

Scientific Report

as part of the application for the position “Junior Research Scientist in ecology - Vulnerability and resilience of ecosystem services in Mediterranean context” (Profile number: CR-2024-ECODIV-2)

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Table of Contents

Summary.....	1
T1 – From community assembly to ecosystem functions and services.....	1
T1.1 – Community assembly is determined by abiotic drivers and limiting similarity.....	2
T1.2 – Community assembly enhances biodiversity-ecosystem functioning (BEF).....	2
T1.3 – From food webs to ecosystem functions: mapping ecosystem services.....	2
T1.4 – Declines of biotic connectivity due to human-driven extinctions.....	3
T1.5 – Climate variability shape the suitability and distribution of species.....	4
T1.6 – Energy landscapes determine animal movement strategies.....	4
Relevance of T1 for the planned research and synergies with the working groups.....	5
T2 – Anthropogenic disturbances, people's perception, and restoration opportunities.....	5
T2.1 – People's interest is biased towards large animals.....	6
T2.2 – Identifying sustainable coexistence potential for megafauna in Kenya.....	6
T2.3 – Dispersal corridors for tigers in Nepal: how effective are they?.....	7
T2.4 – Global patterns and drivers of lead concentration in inland waters.....	7
Relevance of T2 for the planned research and synergies with the working groups.....	7
T3 – Theory and models for fundamental ecological theory and biodiversity conservation.....	8
T3.1 – The R package enerscape for quantifying energy costs of movement.....	8
T3.2 – The R package ATNr for modeling biomass dynamics of food webs.....	8
T3.3 – Taxonomic harmonization for data synthesis.....	8
T3.4 – Sustained speed of animals is limited by heat dissipation.....	9
T3.5 – XSDM.....	9
Relevance of T3 for the planned research and synergies with the working groups.....	9
Experience with lab and field work and database management.....	10
Conclusion.....	10
References.....	12
Figures.....	14

Summary

My previous and current research can be divided into three main broad themes (T), discussed in detail in the sections below: T1) understanding how biotic and abiotic factors influence species' distribution, shape community structure, and how this upscale to ecosystem functions and services at the local and landscape scale. T2) investigating how biodiversity and humans interact and how ecosystems have been impacted by anthropogenic global changes in order to identify potential solutions to maximize human-wildlife coexistence and reduce the negative effects that human activities have on ecosystems. and T3) improving basic ecological theory and developing novel methods to expand our current understanding of fundamental ecological processes and help conservation and restoration efforts in mitigating and reverting biodiversity losses.

These themes strongly align with the planned research and with the mission of INRAE and other work conducted at the RECOVER and EMR groups. In particular: T1) ecosystem services emerge from ecological processes that shape species composition and community assembly and how these upscale at the landscape level¹. To have a deeper understanding of the connection between ecosystems and their services, it is thus necessary to explicitly consider how abiotic and biotic factors shape the formation of communities and ecosystems. My previous experience with how **anthropogenic, environmental, biotic, and climatic factors influence species' suitability, community assembly, ecosystem functions, and the delivery of ecosystem services** aligns with the planned research and the goals of both the RECOVER and EMR groups in better understanding spatio-temporal dynamics of biodiversity and its sensitivity to disturbances. T2) My work on the past and current impacts of anthropogenic pressure and on people's perception of biodiversity can provide a sound starting point for integrating risk assessment of ecosystem services with socio-ecological factors. This will allow a more holistic understanding on how to **optimize ecosystem services risk management and propose management plans and policies that are sustainable both from an ecological and a societal perspective**. This aligns with the central aim of INRAE and of both the RECOVER and EMR groups to propose solutions that take into account the human dimension and that are thus sustainable in the long term. And, T3) My expertise in mathematical modelling, software development, and fundamental ecological theory will allow a steady and proficient progress in the development of the theory and models to be used in order to assess the capacity of Mediterranean ecosystems to provide ecosystem services and identify strategies to mitigate the negative effects of global changes. This will allow to expand our current knowledge and understanding of ecosystem services in Mediterranean ecosystems, starting with identifying the most crucial ecosystem services to be studied with support of the EMR group. An overview of how the themes and sub-projects fit into ecosystem services assessment is illustrated in Figure 1 and Table 2.

This Scientific Report consists of 10 pages of text plus 17 figures, 2 tables, and 3 pages for references. To make it easier to follow the report, I organized the figures within the body of the text. For the personal pronouns, I adopted the following convention: I used "I" when I was the person in charge of the task or I was the leading author of the study. I used "we" when my role in the study was a supporting one; for these cases, I specified my contribution and role.

T1 – From community assembly to ecosystem functions and services

Throughout my PhD and PostDoc periods I have investigated the importance of abiotic, e.g. climate, biotic, e.g. trophic interactions, and anthropogenic drivers for species' distribution and community assembly and how these upscale to ecosystem functions that can be used to map ecosystem services. T1 is divided into six sub-projects that resulted in publications or in ongoing studies to be submitted. The first four sub-projects show **a progression from understanding what determines community assembly (T1.1), how this affects ecosystem processes and functions, such as primary productivity (T1.2), and how we can use these to quantify and map ecosystem services (T1.3) and assess how human disturbances have impacted them (T1.4)**. The other two sub-projects focus on understanding how **climate variability influences species distribution** by

altering the long-term growth rate of populations (T1.5) and on investigating **animal movement strategies for optimizing energy budgets** (T1.6).

T1.1 – Community assembly is determined by abiotic drivers and limiting similarity

Community assembly has been extensively studied, yet it still remains one of the main fundamental ecological processes still unresolved. In particular, there is a long-standing debate on the relative importance of abiotic factors, e.g. environmental conditions, and biotic interactions in shaping community assembly². On one extreme, niche theory predicts that biotic interactions are a fundamental driver of community assembly and that species that are too similar should not coexist. This is the *limiting similarity* principle first proposed by MacArthur³. On the other hand, neutral theory predicts that the traits of species do not matter when forming a community and that its assembly is driven by stochastic events⁴. However, testing these theories is a challenging task and often hindered by practical limitations. To shed light into community assembly theory, I investigated the relative importance of abiotic and biotic factors in determining the community composition of two food web ecosystems (Figure 2A), the Adirondack lakes in NY (USA) and the forest soil communities in Germany⁵. In particular, I investigated if the community composition in local patches for the lake food webs ($n = 50$) and the forest soil food webs ($n = 48$) was determined by the limiting similarity principle and, thus, by biotic interactions. Additionally, I quantified the influence of spatial distance, environmental distance, i.e. dissimilarity in abiotic factors, and community dissimilarity on food web properties. I found that for both ecosystems **biotic filtering played a major role in shaping community composition and that this influenced the structural properties of the food webs** (Figure 2BC). This suggests that community composition is structured by competition among species with similar traits or functional roles. Moreover, the communities in both ecosystems were affected by environmental filters and spatial processes of species distribution, indirectly influencing structural properties of food webs.

T1.2 – Community assembly enhances biodiversity-ecosystem functioning (BEF)

It is well known that biodiversity has a positive effect on the delivery of ecosystem functions. For instance, primary productivity increases with species richness⁶, suggesting potential effects of biotic interactions among plant species. However, how community assembly, especially niche complementarity among plants, affects BEF relationships was not well understood. In ⁷, we built on ⁵ and complemented it with a theoretical model of trophic interactions⁸ in order to understand how community assembly influences BEF relationships. In particular, we investigated if selection of species that have complementary trophic niches during community assembly affects the primary productivity of the ecosystem. We found that **primary productivity increased when plants have more complementary niches, i.e. communities that assemble according to limiting similarity should be more productive** (Figure 3). My contribution in this study was to provide advice on the theory and methodology of community assembly and species' biomass dynamics and how to upscale these to calculate primary productivity at the ecosystem scale.

T1.3 – From food webs to ecosystem functions: mapping ecosystem services

There is still a lack of consensus on how to quantify and map some of the proposed ecosystem services and their indicators¹, preventing us from assessing and mapping their delivery. In ⁹, by taking a food web perspective, we showed how to assess several indicators and ecosystem functions that rely on the energy fluxes between species and mapped the ecosystem services that depend on such functions. In particular, we proposed **a conceptual and practical framework that can be used to map several ecosystem services that rely on energy fluxes and on biomass production**. My contribution was to develop the conceptual and analytical framework and programmatic pipeline to synthesize databases of abundance, distribution, trophic interactions, and climate in order to predict energy fluxes and extract from these the regulating ecosystem service "pest control" of the studied

species *Microtus arvalis* in Europe (Figure 4).

The focus of the T1.3 was on animal communities across Europe, but it can be tailored to Mediterranean ecosystems, including plants. The workflow can be summarized as: 1) calculate the biomass of the species of interest. This usually requires a relationship between species abundance and environmental variables (e.g. ¹⁰), such as climate, and it is therefore suited to explore potential changes due to increasing temperatures and altered precipitation patterns. 2) derive the trophic links between species. This can be achieved using available databases (e.g. [GLOBI](#)) or theoretical models (e.g. ^{7,8}). 3) calculate fluxes (e.g. ¹¹). And 4) quantify the delivery of ecosystem services. For instance, control of pest species can be quantified as the total fluxes of their consumers and carbon sequestration as the total fluxes to primary producers. A summary of the potential ecosystem services that this approach can quantify is provided in Table 1. Importantly, this can also take into account the sensitivity of the community to external disturbances, which determines how reliable and sustainable the delivery of ecosystem services is. For instance, dynamic simulation of biomasses can be included in order to assess the temporal dynamics of the delivery of ecosystem services (e.g., using ¹¹).

Table 1: Ecosystem services that can be quantified using the workflow described in T1.3

Ecosystem service	Ecosystem function	Indicator
regulation of population dynamics	pollination and seed dispersal	fluxes between plant and pollinator
climate regulation	carbon sequestration	fluxes to primary producers
nutrient regulation	soil formation, decomposition, regulation of forest succession	non-assimilated fluxes to decomposers
wood production	primary production	fluxes to primary producers
control of erosion risk	primary production	fluxes to primary producers
Food and feed	primary production	fluxes to primary producers
Regulation of pests and invasive species	regulation of population dynamics	fluxes between pest/invasive species and its consumers
Food and feed	livestock production	fluxes to livestock species

Adapted from ⁹.

T1.4 – Declines of biotic connectivity due to human-driven extinctions

Today's biodiversity decline has been compared in magnitude to previous mass extinction events¹². This extinction event started several millennia ago, following the spread of modern humans worldwide and has particularly affected megafauna^{13,14}. This caused substantial changes in the composition and functional structure of communities¹⁵. When I started my PhD, however, it was not clear how this affected biotic connectivity, which is essential for ecosystem functioning and stability, including ecological functions that promote several ecosystem services necessary for societies^{16–18}. Because large animals use disproportionately more area to fulfil their energy demands¹⁹, I hypothesized that megafauna extinctions have severely reduced biotic connectivity worldwide. I tested this hypothesis by integrating a scaling model for animal home range from ²⁰ (Figure 5) with a GIS approach to quantify how much connectivity has been lost due to human-driven extinctions. Moreover, I assessed the extent with which such declines could be restored by means of species reintroduction into their native ranges.

I found that 74% of biotic connectivity has potentially been lost worldwide due to human-driven species' extinctions and extirpations²¹ (Figure 6A). These declines were particularly severe in Europe and the Americas (Figure 6B), consistent with where megafauna extinctions have been more severe. Importantly, biotic connectivity can be partly restored to twice its current value if species would be allowed to reoccupy their native ranges. This is important for ecosystem functioning and resilience, as many ecological processes, such as nutrient and energy dispersal, depend on biotic connectivity. Specifically, these results highlight that **ecosystem services depending on biotic connectivity are today drastically downgraded** and that, even if these losses can be partly restored, it will require great and sustained efforts, starting with species' conservation and reintroduction.

T1.5 – Climate variability shape the suitability and distribution of species

Species suitability to climatic conditions is usually evaluated based on long-term climatological normals, i.e. climatic values averaged over multiple decades (e.g. 1970-2000). However, this completely ignores climate variability, i.e. that climate fluctuates across the years, which we know is important for determining the long-term viability of populations²². This likely generates biases in predicted distributional ranges of species. Importantly, as global change will also affect climate variability in addition to its average values, we need to incorporate inter-annual climatic fluctuations when predicting species' ranges and their change. In this ongoing project²³ (see also T3.5), in collaboration with Prof. Daniel Reuman at Kansas University (KS, USA), I **expand the concept of the fundamental niche of species to accommodate for inter-annual climatic variability** and develop a novel SDM framework by integrating the two fields of species distribution models (SDMs) and stochastic demography (see also T3.5). This allows, using a Bayesian framework, to estimate the fundamental niche and distributional range of species while accounting for climate variability, using widely available occurrence data (e.g. GBIF). Analyses so far showed promising results for XSDM. I applied this framework to the yellow-bellied kingsnake (*Lampropeltis calligaster*) and found that inter-annual climate variability strongly affects its distributional range, explaining the genetic divergence among its sub-populations (Figure 7).

T1.6 – Energy landscapes determine animal movement strategies

During my PostDoc period, I have investigated the influence of energy costs of travelling on animal behaviour, particularly how terrestrial animals' strategies are shaped by energy landscapes, i.e. how the movement costs mapped to a geographic area²⁴. Despite the recognition that energy landscapes should play a crucial role for animal movement, its application in movement ecology have been limited due to the lack of a scalable framework. To fill this gap, I **developed a framework that integrates a unified locomotory model²⁵ with GIS tools in a R package²⁶** (see also T3.1). This allows theory and concepts of energy landscapes to be applied to terrestrial mammals, scaling its application to a broader taxonomic range and spatial and temporal scales. I applied this framework to an extensive dataset of 155 GPS collared elephants in Northern Kenya and showed that individuals optimize their movement strategies by minimizing the energy costs of moving²⁷ (Figure 8). I also found that NDVI, a proxy for primary productivity obtained through remote sensing, direct movement of elephants, which tend to utilize more often, as expected, highly-productive habitats. This study, in collaboration with Prof. Fritz Vollrath at Oxford University (UK), has **important conservation implications, as energy costs can be used to map species-specific landscape connectivity**. I am also collaborating on a project where I applied this framework to assess dispersal corridors for tigers in Nepal (see T2.3).

Relevance of T1 for the planned research and synergies with the working groups

The themes and sub-projects of T1 are highly relevant for the proposed research and constitute a core of conceptual and practical knowledge that can be used to: 1) **identify ecosystem services** for initial investigation. 2) **develop concepts, theory, and methodologies** to assess them. 3) setting up

a scalable and reproducible pipeline to **map and monitor ecosystem services**, and 4) understand the **impacts of ongoing global changes and anthropogenic disturbances** on the delivery of ecosystem services. Specifically:

- T1.1) supports the role of environmental and niche filtering for community assembly, which shape the species and functional composition of communities. This, in turn, determines ecosystem functions and the delivery of several ecosystem services¹, most notably food and wood production and biological control of pest and invasive species. Importantly, results from T1.1 suggest that **functional approaches to community dynamics are particularly important for studying ecosystem responses across scales**.
- T1.2) show how **species functional complementarity influences biodiversity ecosystem functions, in particular primary productivity**, which is directly linked to several ecosystem services, such as food and wood production, global climate mitigation, and nutrient regulation.
- T1.3) is highly relevant for the planned research and has several important areas of overlap with other goals of the RECOVER and EMR groups. In particular: it can provide the starting point for discussions on how to move **from expert based opinions to more objective indicators of ecosystem services**; it will allow to model, quantify, and **map a selected subset of ecosystem services relating to fluxes of energy and matter**, such as food and wood production, nutrient regulation, pest control, and climate mitigation. The workflow proposed in T1.3 can be integrated with **current and future global change scenarios**, permitting to forecast how increasing temperature and human presence and changing precipitation patterns will impact Mediterranean ecosystems. Finally, the temporal component can be explicitly modelled, allowing us to assess **how the delivery of ecosystem services changes throughout the year or longer time periods**.
- T1.4) shows that **several ecosystem services that depend on biotic connectivity**, e.g. nutrient regulation^{28,29}, have declined due to human-driven extinctions and extirpations. Therefore, understanding how humans have impacted biotic connectivity is **fundamental to assess the delivery of several regulating ecosystem services** and to promote their recovery.
- T1.5) is instrumental in adding the temporal component in ecosystem services assessments, e.g. expanding the workflow of T1.3 to accommodate climate variability and how this influences ecosystem functions. This will allow us to understand **how ecosystem services change throughout the year and on longer time scales**. Specifically, T1.5 is based on integrating climate time series with a Bayesian framework for inferring species distribution. Although different in scope, this has several methodological and conceptual similarities with temporally-explicit modelling of ecosystem services.
- T1.6) suggests several ways for **integrating animal movement in the assessment of ecosystem services** that depend on biotic connectivity and the functions it supports, such as nutrient and seed dispersal. This can be relevant for later stages of the planned research, e.g. once several ecosystem services have been assessed and mapped and the workflow is mature and stable. Importantly, this will highlight how to promote the delivery of ecosystem services that have been particularly affected by anthropogenic disturbances, as illustrated in T1.4.

T2 – Anthropogenic disturbances, people's perception, and restoration opportunities

In addition to advancing theory and understanding of community processes and how these upscales to ecosystem functions and services, my research is also focused on understanding how humans have impacted ecosystems globally and on how people perceive biodiversity. This has tremendous importance in today's world, because only by understanding what has been lost can we set objective baselines for restoration³⁰. For an example of a deep-time baseline that is likely more objective than pre-industrial or pre-Anthropocene eras, see also T1.4 and²¹. Moreover, we need to take into account the human component if we want to protect and restore biodiversity effectively in ways that are sustainable in the long term. During my PhD under the guidance of Prof. Jens-Christian Svenning at Aarhus University (Denmark), I was exposed to revolutionary ideas on how this can be achieved through *rewilding*. Ignoring the several definitions of rewilding for the purpose of this report, rewilding

promises a paradigm shift compared to other, more traditional forms of nature conservation and restoration. In its essence, rewilding is to restore ecosystems to a feasible natural state and to minimize subsequent human intervention³¹. We need to discuss what this starting point should be and how to monitor and manage such ecosystems, but **only by letting ecosystems self-regulate can we achieve true sustainability**. To achieve this or any other sort of sustainable nature conservation plan, **we need to understand how people perceive biodiversity** and how this can influence conservation and restoration outcomes. Integrating people's perception in existing frameworks will improve our understanding of how societies will react to potential biodiversity changes and **to propose solutions to mitigate the risks of ecosystem services losses** associated with such socio-ecological transformations.

T2 is divided into four sub-projects that focus on understanding the biases of people's opinion towards wildlife, accounting for it in socio-ecological assessments, quantifying the impacts of human activities on species' dispersal abilities, and on mapping and explaining the anthropogenic drivers of a chemical pollutant in inland waters. Specifically, these sub-projects aim at: assessing **biases of people's perception towards biodiversity** (T2.1); integrating such biases into habitat suitability models to **identify opportunities for sustainable coexistence** (T2.2); assessing the **effectiveness of designated connectivity corridors** in relation to human activities, which interfere with optimal dispersal strategies of species (T2.3); and. quantifying the **global patterns and drivers of lead concentration** in inland waters (T2.4).

T2.1 – People's interest is biased towards large animals

Any visit at a zoo will suggest that some animals attract more attention than others. Species that are more charismatic, i.e. more popular among people, attract more visitors. This is not limited to zoos, but affects all interactions between animals and people and determines how much we are willing to invest in seeing, studying, and protecting them. In turn, this has important repercussions for biodiversity conservation, as more funds are allocated towards charismatic species, irrespective of conservation priorities^{32,33}. Previous studies quantified animal charisma by means of complex statistical models³⁴, which were however specific for mammals and that could not be used for broader assessments. I hypothesized that a simple relationship existed between animal charisma and their body size, e.g. due to their sublime aesthetic (impressing the mind with a sense of grandeur or power; inspiring awe, veneration, etc.). I synthesized nine studies that assessed people's perception of animals in one large database that I used to test this hypothesis³⁵. I found that not only large animals are more charismatic, but that **there is a linear relationship between an animal body size and its charisma** (Figure 9).

This relationship has good explanatory power ($R^2=0.69$) and holds for mammals, birds, reptiles, and amphibians and can thus be used to quantify the charisma of species. This is important not only for conservation, but also for basic research, as scientists are also biased towards large, charismatic megafauna, as confirmed by a later analysis³⁶. **Animal charisma determines how much people, including scientists, are willing to put effort and allocate money for their conservation**. Notably, my findings also highlight that species that should be particularly prioritized by conservation efforts are not necessarily more charismatic, highlighting a mismatch between where conservation funds are potentially being allocated and where they would be more useful to protection of biodiversity.

T2.2 – Identifying sustainable coexistence potential for megafauna in Kenya

Understanding how people perceive biodiversity and how much they are willing to tolerate it is **crucial for planning and management of sustainable conservation and restoration projects**. However, one of the major limitations of ecosystem assessment is that it often lacks a societal component, specifically how tolerance towards wildlife affects biodiversity conservation³⁷. In ³⁸, **we developed a holistic approach that integrates people's willingness to coexist with ecological factors** to assess the socio-ecological coexistence potential for elephants (*Loxodonta africana*) and black

rhinoceros (*Diceros bicornis*) in Kenya. In particular, we show that perceived threats to human life and activities determine the willingness to coexist in human-wildlife ecosystems (Figure 10). Importantly, this highlights the importance of using a **holistic perspective in order to identify areas where targeted conservation actions can improve a sustainable coexistence between people and wildlife**. In this project, I advised and performed preliminary analyses on how to integrate the willingness to coexist metric, obtained from field surveys of people's opinions, with ecological suitability models.

T2.3 – Dispersal corridors for tigers in Nepal: how effective are they?

The population of tigers has been growing steadily in Nepal during the last decades. Tiger individuals started to disperse Northward, partly to avoid conflicts with people in the human-dominated landscapes further South. In [REF], I quantified landscape connectivity for tigers based on the energy costs of travel³⁹. Moreover, using remote sensing approaches, I assessed how human activities and land-cover use affected high-connectivity areas at the national level and within the network of protected areas. I found that **most of the areas with high connectivity are currently used by people** and that tigers would need to adjust their movement strategies in order to avoid conflicts, at the cost, however, of increased energy costs (Figure 11A). Importantly, this also happens within designated corridor areas (Figure 11B), where **most of the high-connectivity regions are used by human activities**.

T2.4 – Global patterns and drivers of lead concentration in inland waters

Chemical pollution of rivers is one the main anthropogenic stressors of freshwater ecosystems [REF]. In particular, lead (Pb) has received considerable attention as one of the main pollutants in rivers. However, we lacked a quantitative assessment of the distribution patterns and drivers of lead concentration in inland waters at the global scale. I was invited to participate in a study in collaboration with Prof. Kai Yue at Fujian University (China) that aimed at assessing lead concentration patterns and drivers by using an extensive dataset compiled from published literature⁴⁰. In particular, I performed the mixed modelling approach used in the meta-analysis, which revealed that **lead concentration was positively driven by potential evapotranspiration, elevation, and road density** (Figure 12) and was particularly high in rivers near industrial areas, where most of the water for drinking and agriculture is collected.

Relevance of T2 for the planned research and synergies with the working groups

The themes and sub-projects of T2 are relevant for the planned research as they identify potential biases in the public's perception of biodiversity and how this can affect responses of societies and ways to mitigate human-wildlife conflicts. This is highly relevant to **achieve sustainable policies that optimize the delivery of ecosystem services and the well-being of ecosystems and societies**. Specifically:

T2.1) shows that people's perception of species is skewed towards large animals, which are perceived as more charismatic and, thus, attract more interest and funding for conservation. It may be relevant for the planned research to assess similar biases in the perception and opinion of local stakeholders and the general public towards species and habitats in Mediterranean ecosystems in order to **identify potential sources of conflict that may jeopardize the effective delivery of ecosystem services**.

T2.2) develops a conceptual and practical framework to account for identified biases in people's perception (e.g. building on T2.1). Such a holistic framework can be used to assess how public opinion can influence the delivery of ecosystem services, fundamental to achieve **long-term, sustainable policies for managing ecosystems** and for the delivery of their services.

T2.3) identifies potential issues with protected area design and management for tigers in Nepal. This study can easily be applied to other animal species and settings in order to **assess the**

delivery of ecosystem services that depend on animal movement and biotic connectivity, e.g. seed and nutrient dispersal.

T2.4) is unrelated to the planned research, but it highlights my capability to **adapt to new topics and work well in a diverse network of collaborators**. In addition, this will be useful if similar topics are to be explored by ... groups, e.g. in ... assessments.

T3 – Theory and models for ecology and biodiversity conservation

During my career, I have conceptualized several novel ideas, advanced basic ecological theory, and developed methods and software to apply them. T3 brings together all these achievements and is divided into five sub-projects: developing of a **GIS framework to quantify the energy costs of moving for terrestrial animals** (T3.1); developing a **standardized framework for simulating biomass dynamics** in food webs (T3.2); proposing a **practical approach for taxonomic harmonization** (T3.3); **advancing current theory on animal locomotion and movement ecology** (T3.4); and developing a **novel approach for ecological niche and distribution modelling** (T3.5; see also T1.5).

T3.1 – The R package enerscape for quantifying energy costs of movement

Despite the recognition that energy landscapes, i.e. the energy cost of travelling mapped on a geographic landscape, should play a crucial role for animal movement²⁴, its application in movement ecology have been limited due to the lack of a scalable framework. To fill this gap I published an R package hosted on CRAN³⁹ that integrates a biomechanical model of terrestrial animal locomotion²⁵ with a GIS framework²⁶. This allows to broaden the investigation of **energy landscapes for terrestrial mammals using widely available data**, namely a digital elevation model and the body mass of the individuals. The output of enerscape is a raster map of energy costs of moving in the landscape (Fig. #). Enerscape back-end runs in C++ integrated in a frontend in R (Figure 13), making it particularly efficient and suitable for large-scale analyses.

T3.2 – The R package ATNr for modelling biomass dynamics of food webs

Allometric trophic network models (ATNs) are a theoretical framework capable of **modelling the biomass dynamics of a community** by quantifying interaction strengths in food webs³⁸. Although ATNs have been extensively used, we lacked a standardized framework to model them, with different studies using different underlying models and parametrizations. Moreover, ATNs were accessible only to advanced programmers, as it requires coding in C++, a skill that most ecologists do not have. To fill these gaps, we developed an R package hosted on CRAN that provides ready-to-use implementation for the three most commonly used ATNs⁸ (Figure 14A). Importantly, ATNr comes with default parametrizations (still customizable by users) extracted from literature. The main relevance of ATNr is that it allows to model biomass dynamics in communities while **assuring high reproducibility**. My contribution to this sub-project was to review code developed by Dr. Benoit Gauzens (iDiv), help with the development of the package, e.g. optimize the interface between R and C++, and run analyses and write the case examples for the publication. ATNr is relevant for the advertised position as ATNs can be integrated in simulating biomass dynamics of Mediterranean ecosystems in order to **assess how biomass dynamics affect the delivery of ecosystem services and how these change through time**. Importantly, as temperature affects rate parameters of ATNs, ATNr can also be used to **assess how climate change will affect biomass dynamics** (e.g., Figure 14B) and how this will impact ecosystem services (Fig. #B).

T3.3 – Taxonomic harmonization for data synthesis

A common problem of synthesis studies is to join data that comes from several different sources with contrasting standards. For instance, joining biodiversity data at the species level requires that species names have been harmonized against a common taxonomic backbone. However, it was unclear on

how to practically achieve this and we did not have a good overview of the available tools and resources to facilitate it. In ⁴¹, we reviewed existing literature, data sources, and software to harmonize taxonomic names and proposed guidelines and four practical approaches that fit different goals (Figure 15). In this study, I contributed in conceptualizing the problem and solutions, I proposed the complementary Shiny App as a tool to guide users, and I designed and carried out the examples to show how to achieve taxonomic harmonization.

T3.4 – Sustained speed of animals is limited by heat dissipation

In addition to topography (see T3.1 and T1.6), energy costs of travel depend on animal speed, with total costs being smaller for higher speeds⁴². Moreover, heat produced by muscle contraction can be difficult to dissipate, imposing an additional limit to animal speed during sustained locomotion. Despite its potential importance, however, it was unknown how heat dissipation influenced sustained travel speed. To fill this gap, we synthesized a large dataset of sustained travel speed for 532 species and developed a mathematical and statistical model to assess if heat dissipation limited sustained speed of animals⁴³. We found that sustained speed showed a hump-shaped relationship with body mass, highlighting that the highest travel speeds are achieved by animals of intermediate body mass. Importantly, we found that **heat dissipation is negatively related to body mass** and that, thus, large animals need more time to dissipate the heat produced during locomotion, **limiting their sustained locomotion speed** (Figure 16). This provides a mechanistic understanding of sustained travel speed that will facilitate more realistic predictions of biodiversity dynamics in fragmented landscapes.

My contribution in this study was to help develop the mathematical model of speed in relation to body mass and heat dissipation capacity. We are currently expanding this model to account for environmental temperature, as this will influence the rate of heat dissipation. This will be particularly important to investigate the effects of climate change on the movement patterns of large animals in warm habitats, e.g. tropical and Mediterranean ecosystems.

T3.5 – XSDM

The novel XSDM framework introduced in T1.4 is part of an ongoing project to include inter-annual climatic variability in species distribution modelling (Figure 17). This is achieved by integrating two established fields that have not been previously connected. XSDM, currently in its pre-release stage²³, is based on a Bayesian framework implemented in Stan and callable from R that **estimates how inter-annual climate variability influences the distributional range of species**. Notably, XSDM is computationally efficient and requires only widely available data (e.g. GBIF). Analyses so far showed promising results for XSDM. Importantly, this framework can be **expanded to include the demographic structure of the population** and to assess the influence of climate variability at different time scales, e.g. months or seasons, when relevant for the studied species. We received high praise and strong encouragement for preliminary results of XSDM from Prof. Peterson and Prof. Soberón at Kansas University, leading experts in the field of SDMs. I did not release a pre-print of this study as it may be “scooped”, being competition in the field of SDM quite fierce. I can provide a copy of the current manuscript for confidential use only, if needed.

Relevance of T3 for the planned research and synergies with the working groups

The themes and sub-projects of T3 are relevant for the planned research as they highlight my experience with **software development, conceptualization and formalization of new theory, and development of novel approaches and methods** for assessing several aspects of biodiversity and ecosystem functioning. Specifically:

T3.2) and T3.1) illustrate my proficiency in **developing stable and optimized packages in R**.

Additionally, as T3.2 can be used to assess biomass dynamics and related ecosystem functions (primary productivity, energy fluxes) that determine ecosystem services (wood production, climate mitigation, pest control), this can be used as a starting point for **quantifying ecosystem**

services in Mediterranean ecosystems.

T3.3) highlights my **data science skills for ecological synthesis**, which can have synergies with the ECOSCOPE project (EMR group), aimed at harmonizing and standardizing environmental data.

T3.4) illustrate my skills in conceptualizing new theory and formalizing it mathematically. This is a highly transferable skill that will be useful in **advancing theory and knowledge on ecosystem services**, particularly how they emerge from local processes and how to improve their assessment.

T3.5) suggests several potential avenues for future research, for example **modelling species distribution under climate change**, which is altering, in addition to average climatic conditions, also the intensity and frequency of extreme events, such as droughts and heat waves. This has several potential applications for biodiversity assessments, monitoring, and forecasting in a changing world, with many synergies with the research conducted at the RECOVER and EMR groups. For instance, XSDM can be used for better understanding **how changing climate variability will affect the suitability and distribution of Mediterranean species**, which are already facing extreme inter-annual variability in climate. Moreover, including an explicit demographic structure will be particularly promising for modelling **how Mediterranean forests respond to human stressors**, e.g. in the case of the Aleppo pine renewal project carried out at the EMR group.

Experience with lab and field work and database management

My research during my PhD and PostDoc periods has been mostly theoretical and oriented towards the synthesis and analysis of large amounts of data. In addition to this main line of research, I have been part of **several field expeditions during my MSc**, I have carried out **experimental work for both my BSc and MSc theses**, I have helped with field work during my PhD, and I led the **planning and coordination of a camera trapping experiment** in Italy during my PostDoc. Specifically:

- I extracted and prepared muscle fibres for analysis using the “striation follower”⁴⁴ (BSc thesis).
- I joined an expedition to survey the distribution of an invasive ant in the [Casentino forests](#) (MSc).
- I joined an expedition to survey the species composition and distribution of Mediterranean plant species on [Capraia Island](#) (MSc).
- I sampled ants from two colonies of different species and recorded their movement behaviour and the dynamics of aggressive interactions (MSc thesis).
- I helped setting up exclusion plots for assessing the effects of grazing on plant and insect biodiversity and with the deployment of 4 GPS collars attached to four animals (PhD)
- I planned, coordinated, and performed field work for a [camera trap experiment](#) in the Central Apennines (Italy) that aimed at surveying animal composition and investigating how species interact (PostDoc). I also collected and organized spatial data ([Earth Engine app](#)) for assisting two MSc students involved in the project.
- I am managing the food web database [GATEWAY](#), containing also the GIS data (spatial location of study sites). In particular, I am developing a new harmonized and standardized version that can be hosted on a website (PostDoc).

This is relevant for the advertised position as it highlights my **previous experience with field and lab work, database management and spatial data**.

Conclusion

Additionally to a strong scientific interest, I have a deep personal connection with Mediterranean ecosystems. I grew up in Tuscany, Italy, surrounded by Mediterranean forests. These forests are frequently perturbed by fires caused by humans, e.g. hikers or olive farmers burning branches after pruning. I witnessed three large fires during the period 2000-2014. After the fires, I frequently surveyed the burnt areas to assess the regrowth of vegetation. In recent years, extreme droughts and heat waves have severely impacted these forests. For instance, trees have been shedding their

leaves early; I recorded one of such episode in late August. Human benefits have also been compromised. For instance, olive, wine, and chestnut production has steadily declined. Understanding how Mediterranean ecosystems deliver their services and how to mitigate the impacts of global changes is, thus, very important to me to help the community I was born and raised in. Because of this personal connection with Mediterranean forests and ecosystems, I am extremely motivated and committed to the missions and goals of the planned research and shared by the RECOVER and EMR groups.

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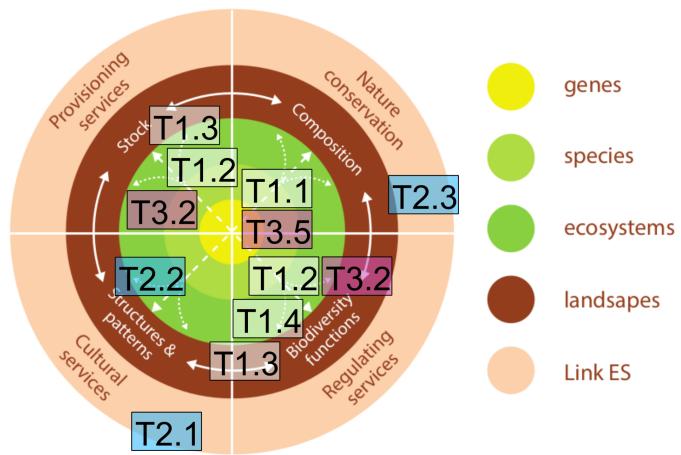
Figures

Figure 1: Relevance of the themes and sub-projects for assessing ecosystem services. Only the most relevant sub-projects are shown, with colours referring to their overall theme: T1 (From community assembly to ecosystem functions and services) is shown in white, T2 (Anthropogenic disturbances, people's perception, and restoration opportunities) in blue, and T3 (Theory and models for fundamental ecological theory and biodiversity conservation) in pink. Adapted from [1].

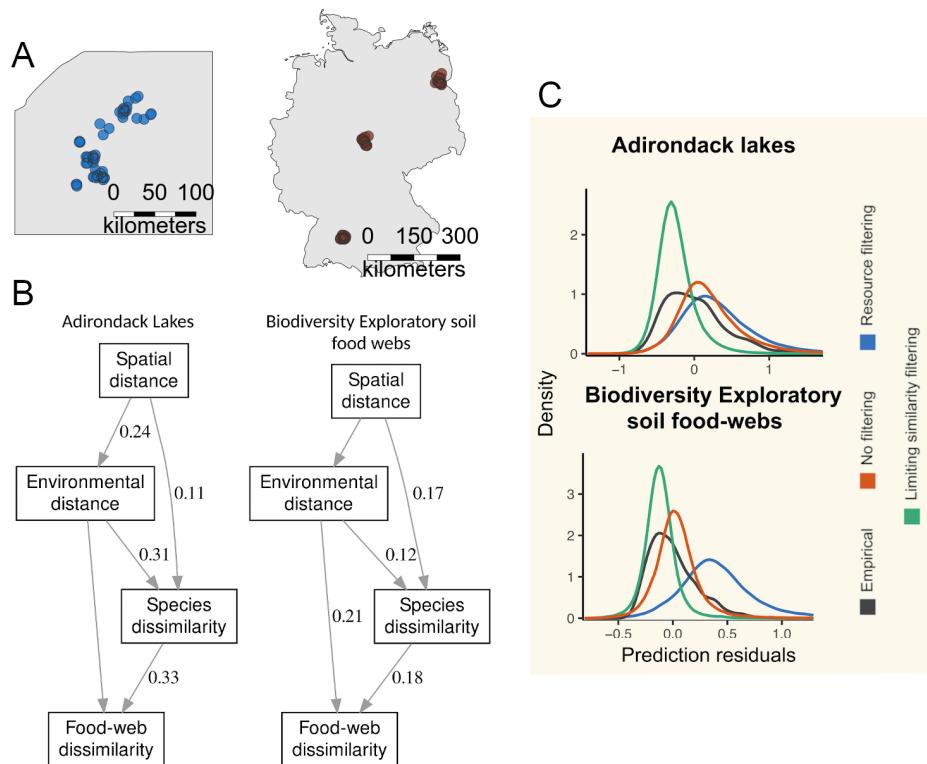


Figure 2: Limiting similarity determines community assembly and food web properties in two ecosystem types. **A)** The communities studied for the two ecosystems, the Adirondack Lakes (blue) and forest soil food webs (Biodiversity Exploratory soil food webs; brown). **B)** Results from the structural equation modelling, showing that spatial distance and environmental dissimilarity affect community composition, which then influence food web structure. **C)** Results from simulation models showing that limiting similarity (green lines) has the highest agreement with empirical patterns (black lines) compared to a scenario where species composition is random (orange lines) or affected only by resource availability (blue lines). Adapted from [5].

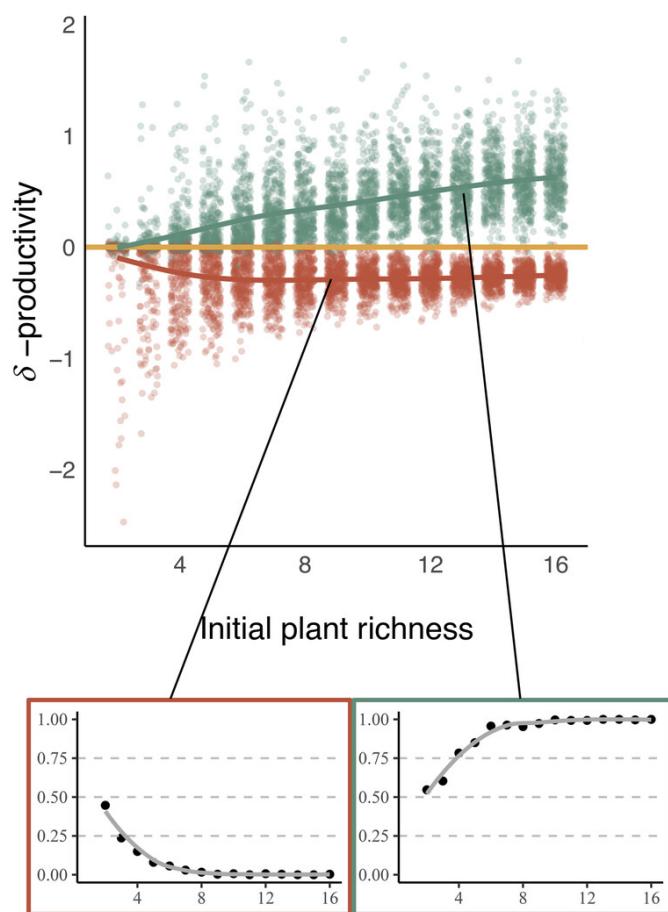


Figure 3: Community assembly influences the relationship between plant richness and primary productivity. The difference (δ) in primary productivity when plant complementarity increases through niche packing (red points) or divergent adaptation (green points) relative to the control (yellow line). The red and green inset figures show the proportion of positive changes for each scenario. Primary productivity is higher in communities shaped by limiting similarity, which reduces niche overlap and increases functional diversity of species. Adapted from [7].

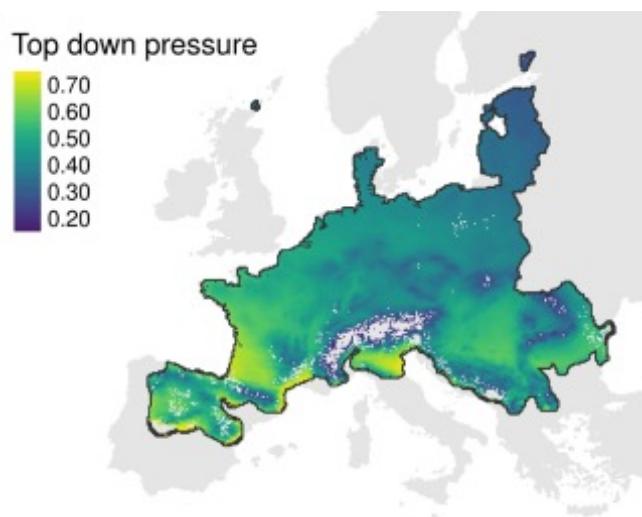


Figure 4: Pest control of the common vole (*Microtus arvalis*) in Europe. Top-down pressure represents the sum of energy fluxes between *M. arvalis* and its predators. The lighter the colour, the greater the top-down pressure. This example shows how the framework from [9] can be applied using empirical data to quantify ecosystem services that depend on flux of energy and nutrients.

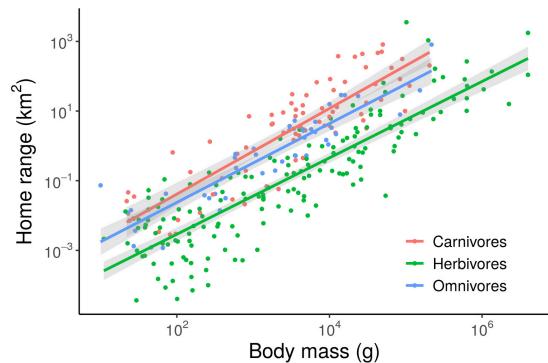


Figure 5: Allometric scaling of home range (km^2) with species body mass (g) in mammals. Circles show the species-level data points from 43 and lines the scaling relationship between body mass and home range, obtained by means of linear regression. Colours show the trophic level of the species. Both axes are log10-scaled.

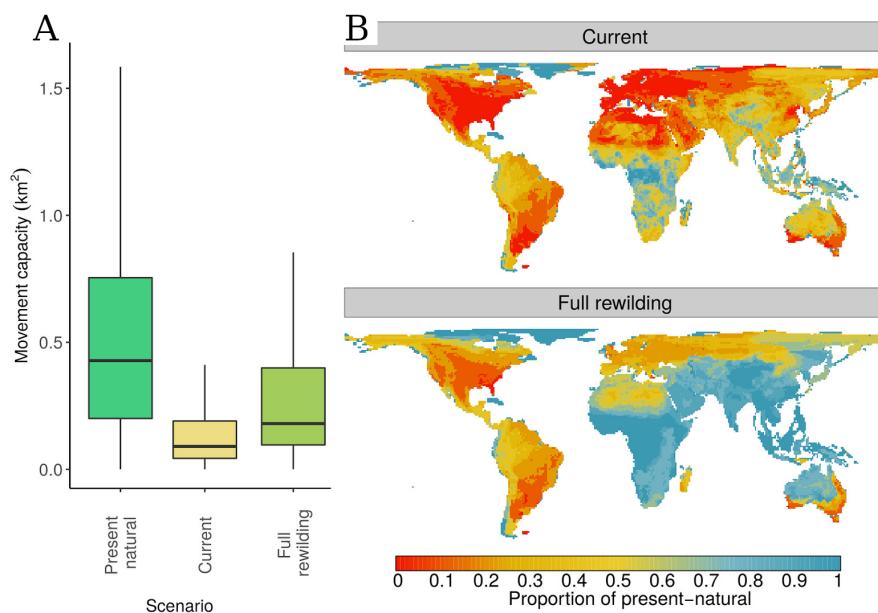


Figure 6: Declines of biotic connectivity caused by human-driven extinctions and restoration opportunities. **A)** Global movement capacity, a proxy for biotic connectivity, of terrestrial mammal assemblages under three scenarios: present natural (assuming no extinction and range contraction occurred); current; and full rewilding, showing the maximum connectivity that can be restored if all existing animals are allowed to occupy their native ranges. Boxplots show the median, upper and lower quantiles (box limits), and 1.5 interquartile range (whiskers); outliers were removed for clarity. **B)** Geographic distribution of the loss of biotic connectivity. Colours show the proportion of connectivity that we would have today if humans did not affect mammal assemblages (present-natural) compared to what we have today (current) and what can be restored (full rewilding scenario). Red indicates low, yellow intermediate, and blue high connectivity.

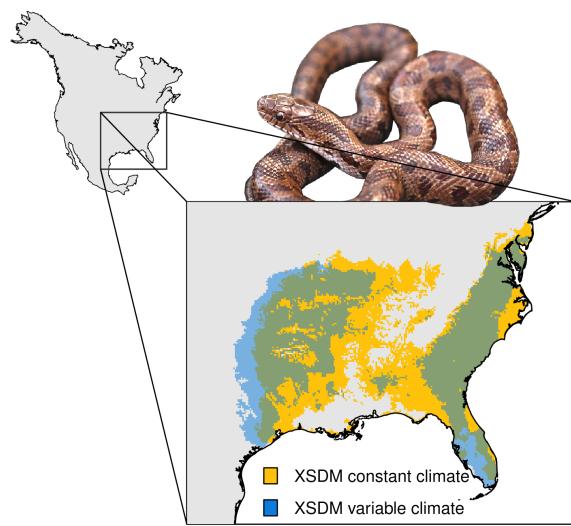


Figure 7: Potential distribution of the yellow-bellied kingsnake (*Lampropeltis calligaster*) using the XSDM framework. Blue shade shows the potential distribution when accounting for climate and its inter-annual variability and yellow shade shows the potential distributions assuming constant climate. The distributions when accounting for inter-annual variability or not differ markedly. The distribution accounting for climate variability (blue) can explain observed patterns of genetic divergence among *L. calligaster* populations.

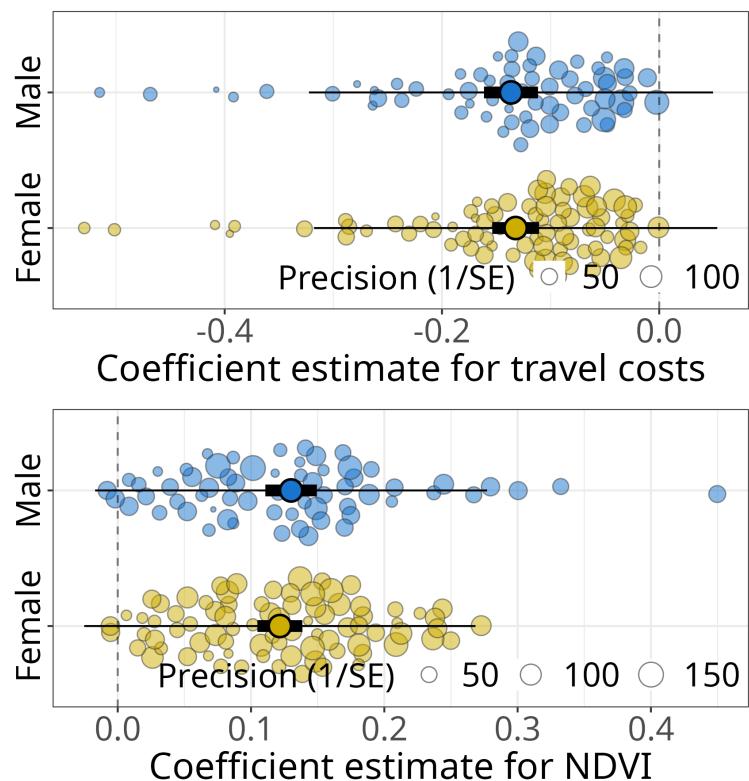


Figure 8: Preferences for habitat features of 155 elephants in Northern Kenya. Circles show the coefficient estimates of the preference model, with colours showing the sex of individuals and size proportional to estimate uncertainty. Elephants tend to avoid areas with high cost of travel and prefer habitats with high primary productivity, highlighting the importance of movement strategies to optimize energy trade-offs. Adapted from [28].

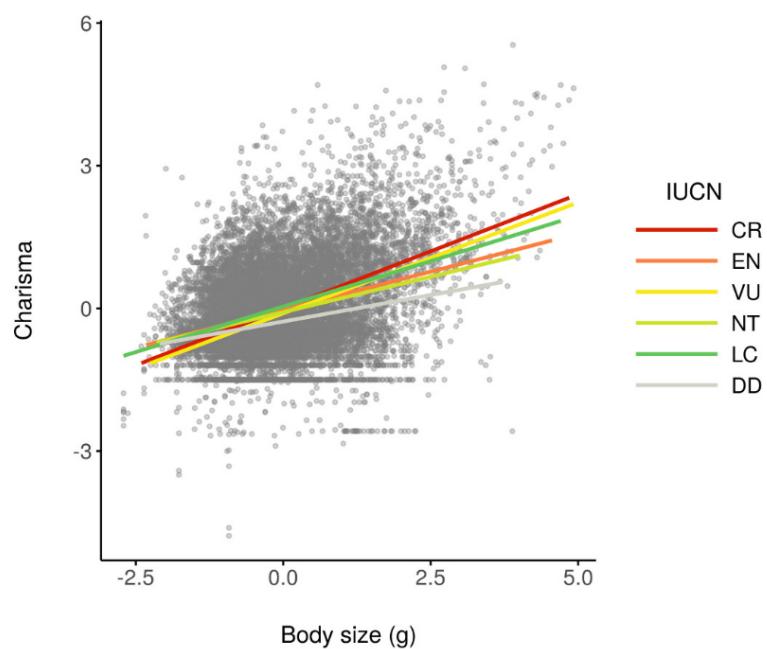


Figure 9: Relationship between animal charisma and body size. Data was obtained from nine datasets for amphibians, birds, mammals, and reptiles. Circles show species data points, with charisma being normalized relatively to each dataset. Lines show the relationship between charisma and body size, with colors indicating the IUCN threat category.

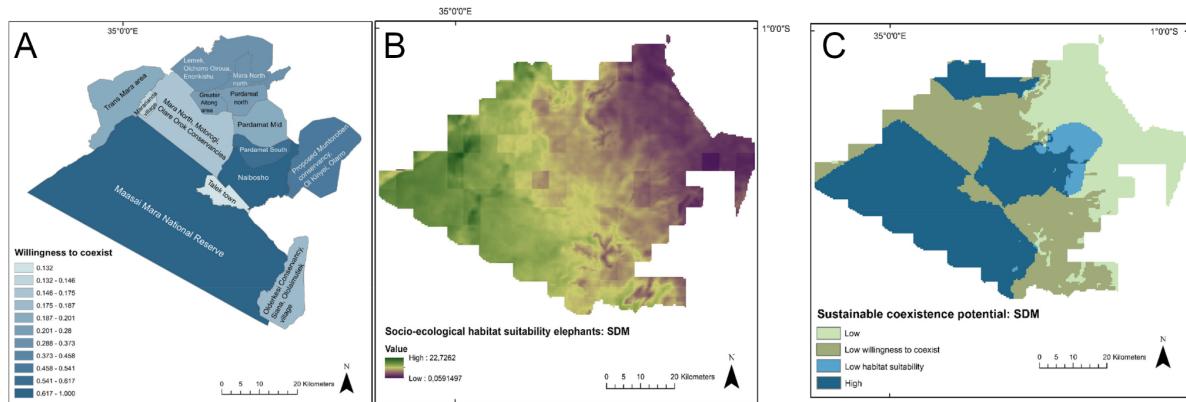


Figure 10: People's tolerance determines the potential for sustainable coexistence between societies and megafauna in Kenya. A) Willingness to coexist measure, quantified using field surveys of people's opinions. Darker shades of blue show higher tolerance of people towards wildlife. B) Socio-ecological potential habitat suitability for elephants. Violet shows are with low suitability and green areas with high suitability. C) Potential for sustainable coexistence between human societies and elephants in Kenya, obtained integrating A and B. Green shades show low coexistence potential and blue shades high coexistence potential. Adapted from [36].

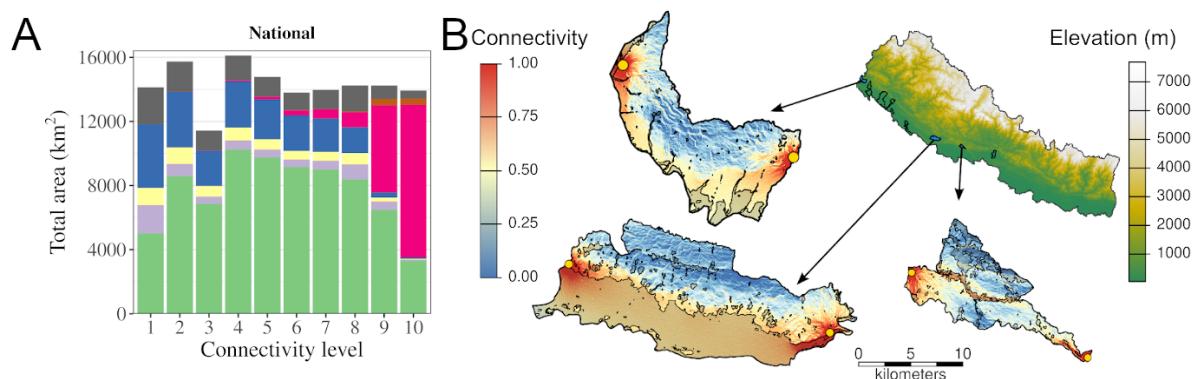


Figure 11: Landscape connectivity for adult male tigers in Nepal. **A)** Land-cover zonal statistics grouped by connectivity levels. Stacked bars show the area covered by land-cover types for each connectivity level, with 1 indicating lowest and 10 highest connectivity. **B)** Landscape connectivity for a tiger travelling through three designated areas of the Terai-Arc dispersal corridors. Connectivity was calculated using as resistance matrix the energy costs of travelling across the landscape. Gray shades show areas of human land-use, such as croplands and settlements. Adapted from an ongoing study in collaboration with Prof. Niel Carter [NEPAL].

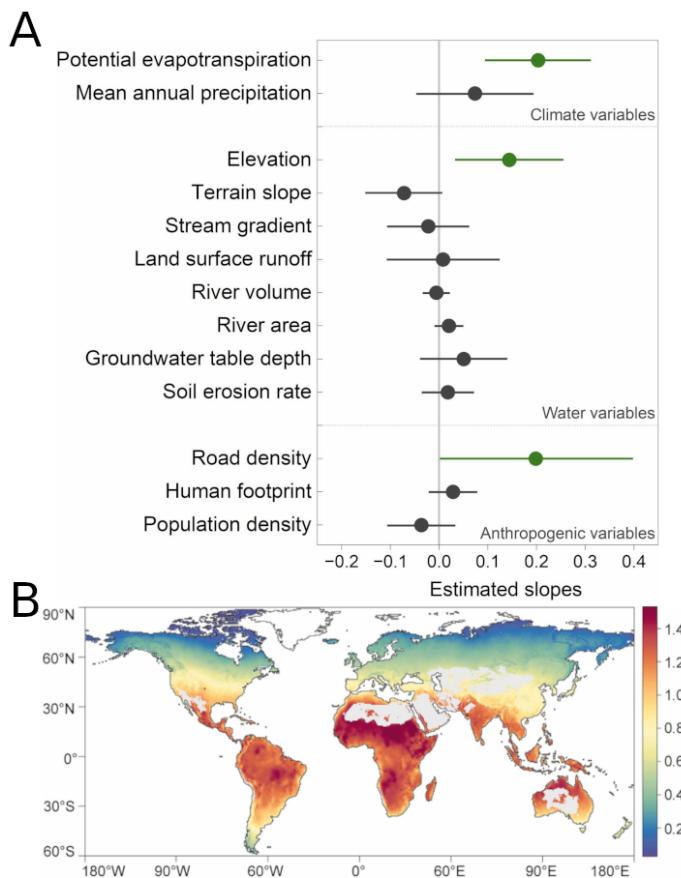


Figure 12: Results from the meta-analysis on patterns and drivers of lead concentration. **A)** Overall effects of the 13 predictors used for estimating lead concentration in global inland waters. Circles show mean estimated effects ($\pm 95\%$ confidence intervals), obtained using mixed linear models. Gray colour indicates a statistically non-significant effects on lead concentration ($p \geq 0.05$) and green colour a significant positive effects on ($p < 0.05$). **B)** Predicted global pattern of Pb concentration in inland waters ($\mu\text{g L}^{-1}$) obtained from using linear mixed models. Colours indicate the lead concentration, with blue showing low levels and red high levels of lead concentration. Gray cells indicate areas without inland waters. Adapted from 37.

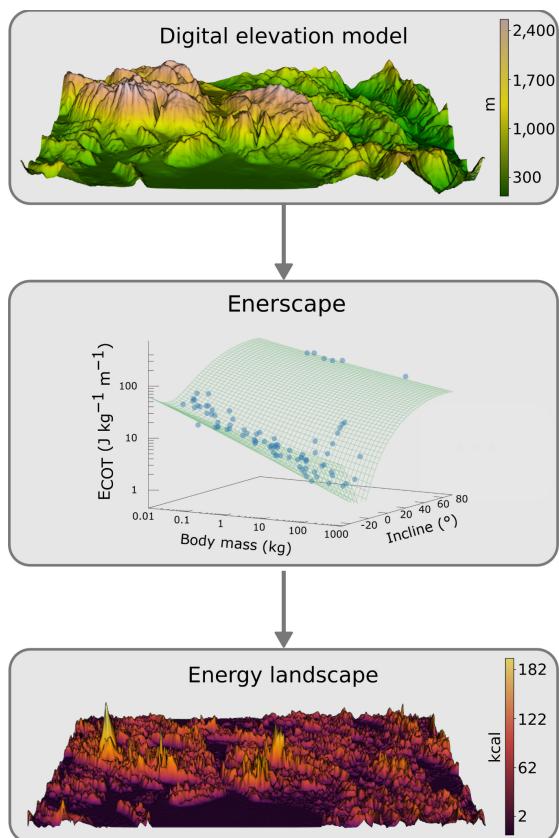


Figure 13: Illustration of the workflow of the R package enerscape. The energy landscape is computed starting from a raster of the digital elevation model (top) and animal body mass using a locomotory model to calculate the energy costs of transport (ECOT). Green lines show the ARC model 24 for legged, terrestrial animals (middle), with blue circles showing the empirical data used for validation. The output of enerscape is the raster of energy landscapes (bottom). From 25.

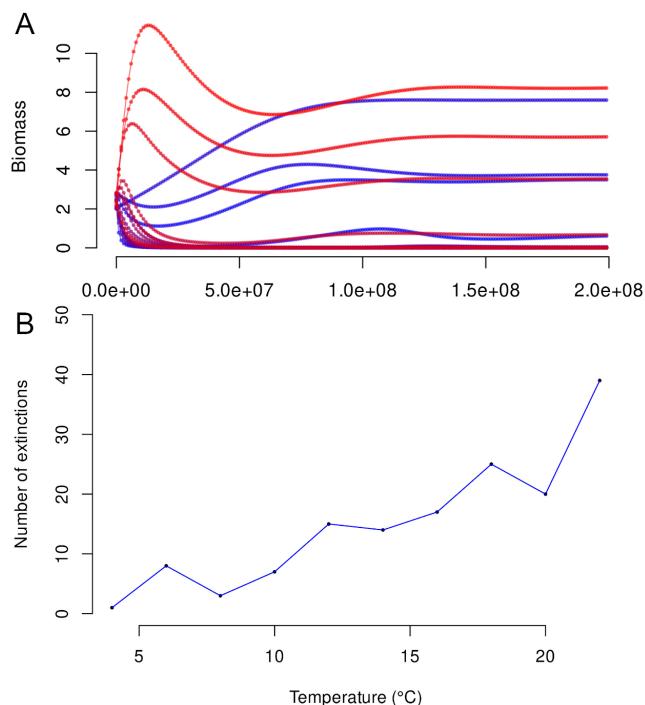


Figure 14: Examples of the output of ATNr and its applications. **A)** ATNr simulates biomass dynamics through time using fast C++ code. Colours show different species, using a gradient from blue to red based on species' ranks in the food web matrix. **B)** Effect of temperature on species persistence using the unscaled ATN model with nutrients as implemented in ATNr. For increasing temperatures, more species go extinct (total species richness = 50). Adapted from [8].

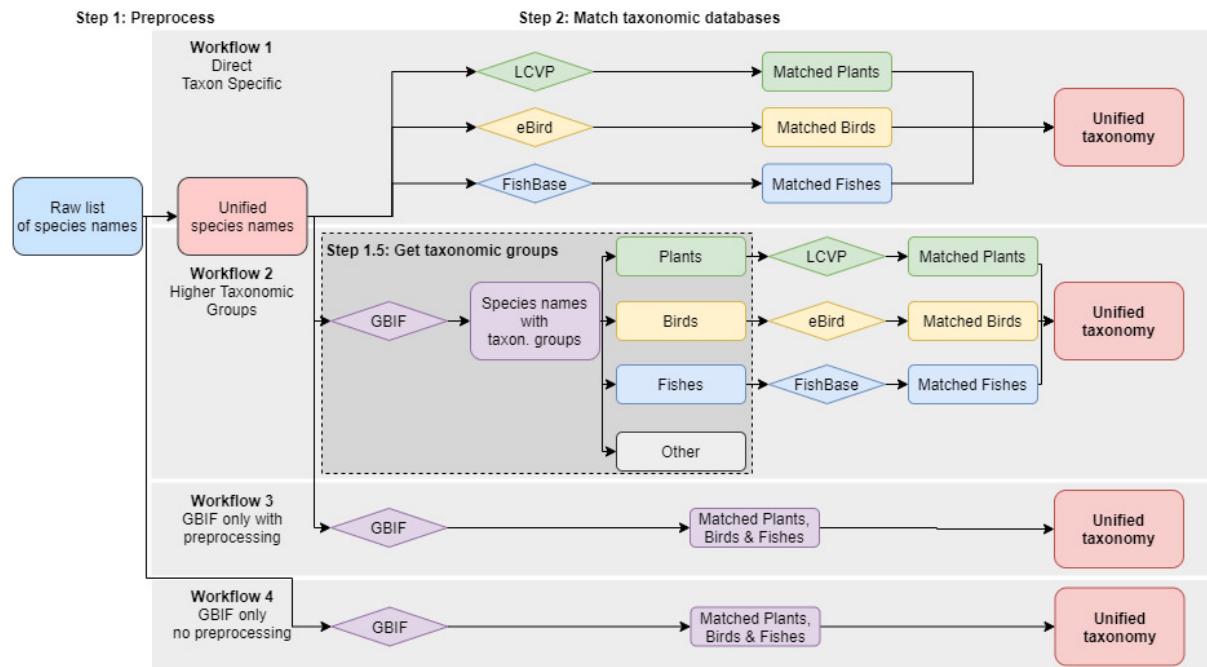


Figure 15: Diagram of the four taxonomic harmonization workflows explored. The workflows differ in the number of steps they consider and the taxonomic backbone they use. Rounded rectangles represent lists of taxon names and diamonds the taxonomic databases used.. The different colours used at step 2 represent different taxonomic groups. From [39].

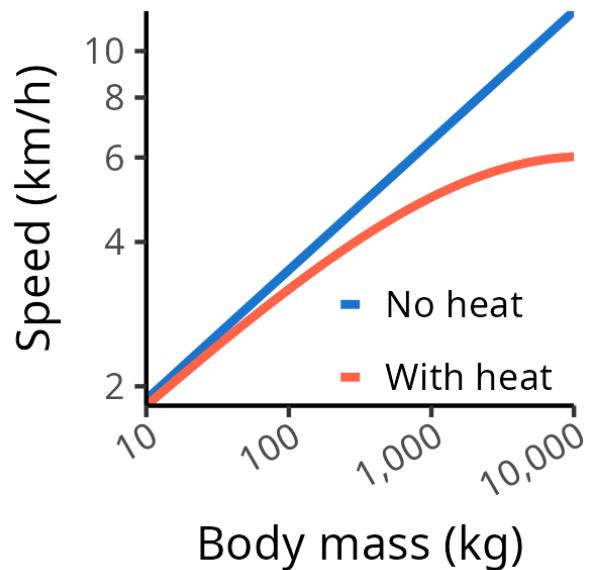


Figure 16: Predictions of optimal sustained travel speed for terrestrial animals. The two curves show the model commonly used in previous studies that does not include heat dissipation processes (blue) and the new model developed in 41, which includes heat (red) and best explains the empirical data. The sustained travel speed of large animals is strongly influenced by heat dissipation processes. The coefficients of the were curves extracted from [41].

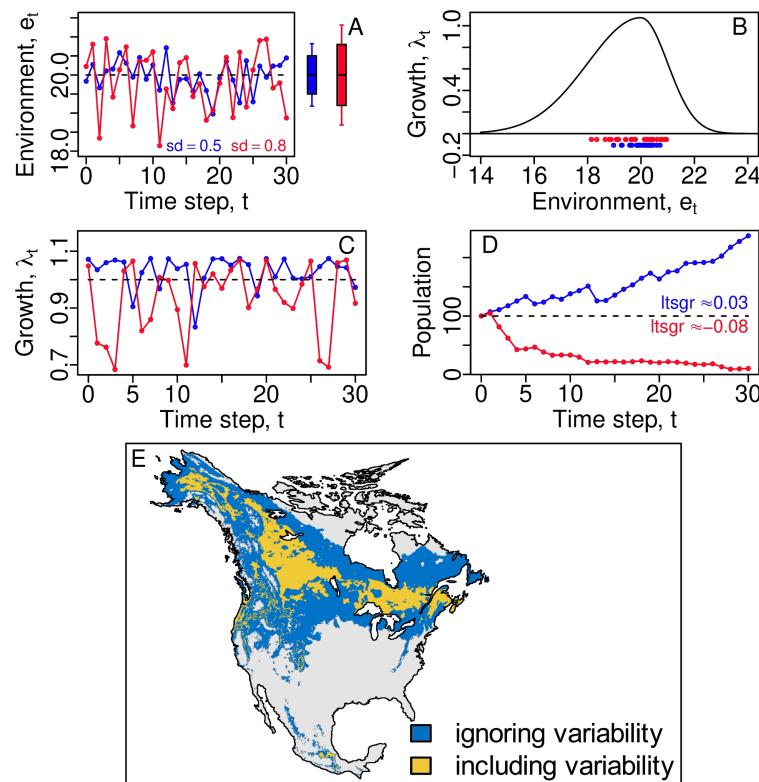


Figure 17: Illustration of how inter-annual environmental variability can alter population viability and how stochastic demography can account for this effect. A) Two distinct locations (red and blue points/lines in all panels) have identical average environmental conditions, but different degrees of inter-annual variability (sd = standard deviation). If the annual net growth rate (λ_t) is a function of the environment as in panel B, then differences in environmental variance can produce large differences in the time series of growth rates (C), which lead to dramatic differences in survival outcomes of the population (D). The long-term stochastic growth rate ($ltsgr$), a concept borrowed from stochastic demography, accurately captures population viability in these two scenarios. E) The projected environmental suitability can drastically differ when accounting or not for inter-annual variability.

Table 2: Relevance of the themes for ecosystem services assessment. Relevance is shown only for themes that directly link ecosystem functions to services.

Essential functions or structures for the supply of a service	Food	Wood production	Production energy crops	Venison	Pollination	Pest control	Global climate regulation	Nutrient regulation	Green space outdoor activities	Natura 2000	Green infrastructure
	Provisioning ES			Regulating ES				Cultural ES	Nature conservation		
Primary production	1.2, 1.3, 3.2	1.2, 1.3, 3.2	1.2, 1.3, 3.2				1.2, 1.3, 3.2	1.2, 1.3, 3.2			
Animal production	1.3, 3.2			1.3, 3.2				1.3, 1.4, 1.6, 3.1, 3.2			
Soil formation & Nutrient availability / -cycling								1.3, 1.4, 1.6, 3.1, 3.2			
Decomposition of organic material								1.3, 3.2			

	Food	Wood production	Production energy crops	Venison	Pollination	Pest control	Global climate regulation	Nutrient regulation	Green space outdoor activities	Natura 2000	Green infrastructure
Essential functions or structures for the supply of a service											
Carbon storage & carbon stock						1.2, 1.3, 3.2	1.2, 1.3, 3.2				
Pollination					1.1, 1.5						
Pest control						1.1, 1.3, 3.2					
Regulate population dynamics			1.1, 1.3, 3.2		1.1, 1.5	1.1, 1.3, 3.2					
Regulating ecosystem dynamics, succession		1.2, 1.3, 3.2						2.1, 2.2	2.3, 3.1		
Stability ecosystem processes & Ecosystem resilience										1.1, 1.5, 2.3, 3.2	

	Food	Wood production	Production energy crops	Venison	Pollination	Pest control	Global climate regulation	Nutrient regulation	Green space outdoor activities	Natura 2000	Green infrastructure
Development of complex ecological networks									2.1, 2.2	2.2, 2.3	1.6, 2.3, 3.1
Develop ecosystem diversity / habitat quality									1.4, 1.5	2.3	

Adapted from ¹.

Colors are comparable with Figure 1.

