Title: **Biodiversity conservation** **in an uncertain world**

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**First paragraph**

Curbing biodiversity loss in a rapidly changing global environment is one of the great challenges of the 21st Century1,2. As land cover and climate change intensify, their impacts on biodiversity will be influenced by socio-political pressures, requiring, requiring targeted investment in projects that are as effective as possible. Here we show how socio-political pressures, land-use impacts and climate impacts can be incorporated into global biodiversity conservation planning. Doing so identifies different priority areas for conservation than conventional approaches, which identify areas predominantly based on measures of regional biodiversity or ecosystem services and do not incorporate multiple anthropogenic pressures. Areas such as [mention them] are identified as having relatively high biodiversity and low pressures, and may be priorities for developing protected area networks that are resilient to multiple aspects of anthropogenic change. We also identify key areas [mention them] that are indicated as priorities regardless of whether anthropogenic pressures are considered. Our approach allows for management agencies to include their own measures of anthropogenic pressures into conservation planning.

**Main text**

Protecting habitat is one of the best strategies for stemming the alarming loss in biodiversity3. However, rapid human-caused change creates uncertainty regarding decisions for establishing protected areas. Climate change, pressure for land use intensification (for example, from agricultural mosaics to intensive agriculture), and socio-political pressures create an urgent need to protect areas to buttress against future biodiversity loss. However, all of these factors will also affect the potential performance of candidate protected areas. To make effective use of limited resources, decision-making for future protected areas must account for these pressures.

Here, we show how accounting for governance pressures, land-use pressure and climate pressure can strongly influence decisions for conservation at a global scale. We also show how accounting for all of these anthropogenic pressures can identify key areas that may be most resilient to future change. In our analysis, we consider three broad categories of pressures: i) governance pressure, ii) land-use impacts, iii) climate impacts. For governance pressure, we use a national-scale metric that combines six governance indicators from Transparency International4 (Figure S1). For land-use impacts, we use methods of Kehoe et al.5 to estimate average biodiversity loss per land-use category (Figure S2). For climate impacts, we use the frequency of extreme heat events\*, at [X] scale. We consider the influence of each of these on allocating protection decisions at a global scale for all 30,930 known distributions of vertebrate species, and then consider them in combination, including solutions that account for all three types of pressures. Our methods use a flexible framework with which conservation agencies can account for future impacts that may be most important to them.

To identify candidate areas for protection, we build on a classical problem formulation from the systematic conservation planning literature, the minimum set problem, where the goal is to minimize the cost of a solution while reaching feature targets. We expand this approach to include multiple objectives accounting for varying anthropogenic pressures in the problem formulation. We use a hierarchical or lexicographic approach that assigns a priority to each objective, and optimizes for the objectives in decreasing priority order. At each step, the approach finds the best solution for the current objective, but only from among those that would not degrade the solution quality for higher-priority objectives.

We created eight planning scenarios using vertebrate species data from the IUCN Red List of Threatened Species and incorporating different combinations of the three pressure metrics, as well as one baseline scenario where we did not include any pressures, representing the classical approach to solving these kinds of conservation planning problems6. As our scenarios were aimed at building on the current protected area portfolio globally, we incorporated current protected areas in our solutions. For each scenario we set a 30% protection target for all vertebrate species, in line with guidelines from the IUCN7. To investigate the effects of including our three pressure metrics, we then compared the spatial representation of each scenario at the global and country scale. Last, we compared scenario results across the 14 terrestrial biomes of the world to investigate biome scale effects that accounting for our three pressure metrics would have.

We found that priority areas for conservation to meet the 30% target varied substantially among scenarios, despite relatively similar overall extent (Fig. 1; Table S1). At the national scale, results were very different among scenarios for some countries, but not others. For example, for Libya, which is suffering from conflict, as defined by the Worldwide Governance Indicator (WGI) on ‘Political Stability and Absence of Violence’, but has low predicted land use pressure and climate pressure (Figures S1-3), the scenario including governance pressure would lead to a selection of only 2.2% of Libya’s land area compared to the baseline scenario with 20.5% (Tables S2, S3). If the focus was on land use change or climate only, the area selected would be 21.6 and 25.4% respectively. Including all three metrics at the same time leads to a selection of 21.2% of Libya’s land area. In contrast, for Indonesia, a country of similar size to Libya but low levels of internal conflict the selected area varied only slightly, from 30.6% to 31.9% across scenarios. Comparing prioritization results across the 14 global biomes revealed considerable variation in biome representation across scenarios (Figure 3). The most pronounced variation was for temperate conifer forests with a total variation of 9.1% of biome area, ranging from 31.8% for the baseline scenario, to 39.5% for the scenario incorporating governance and land use constraints. Mangroves had the second highest total variation of 6.5%, ranging from 36.8% of the biome areas for the scenario only considering governance constraints, to 43.2% for the scenario only considering the land use constraint. In contrast, Mediterranean forests or Montane Grasslands had a total variation of less than 0.72% across all scenarios.

Despite differences in areas selected among scenarios, the scenario that incorporated all three pressure metrics required only 1.09% more global area than the base scenario to meet the 30% of home range protection target (29.17% vs 28.07% of global area). This is encouraging because it means that we can account for these important pressures to produce more effective and resilient conservation networks, while not substantially increasing the global area required to meet the 30% protection targets. In addition, we found that all eight scenarios reached their goals of 30% of the range of each species, without surpassing the 30% global area target that the Convention on Biological Diversity (CBD) is currently considering as post-Aichi targets.

Encouragingly, there was considerable spatial overlap among scenarios, with the same 10.1 million km2 (6.9% of global land area) being selected to expand the current protected area portfolio in at least five scenarios and 2.21 million km2 (1.5% of global land area) in all eight scenarios. Such overlaps provide examples of areas that could be targets for international agencies wishing to maximize the resilience of protected area networks. Example countries that have contiguous areas of high overlap among scenarios are Canada (Yukon Territory), Egypt, Finland, Kazakhstan and Peru (Figure S4). There is some overlap with global biodiversity hotspots8, but a considerable percentage of high overlap among scenarios areas lies either outside these hotspots (XX %) or occurs withing small portions of these areas.

It is important to note that our specific metrics of anthropogenic pressures are intended as examples, used to demonstrate the importance of considering governance, land use and climate pressures in combination. Our framework is flexible, allowing conservation agencies looking to set global or national or even smaller-scale priorities could use different metrics. It is also important to note that [SHOULD WE MENTION SOMETHING ABOUT UNCERTAINTY IN THE PARAMETERS THEMSELVES? IN OTHER WORDS, WE DEVISE PARAMETERS TO ACCOUNT FOR UNCERTAINTY BUT THE PARAMETERS THEMSELVES ARE SUBJECT TO UNCERTAINTY – WE HAVE NOT DONE A SENSITIVITY ANALYSIS. COULD WE INDICATE POTENTIAL UTILITY OF SENSITIVITY ANALYSIS TO INDICATE PARAMETERS THAT MOST INFLUENCE DIFFERENCES IN SOLUTIONS, SO INDIVIDUAL AGENCIES CAN DETERMINE WHICH ONES THEY MIGHT BE ABLE TO EITHER TRY TO INFLUENCE – E.G. LAND USE CHANGE, OR BUFFER AGAINST? ].[2 SENTENCES ON WHAT PREVIOUS ANALYSES HAVE DONE? SOME HAVE CONSIDERED EACH OF THESE THINGS SEPARATELY, NONE HAVE CONSIDERED ALLTOGETHER?] Our results show that protected area expansion decisions can be profoundly influenced by all three factors. Where data are on these or other factors that may affect the effectiveness of biodiversity protection are available and reasonably reliable, we argue that they should therefore be used together to support decisions for resilient protected area networks. Our framework and methods can allow management agencies to do so, and also to explore the influence of individual parameters on decisions.

A main strength of our approach is that a range of constraints and uncertainties can be incorporated into the conservation planning effort at the same time, which leads to conservation planning solutions are more resilient to anticipated future changes due governance, land-use, and climate uncertainties. Our example of protecting 30% of the ranges for threatened species globally suggests that accounting for anthropogenic pressures and uncertainties can greatly influence conservation decisions, especially in areas where specific pressures predominate. We argue that this leads to more resilient and effective conservation plans into the future to help safeguard our planet’s biodiversity in the face of the current extinction and climate crises.

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**Figure legends (+ figures)**

Figure 1: multi-panel individual scenario results



Figure 2: Scenario overlap. orange = protected areas. Color gradient from orange (one scenario) to dark blue (eight scenarios) = ovelap.



Figure 3: Spider plot biomes vs scenarios. % values are in relation to base value results. Could also do how much of each biome was selected, but that’s not very informative (see small figure below). I’m also not convinced that those spider plots are easy to read, might be better with x = biome, y = value and colors = scenarios plot. They do look nice though and are probably something Nature type journals like a lot.



**Methods**

We used a multi-objective optimization approach that incorporated governance, land use and climate constraints to prioritize the conservation of 30,930 species. All scenarios we investigated were built on the current global protected area portfolio. We further set a target to protect 30% of the range of each species, based on current CDB discussions on post-2020 biodiversity targets.

*Species selection*

Our species lists were determined using the IUCN Red List of threatened species, following Pouzols et al. (2014). For mammal, amphibian and reptile species ranges, we used the IUCN Red List website (<http://www.iucnredlist.org/>, accessed 2019-11-14) and for birds we used the BirdLife International data zone webpage (<http://www.birdlife.org/datazone/home>, accessed 2019-11-14). We used these taxa because no analogous data are available for a lower proportion of species in other taxonomic groups such as insects10. These data have certain limitations, including possible underestimation of the extent of occurrence and overestimation of the true area of occupancy 9, but have been shown to be robust to commission errors as long as the focus is on species assemblages rather than single species, 11. They are currently the most frequently used and updated source for vertebrate species distributions 12.

For each taxonomic group, we restricted our analysis to species that fell into the presence category of ‘Extant’, the origin categories of ‘Native’ or ‘Reintroduced’ and the seasonality categories ‘Resident’, ‘Breeding Season’ or ‘Non-breeding Season’, thus only focusing on stationary periods of the life cycle of migratory species. This resulted in the following final numbers of amphibian, bird, mammal and reptile species ranges: 5660, 13375, 5442, 6153.

*Basic administrative delineations*

National boundaries were derived from the Global Administrative Areas database (<http://gadm.org/>, accessed 2019-10-31).

We obtained protected area boundaries from the World Database on Protected Areas (WDPA, [https://www.protectedplanet.net](https://www.protectedplanet.net/)). Following standard procedures for cleaning the protected area dataset13,14, we (i) projected the data to an equal-area coordinate (World Behrman) (ii) excluded reserves with unknown or proposed designations, (iii) excluded UNESCO Biosphere Reserves15, (iv) buffered sites represented as point localities to their reported area, (v) dissolved boundaries to prevent issues with overlapping areas, and (vi) removed slivers (code available at https://github.com/jeffreyhanson/global-protected-areas). After the protected area data, we overlaid the protected area boundaries with a 10 x 10 km grid covering the Earth. These spatial data procedures were completed using ArcMap (version 10.3.1) and python (version 2.7.8).

*Governance pressure*

Conservation risk due to governance can affect the outcomes of strategies, and effective governance can promote the resilience of conservation in the face of sociopolitical and economic shocks. We used worldwide governance indicators from the World Bank18 to capture these pressures. The indicators include six scaled measures: voice and accountability; political stability and absence of violence; government effectiveness; regulatory quality; rule of law; and control of corruption (see Table S4 for definitions). We chose these indicators because evidence suggests that protected area effectiveness16 and state investment and efforts for biodiversity conservation17 are reliably predicted by them. For each country, we used a mean of annual averages of all six measures17 (Figure S1).

*Land use pressure*

We used a recent global land systems mapped produced by Kehoe et al.5. This is based on a global land systems map for the year 200019 at a 9.25km2 resolution, but makes use of the most recent land-cover and land-use datasets and has a finer resolution of 1km2. Kehoe et al.5 further estimated the impact of land use and land use intensity on biodiversity, with data originating from the PREDICTS project20. They first matched their land-systems classes to varying intensity levels for each land-use type (for detailed conversion table, see ref21). This allowed Kehoe et al. to calculate average biodiversity loss per land system (relative to an unimpacted baseline) by taking the mean model estimates of biodiversity loss per land-use intensity class from previous work21. The result gives average relative biodiversity gain or loss per land system. Here, we used their modelled mean estimates (following Newbold et al.21) of relative percent biodiversity change for each Land System for species abundance as a measure of the land-use pressure (Figure S2).

*Climate pressure (text largely adopted from Frank’s paper)*

There is evidence that the increased exposure to extreme heat events (EHE) adversely affects human populations (Anderson & Bell Michelle, 2011; Battisti & Naylor, 2009; Guo et al., 2017; Mitchell et al., 2016) and natural systems within terrestrial (Harris et al., 2018; Maxwell et al., 2019) and marine environments (Garrabou et al., 2009; Wernberg et al., 2013). How the frequency and duration of EHE has changed over time has been explored primarily within terrestrial regions during the boreal and austral summers (Coumou & Robinson, 2013; Oswald, 2018), but there are examples that have considered other seasons of the year (Alexander et al., 2006). There are a number of climate indices that have been used to estimate the occurrence of extreme heat events (Fenner et al., 2019; Smith et al., 2013). These climate indices are often context specific and there is little consensus on 79 the most appropriate technique (McPhillips et al., 2018). Here, we define the occurrence of extreme heat events using a probabilistic framework that estimates the novelty of each event relative to historical year-to-year variation in temperature at each location. Specifically, we use detrended daily measures of minimum and maximum temperature to estimate when and where temperatures significantly exceed historical variation in temperature over a 71-year period (1948 to 2018). This approach provides a standardized measure of the novelty of climate extremes that allows for valid comparisons across space and time. We use this approach to determine how the frequency and duration of EHE have changed over time and the regions and seasons where these events are likely to have the most significant effects on natural systems and human populations now and into the future.

The metric we used here is the duration of each event within each year and pixel based on the number of consecutive days containing EHE. We extracted the maximum continuous duration of each event for each year and pixel. We selected the maximum because it provided improved distributional properties for analysis and identifies the most significant event for each year. We averaged the maximum duration of each event within each pixel across the 71-year period. We modeled the change in the maximum duration in each event over the 71-year period using Poisson regression (Lambert, 1992).

Figure S3

*Multi-objective optimization of pressure reduction*

We processed all data described before to a 10 x 10 km resolution and clipped data to the extent of land based on the global administrative areas database.

Here, we developed an extension on the minimum set problem, which has the goal to identify a set of sites within a planning area that represents all conservation targets in the fewest number of sites 22. Instead of including one objective we are expanding the formulation to include multiple objectives in the problem formulation. We use a hierarchical or lexicographic approach that assigns a priority to each objective, and optimizes for the objectives in decreasing priority order. At each step, it finds the best solution for the current objective, but only from among those that would not degrade the solution quality for higher-priority objectives. We considered up to three objectives in our prioritization scenarios, i) governance pressure, ii) land-use pressure, and iii) climate pressure. To compare different pressure scenarios we calculated solutions for each unique objective combination (n = 7), as well as one where we use a constant objective function as the base scenario.

For all scenarios we locked in current protected areas and used the same feature set of 30930 vertebrates. The target for each feature was set to 30% of their range. The optimality gap we use was 5% for each objective in the hierarchy. We started the hierarchy with the governance constraint, followed by the land use and climate constraints to reflect the immediacy of each pressure on current biodiversity (governance best predictor for success currently; land use higher current impact than climate). The order of the hierarchy does matter, which is why its important to specify and justify the importance of constraints in the hierarchy before running the analysis.

**Methods references**

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**Author contributions**

**Competing interest declaration**

**Table S1**. Global land area required to reach 30% target. S = governance, L = land use, C = climate, A = area.

|  |  |  |
| --- | --- | --- |
|  | % total | % increase |
| SLCA\_0001 | 28.08 | 16.36 |
| SLCA\_1001 | 28.43 | 16.71 |
| SLCA\_0101 | 29.23 | 17.51 |
| SLCA\_1101 | 29.19 | 17.47 |
| SLCA\_0011 | 28.45 | 16.73 |
| SLCA\_1011 | 28.43 | 16.71 |
| SLCA\_0111 | 28.7 | 16.98 |
| SLCA\_1111 | 29.17 | 17.45 |

**Table S2**. Summary of country specific results. Values are in relation to the baseline scenario (fraction of set aside in a country per scenarios over baseline), which represents a value of 1.

|  |  |  |  |  |  |
| --- | --- | --- | --- | --- | --- |
| scenario | mean | min | max | low | high |
| SLCA\_1001 | 1.19 | 0.00 | 8.23 | 0.52 | 2.63 |
| SLCA\_0101 | 1.13 | 0.21 | 4.38 | 0.75 | 1.52 |
| SLCA\_1101 | 1.13 | 0.21 | 4.38 | 0.75 | 1.55 |
| SLCA\_0011 | 1.04 | 0.11 | 3.10 | 0.84 | 1.47 |
| SLCA\_1011 | 1.18 | 0.00 | 8.15 | 0.53 | 2.63 |
| SLCA\_0111 | 1.09 | 0.39 | 4.38 | 0.79 | 1.47 |
| SLCA\_1111 | 1.13 | 0.29 | 4.63 | 0.73 | 1.51 |

**Table S3**. CSV file with details for each country.

**Table S4.**

|  |  |
| --- | --- |
| **Indicator** | **Definition**  Source: World Bank, 2020 (<https://datacatalog.worldbank.org/dataset/worldwide-governance-indicators>) |
| Voice and accountability | “Voice and accountability captures perceptions of the extent to which a country's citizens are able to participate in selecting their government, as well as freedom of expression, freedom of association, and a free media.” |
| Political stability and absence of violence | “Political Stability and Absence of Violence/Terrorism measures perceptions of the likelihood of political instability and/or politically-motivated violence, including terrorism.” |
| Government effectiveness | “Government effectiveness captures perceptions of the quality of public services, the quality of the civil service and the degree of its independence from political pressures, the quality of policy formulation and implementation, and the credibility of the government's commitment to such policies.” |
| Regulatory quality | “Regulatory quality captures perceptions of the ability of the government to formulate and implement sound policies and regulations that permit and promote private sector development.” |
| Rule of law | “Rule of law captures perceptions of the extent to which agents have confidence in and abide by the rules of society, and in particular the quality of contract enforcement, property rights, the police, and the courts, as well as the likelihood of crime and violence.” |
| Control of corruption | “Control of corruption captures perceptions of the extent to which public power is exercised for private gain, including both petty and grand forms of corruption, as well as "capture" of the state by elites and private interests.” |

**Figure S1. Governance (green = good, red = bad)**



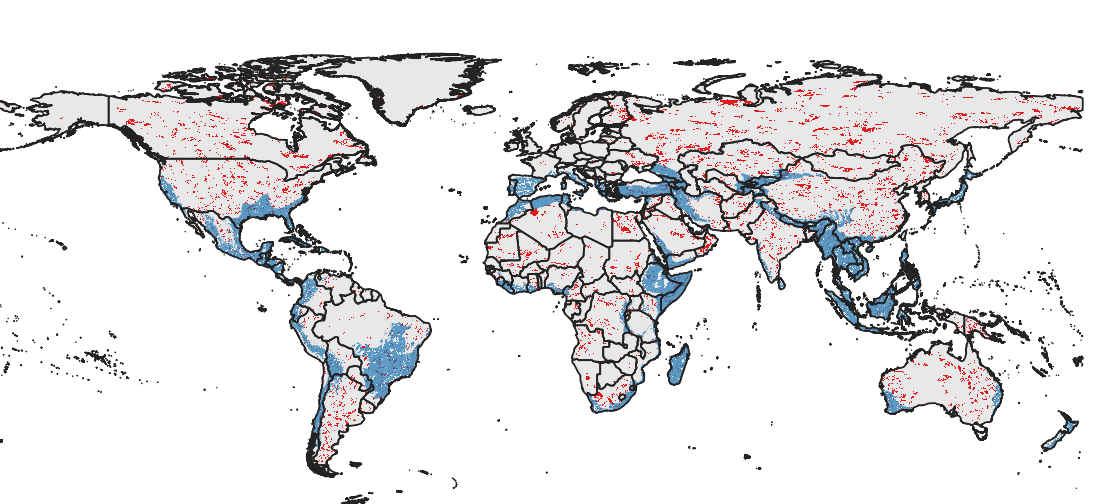
**Figure S2. Land use (green = good, red = bad)**



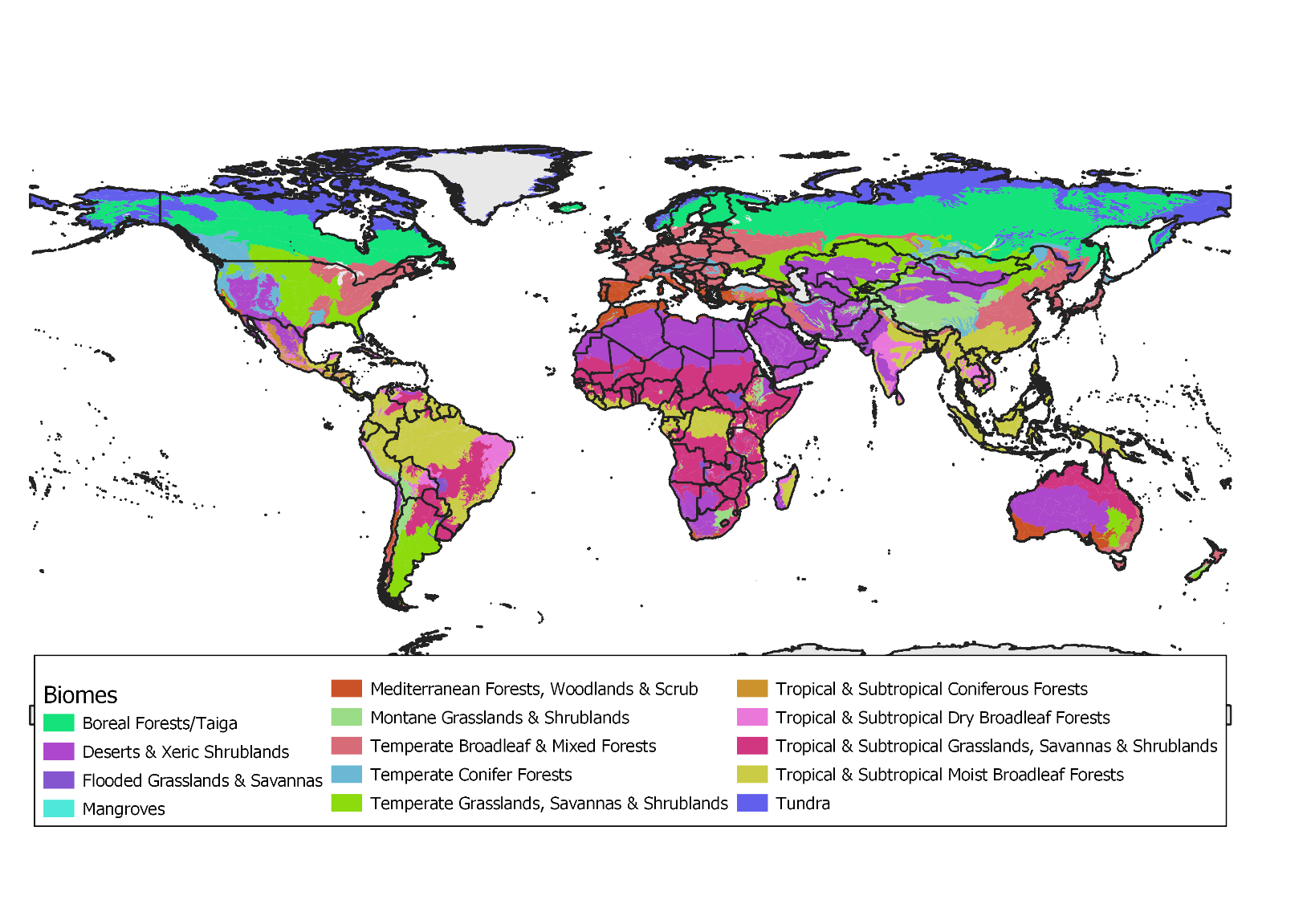
**Figure S3. Climate (extreme heat events) (green = good, red = bad)**



**Figure S4. Areas of high scenario overlap (>5 scenarios, red) compared to Meyers et al. biodiversity hotspots (blue).**



**Figure S5. Biomes**

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