interaction networks and their impacts on functioning, stability and productivity?* This question is central to enhancing nature-based management and will require detailed surveys and experiments to answer. Ideally, research will identify generalisable traits of species and social actors that optimise agroecosystem functioning and stability.
- *How do interactions among sub-networks affect agroecosystem functioning, stability, and productivity?* Enhancing nature-based management requires a systematic understanding of how networks and functioning link across interaction types, habitat patches, and eco-evolutionary time scales. Studies of agroecosystem networks have largely focused on bipartite above-ground interactions; future research should consider interactions across crop boundaries, seasons, trophic levels, and the abovebelowground boundary.
- *What organism traits connect key functions of agroecosystem networks across habitats and confer functional stability?* Understanding whether functional traits (e.g. mobility, generalism) or abundance determine which species influence networks or crossnetwork interactions can identify key species for manipulating landscape-scale networks.
- *How does the spatial configuration of networks influence their combined functioning?* A systematic understanding of the structure and dynamics of landscape-scale interaction networks is needed, including non-additive effects of habitat patch arrangement. Landscapes are also the basic unit for social-ecological interactions, so understanding at this scale could improve uptake of nature-based management.

 How does interaction network structure interact with eco-evolutionary feedbacks? Evolution is expected to alter networks and vice versa, but the frequency, timescale and impact of these effects is not understood. Adaptive network models can predict ecoevolutionary changes, but a major future challenge is to parameterise them with realworld data.

