

Climate change: The 2015 Paris Agreement thresholds and Mediterranean basin ecosystems

Joel Guiot, Wolfgang Cramer

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SUPPLEMENTARY MATERIALS

www.sciencemag.org/content/354/6311/459/suppl/DC1 Materials and Methods Figs. S1 to S7 References (38-41)

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CLIMATE CHANGE

Climate change: The 2015 Paris Agreement thresholds and Mediterranean basin ecosystems

Joel Guiot^{1*} and Wolfgang Cramer²

The United Nations Framework Convention on Climate Change Paris Agreement of December 2015 aims to maintain the global average warming well below 2°C above the preindustrial level. In the Mediterranean basin, recent pollen-based reconstructions of climate and ecosystem variability over the past 10,000 years provide insights regarding the implications of warming thresholds for biodiversity and land-use potential. We compare scenarios of climate-driven future change in land ecosystems with reconstructed ecosystem dynamics during the past 10,000 years. Only a 1.5°C warming scenario permits ecosystems to remain within the Holocene variability. At or above 2°C of warming, climatic change will generate Mediterranean land ecosystem changes that are unmatched in the Holocene, a period characterized by recurring precipitation deficits rather than temperature anomalies.

he United Nations Framework Convention on Climate Change (UNFCCC) Paris Agreement of December 2015 aims "to hold the increase in the global average temperature to below 2°C above preindustrial levels and to pursue efforts to limit the temperature increase to 1.5°C...." For many regions of the world, achieving the global 2°C target would still imply substantially higher average temperatures, with daily maxima reaching extreme values (1). Recent ~1°C warming has caused damage in many systems already today (2). The degree to which future damage could be avoided by ambitious warming thresholds is uncertain. Regional temperatures in the

Mediterranean basin are now ~1.3°C higher than during 1880–1920, compared with an increase of ~0.85°C worldwide (Fig. 1). The difference between (global) warming of 1.5° and >2°C above preindustrial levels is critically important for adaptation policies in the Mediterranean region, notably with respect to land-use systems and the conservation of biodiversity. Simulations with impact models have shed some light on the risks and sensitivities to climate change, but they face limitations when applied at the regional scale and for low levels of warming (*3*).

To assess the regional effects of different Paris Agreement thresholds for the Mediterranean basin, the Holocene reconstruction of spatiotemporal ecosystem dynamics from pollen allows the development of reliable scenarios of climate-driven change in land ecosystems (4). Despite the effects of human land use, broader-scale past ecosystem dynamics have been mostly driven by regional climate change.

Mediterranean basin ecosystems are a hot spot of the world's biodiversity (5) and supply numerous services to people, including clean water, flood protection, carbon storage, and recreation. Thus, the broad-scale vulnerability of ecosystems to climate change can be used as an indicator of the importance of the warming thresholds identified by the Paris Agreement for the environment and human well-being. Given the confidence with which past ecosystems and climate change can be reconstructed from numerous pollen profiles, the development and validation of more reliable numerical models for the ecosystem-climate relationship have become possible. We apply such an approach to future climate conditions, using simulations from the Coupled Model Intercomparison Project phase 5 (CMIP5) for three different greenhouse gas (GHG) forcings [see table S2 and (6) for details]. An analysis of the annual mean temperatures for these three scenarios for all climate models at the global and Mediterranean scale, an observational time series, and a spatiotemporal historical reconstruction at the Mediterranean scale (Fig. 1) indicate that (i) the projected warming in the Mediterranean basin exceeds the global trend for most simulations; (ii) the first decade of the 21st century has already surpassed the Holocene temperature variability; (iii) the global warming, but also the regional warming, is approximately a linear function of the CO₂ concentration; and (iv) only a few simulations provide global warming lower than 2°C at the end of the 21st century.

Mediterranean land ecosystems are sensitive not only to warming but also to changes in water availability. Even if past variations in precipitation and their projections for the future are spatially more heterogeneous than temperature fields (7), for most scenarios, the changes in both fields will combine to reduce water availability and trigger losses of Mediterranean ecosystems and their biodiversity during the coming decades (8-10). During the Holocene (especially in the second half of this epoch), periods of precipitation deficits have occurred, but in contrast to the 21st-century situation, temperatures did not rise above the present average (Fig. 1) (4). These periods of precipitation deficits [~6 to ~5.2, ~4.2 to \sim 4, and \sim 3.1 to \sim 2.9 thousand years before the present (yr B.P.)] have been identified as possible

¹Aix-Marseille Université, CNRS, Institut de Recherche pour le Développement (IRD), Collège de France, Centre Européen de Recherche et d'Enseignement de Géosciences de l'Environnement (CEREGE), Ecosystèmes Continentaux et Risques Environnementaux (ECCOREV), Aix-en-Provence, France. ²Mediterranean Institute for Biodiversity and Ecology (IMBE), Aix-Marseille Université, CNRS, IRD, Avignon University, 13545 Aix-en-Provence, France. *Corresponding author. Email: guiot@cerege.fr

Fig. 1. Annual temperature change (from the preindustrial mean) versus CO₂ atmospheric concentrations. Colored boxes represent the Intergovernmental Panel on Climate Change RCP scenarios for 2010-2100 (25th, 50th, and 75th percentiles): RCP2.5 (green), RCP4.5 (orange), and RCP8.5 (red). Solid blue circles with vertical bars concern the same three scenarios for the Mediterranean region (10°W to 45°E, 28°N to 48°N). For the Holocene, the blue circles with cyan error bars (1σ) are derived from climate reconstructions from pollen for each century from 10,000 to 100 yr B.P. by steps of 100 years (4) (the variability is multiplied by a factor of 3 to account for the fact that the time resolution is 100 years instead of 10-year averages for the scenarios). The vertical bars represent the ±1 SDs provided by the reconstruction method. The mediumsized 1901-2009 circles are the Climatic Research Unit TS3.1 gridded observations (20) averaged in the same area and smoothed with a time step of 10 years. The vertical bars represent the corresponding SDs. The horizontal lines indicate the preindustrial mean temperature and the three thresholds referred to in the Paris Agreement (1.5°, 2°, and 3°C). The black regression line is based on the three global scenarios. ppmv, parts per million by volume.

causes of declines or collapses in civilization in the eastern Mediterranean region (*11–13*). A recent study (*14*) has attributed important crop failures in Syria to two strong drought episodes characterized by a lack of precipitation (reduced by up to 30% in the 6-month winter season) and high temperatures (warming of 0.5° to 1.0° C in the annual mean relative to the 20th-century average)—in the eastern Mediterranean between 1998 and 2010. The 1998–2012 period was the driest of the last 500 years (*15*). Even if societal



Annual temperature: Holocene to late 21st century

factors have likely been the primary causes of these crises (*16*, *17*), Holocene droughts and the associated variability in land productivity may have also played a role, indicating the potential effect of climate change on agriculture-based economies.

To relate the past variability of climate and ecosystems with possible future conditions, we use the process-based ecosystem model BIOME4 (*6*), which, when compared with correlation techniques, allows a more reliable reconstruc-





Fig. 2. Proportion of grid cells with a biome change relative to the preindustrial period for the Mediterranean area (10°W to 45°E, 28°N to 48°N). The horizontal axis represents the time scale, in years before the present (20th century) for the past (negative numbers) and in years after the present (CE 2000–2010) for the future (positive numbers). Holocene biomes (in black) are based on reconstructions from pollen data (4). Colored lines are given by the BIOME4 model as applied to the RCP projections (see text). Horizontal lines represent the 50th, 80th, 90th, and 99th percentiles of the Holocene values. The colored areas illustrate the interquartile interval provided by the intermodel variability.

tion of past climate-vegetation equilibria. Direct human impacts, such as the cultivation of crops or degradation processes, are not taken into account. For the Holocene, BIOME4 was inverted to generate gridded climate patterns by time steps of 100 years and associated ecosystems ("biomes") from pollen records (4). For the future, the forward application of the same model yields ecosystem distributions from climate projections (6). The limitations of a relatively simple ecosystem model are largely offset by two factors. First, this method directly relates the physical environment, including its seasonal variability, and atmospheric CO₂ to plant processes and thereby avoids the strong assumptions made by niche models (18). Second, past observations are analyzed with the same processbased model that is used for the future projections, thus providing a more coherent framework for the assessment.

Figure 2 indicates reconstructed and estimated shifts in the distribution of major Mediterranean biomes (temperate conifer forest, deciduous forest, warm mixed forest, xerophytic shrubland, and steppe) over time for the past and future, relative to their current distribution. During the Holocene, only up to 15% of the land has had different ecosystems from those existing today at any moment. The 10% level was exceeded only during eight 100-year time slices, and all of these periods occurred before 4200 yr B.P. All of these were relatively humid periods, which became less frequent after this date (4). The past four millennia, and notably the past century, were generally dry compared with the first half of the Holocene.

The future is represented by the following three classes of simulated time-space fields



Fig. 3. Mediterranean biome maps. Distribution of Mediterranean biomes (**A**) reconstructed (rec) from pollen for the present; (**B**) reconstructed from pollen for 4700 yr B.P.; (**C**) simulated by the BIOME4 model for the present; and (**D** to **G**) for scenarios RCP2.6L, RCP2.6, RCP4.5, and RCP8.5, respectively, at the end of the 21st century. For the simulations, each point indicates the most frequent biome in the ensemble of CMIP5 climate simulations. Map (**H**) indicates, for each point, the number of scenarios different from the simulated present. Yellow areas indicate when only RCP8.5 is different; orange areas denote when RCP4.5 and RCP8.5 are different; red areas indicate when RCP2.6, RCP4.5, and RCP8.5 are different; and blue circles mark areas in which the biome type at 4700 yr B.P. is different from the present biome type.

of temperature and rainfall, which are derived from the CMIP5 project (table S2): Representative Concentration Pathway 8.5 (RCP8.5) (22 simulations), RCP4.5 (23 simulations), and RCP2.6 (16 simulations). RCP2.6 approximates the 2°C target. To assess the 1.5°C target, we created a fourth class (denoted RCP2.6L) from selected CMIP5 scenarios [see (6) for details]. Up to 2030, all four classes generate similar ecosystem distributions and generally remain within the bounds of Holocene fluctuations. By the end of the 21st century, RCP2.6L remains in the range of the 80th and 99th percentiles of the Holocene, whereas RCP2.6 simulates Mediterranean ecosystems as they were during the most extreme period of the Holocene (at 4700 yr B.P.), with a change of 12 to 15%.

The limits of the Mediterranean vegetation types defined by biogeographers (19) broadly coincide with our simulated warm mixed forest biome (Fig. 3A), with the following two exceptions: (i) Simulated warm mixed forests also extend to the Atlantic Ocean in the west of France, indicating the inability of BIOME4 to distinguish Atlantic pine forests, and (ii) the narrow strip of Mediterranean vegetation on the Libyan and Egyptian coast, which is below the spatial resolution of our climatic data. The reconstruction for the period of the Holocene (4700 yr B.P.) (Fig. 3B) with the greatest difference from today (Fig. 3A) shows that the main differences are related to the further regression of forested areas in the southern Mediterranean associated with expanding desert areas.

Simulations for the RCP2.6L and RCP2.6 scenarios do not change biome distributions much at the end of the 21st century (Fig. 3, D to E). However, for the same period, the RCP4.5 scenario induces desert extension toward North Africa, the regression of alpine forests, and the extension of Mediterranean sclerophyllous vegetation. Under the RCP8.5 scenario, all of southern Spain turns into desert, deciduous forests invade most of the mountains, and Mediterranean vegetation replaces most of the deciduous forests in a large part of the Mediterranean basin. Figure 3H illustrates the variation from areas without any changes, regardless of scenario (stable white areas), to areas in which changes from scenario RCP2.6 already appear (red areas). As expected, the most-sensitive areas are those located at the limit between two biomesfor example, in the mountains at the transition between temperate and montane forest or in the southern Mediterranean at the transition between forest and desert biomes. The map for 4700 yr B.P., in which the past changes were among the highest (Fig. 3B), has the largest changes in the southwest, eastern steppe areas, and the mountains, but these changes are relatively sparse.

Our analysis shows that, in approximately one century, anthropogenic climate change without ambitious mitigation policies will likely alter ecosystems in the Mediterranean in a way that is without precedent during the past 10 millennia. Despite known uncertainties in climate models, GHG emission scenarios at the level of country commitments before the UNFCCC Paris Agreement will likely lead to the substantial expansion of deserts in much of southern Europe and northern Africa. The highly ambitious RCP2.6 scenario seems to be the only possible pathway toward more limited impacts. Only the coldest RCP2.6L simulations, which correspond broadly to the 1.5°C target of the Paris Agreement, allow ecosystem shifts to remain inside the limits experienced during the Holocene.

This analysis does not account for other human impacts on ecosystems, in addition to climate change (i.e., land-use change, urbanization, soil degradation, etc.), which have grown in importance after the mid-Holocene and have become dominant during the past centuries. Many of these effects are likely to become even stronger in the future because of the expanding human population and economic activity. Most land change processes reduce natural vegetation or they seal or degrade the soils, representing additional effects on ecosystems, which will enhance, rather than dampen, the biome shifts toward a drier state than estimated by this analysis. This assessment shows that, without ambitious climate targets, the potential for future managed or unmanaged ecosystems to host biodiversity or deliver services to society is likely to be greatly reduced by climate change and direct local effects.

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SUPPLEMENTARY MATERIALS

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GENE EXPRESSION

Xist recruits the X chromosome to the nuclear lamina to enable chromosome-wide silencing

Chun-Kan Chen,¹ Mario Blanco,¹ Constanza Jackson,¹ Erik Aznauryan,¹ Noah Ollikainen,¹ Christine Surka,¹ Amy Chow,¹ Andrea Cerase,² Patrick McDonel,³ Mitchell Guttman^{1*}

The Xist long noncoding RNA orchestrates X chromosome inactivation, a process that entails chromosome-wide silencing and remodeling of the three-dimensional (3D) structure of the X chromosome. Yet, it remains unclear whether these changes in nuclear structure are mediated by Xist and whether they are required for silencing. Here, we show that Xist directly interacts with the Lamin B receptor, an integral component of the nuclear lamina, and that this interaction is required for Xist-mediated silencing by recruiting the inactive X to the nuclear lamina and by doing so enables Xist to spread to actively transcribed genes across the X. Our results demonstrate that lamina recruitment changes the 3D structure of DNA, enabling Xist and its silencing proteins to spread across the X to silence transcription.

he Xist long noncoding RNA (lncRNA) initiates X chromosome inactivation (XCI), a process that entails chromosome-wide transcriptional silencing (*I*) and large-scale remodeling of the three-dimensional (3D) structure of the X chromosome (2–4), by spreading across the future inactive X chromosome and excluding RNA polymerase II (PoIII) (*I*, 5). Xist initially localizes to genomic DNA regions on the X chromosome that are not actively transcribed (6–8), before spreading to actively transcribed genes (7–9). Deletion of a highly conserved region of Xist that is required for transcriptional silencing, called the A-repeat (10), leads to a defect in Xist spreading (7) and spatial exclusion of active genes from the Xist-coated nuclear compartment (9). Whether these structural changes are required for, or merely a consequence of, transcriptional silencing mediated by the A-repeat of Xist remains unclear (7, 9). Recently, we and others identified by means of mass spectrometry the proteins that interact with Xist (11–13). One of these proteins is the Lamin B receptor (LBR) (11, 13), a transmembrane protein that is anchored in the inner nuclear membrane, binds to Lamin B.





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Editor's Summary

A warming limit for the Mediterranean basin

Pollen cores from sediments provide rich detail on the history of vegetation and climate in the Mediterranean during the Holocene (the most recent ~10,000 years). Guiot and Cramer used this information as a baseline against which to compare predictions of future climate and vegetation under different climate-change scenarios. Vegetation and land-use systems observed in the Holocene records may persist under a 1.5° C warming above preindustrial temperature levels. A 2° C warming, however, is likely over the next century to produce ecosystems in the Mediterranean basin that have no analog in the past 10,000 years.

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Supplementary Materials for

Climate change: The 2015 Paris Agreement thresholds and Mediterranean basin ecosystems

Joel Guiot* and Wolfgang Cramer

*Corresponding author. Email: guiot@cerege.fr

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Materials and Methods

The reconstruction of Holocene climate and biomes (4) is based on the process-based equilibrium terrestrial biosphere model BIOME4 (21), which has been used in numerous regional to global scale studies (22). This model predicts structure and productivity of broad-scale land ecosystems from monthly temperature and rainfall values and annual CO_2 concentration. It uses a photosynthesis scheme that simulates acclimation of plants to changed atmospheric CO_2 by optimization of nitrogen allocation to foliage and by accounting for the effects of CO_2 on net assimilation, stomatal conductance, leaf area index (LAI) and ecosystem water balance. BIOME4 is based on sufficiently simple descriptions of ecophysiological processes to allow broad-scale application. It represents substantial advantages over nichemodels because it has not been tuned to reproduce present-day potential vegetation, but rather to simulate correctly the main processes underlying the potential vegetation distribution which are assumed to have been similar throughout the Holocene. BIOME4 does not account for human land use.

The inputs of the model are monthly average / total values of temperature, precipitation and cloudiness percentage, atmospheric CO_2 concentration, and (static) soil texture. The outputs include net primary production (NPP) of each of the potentially occurring 13 plant functional types (PFT), and the corresponding 'biome type', from a set of 28 broad categories (Table S1). To obtain a robust classification of ecosystem types suitable for the analysis of Mediterranean vegetation, compatible with current biogeographical knowledge of potential natural vegetation in the region (23), the 28 biome types provided by BIOME4 were aggregated into 11 groups (Table S1).

For the Holocene, pollen records from a large number of sources, initially percentages of a number of taxa (which can be species, genera or families according to possibilities of morphological differentiation), are grouped into pollen plant functional types (PFT) scores according to the "biomization" method adapted by (24). Using these data, BIOME4 is run in inverse mode, i.e. a large number of randomized climate conditions are tried at each time step and for each grid cell. For each of these, the NPP of all 13 PFT's is compared to PFT scores calculated from pollen (4). The climate conditions for which the simulated NPP matches best with the pollen-derived PFTs scores provide the reconstruction and hence the corresponding biome type. The atmospheric CO₂ concentration is provided by the ice cores at Taylor Dome, Antarctica (25) and the soil parameters are kept to the present values. Since the spatiotemporal patterns reflected by pollen diagrams are also influenced by historic land use, the reconstruction also reflects direct human impacts on ecosystems, however this effect is assumed to be relatively minor for most of the Holocene. Model outputs in this study are gridded climate and biome types on a coarse grid of 2° in latitude and 4° in longitude. To allow for direct comparison of reconstructed and projected biome patterns, we have interpolated the reconstructions to a common 1°x1° resolution.

For future projections, we use BIOME4 in forward mode, i.e. scenarios from climate simulations under different scenarios are used as inputs yielding the biome type generated by this climate. We use temperature and rainfall outputs from climate models assembled in CMIP5 (26), forced by three greenhouse gas radiative forcing (Representative Concentration Pathways, RCP) (27). RCP8.5 (GHG radiative forcing <8.5 W/m²) is the "business as usual" scenario. RCP4.5 corresponds to policies to maintain GHG radiative forcing below 4.5 W/m² and approximates the effort of mitigation contained in the intended nationally determined contributions (INDC) proposed by the governments at the Paris COP21. RCP2.6 corresponds to more ambitious mitigation policies, with a GHG radiative forcing constrained to remain

below 2.6 W/m². It is the only one able to limit the global warming to 2 °C. Constrained by the availability of simulation outputs in the CMIP5 archive, we use between 16 and 23 simulations performed by 13 climate modeling centers (Table S2). We also use for BIOME4 the atmospheric CO_2 concentrations related to these scenarios.

To correct for climate model bias and differences in spatial resolution, we use anomalies (projection minus control) of monthly temperature and precipitation values from all simulations. The anomalies are interpolated to a common grid of $1x1^{\circ}$ of longitude and latitude (2997 land grid cells for the Mediterranean basin) and then added to the present climate normal given by the CRU TS 3.23 data file (20). Climate projections from 2010 to 2100 are used as decadal monthly averages.

The mean global temperature simulated for the last 21^{st} century decade under the RCP2.6 scenario is about 2 °C above the pre-industrial temperature (Fig. 1). Among the simulations available, only two keep global warming below 1.5 °C throughout the 21^{st} century. To be able to calculate uncertainties based on realistic inter-model dispersion, we have constructed an additional low-warming scenario with variability comparable to the three RCP groups by selecting from all other 16 simulations those decades for which global warming happens to be lower than 1.5 °C. Assuming that the effect of changes in time-lagged systems such as large-scale ocean circulations are negligible (3), we adopt the following procedure: (i) for each decade of the 21^{st} century, we build a theoretical Gaussian probability distribution N(1.2 °C, S_k) of the global mean temperature anomaly where S_k is the standard deviation of the 16 global temperature simulations for decade k; (ii) we then sample a large number (say 1000) values from this distribution; (iii) each of these 1000 values is approximated by the closest simulation from the 16 original simulations of the ten decades. This provides a set of 1000 simulations compatible with the +1.5 °C threshold called RCP2.6L, which will be used for calculating the most probable biome in each grid cell.

BIOME4 is driven by monthly temperature and precipitation fields interpolated from climate model simulations; the monthly cloudiness (%) fields are calculated by linear regression from the temperature and precipitation values (28); the soil parameters are kept to the present values. We use the CO_2 atmospheric concentration time-series used by CMIP5 (27). High levels of CO_2 enable to enhance photosynthesis and to increase the water use efficiency of the vegetation. These processes, not discussed here, are taken into account in the future projections of biome type distribution, as they may partly compensate the increase of evapotranspiration projected for the future. Examples of biome maps are given in Fig. 3.

To estimate the magnitude of the effect of climatic change on the aggregated 11 ecosystem types, we calculate the number of biome type changes across the 2997 grid cells for each of the model simulations relative to the estimated current distribution, i.e. the simulation at 2000-2010 by RCP2.6 for the future scenarios (Fig.3A) and the reconstruction based on the CRU TS 3.23 climate field (Fig. 3E). The time-series of biome changes are given in Fig. 2: the Holocene changes by steps of 100 years for the past (10,000 to 0 years BP) and the future changes by steps of 10 years for the future (0 to 100 years after Present).

The uncertainties on the projections are restricted to the dispersion between the climate simulations which are directly propagated to the proportions of biome type changes. There is no possibility to take into account the deviations between the mean climate simulation and the true climate, nor those between simulated and true vegetation. For the Holocene, the method enables to calculate the uncertainties on the climate reconstructions (see the error bars for the annual temperature in Fig. 1), but not on the biome type. We assume that the temporal variability of the biome type changes is a better estimate of the biome uncertainty than the within grid cell variability.

Fig. 3 illustrates this design. The maps have a resolution of 1°x1°. Fig. 3A is obtained from BIOME4 inversion based on present day (last century) pollen data. Fig. 3B is obtained in the same way for the pollen data on the 4650-4750 yr BP time slice. The grid cells where the biome type has changed between both periods are indicated with blue circles in Fig. 3H. The changes are mainly in Northern Africa at the interface of the desert and in the mountains areas of Near East, Anatolia, the Balkans and the Alps. Fig. 3C represents the biome distribution simulated by BIOME4 from present climate. The main difference with the pollen reconstruction in Fig. 3A is that BIOME4 simulates temperate deciduous forest in many areas where are reconstructed warm mixed forest from pollen. This is likely due to an overrepresentation of pine pollen in pollen data. Fig. 3D, 3E, 3F and 3G are forward biome simulations by BIOME4 from climate projections at the end of the 21st century. The four maps shows the gradient between a "1.5 °C world" to a "4 °C world" with a progressive extension of deserts and a regression of cool and alpine forest. This is summarized by Fig. 3H, which shows that the proportion of grid cells with a biome change is relatively low with RCP2.6L scenario (7% in red), increasing to 13% (in orange) with RCP2.6, to 17% (in yellow) with RCP4.5 and to 31% (in yellow) with RCP8.5.

Table S1.

Correspondence between the biome types simulated by BIOME4 and the aggregated biome types used in this study

N°	BIOME4 type	Aggregated biome type
1	Tropical evergreen forest, tropical semi-deciduous	Tropical forest
	forest, tropical deciduous forest/woodland, temperate	
	broadleaved savannah	
2	Temperate deciduous forest, temperate conifer forest	Temperate deciduous forest
3	Warm mixed forest, temperate xerophytic shrubland,	Warm mixed forest
	temperate sclerophyll woodland	
4	Cool mixed forest	Cool mixed forest
5	Cool conifer forest, open conifer woodland	Cool conifer forest
6	Evergreen taiga/montane forest, deciduous	Alpine forest (taiga)
	taiga/montane forest, cold mixed forest, boreal parkland	
7	Tropical grassland, tropical savannah	Tropical steppes
8	Desert, tropical xerophytic shrubland	Desert
9	Temperate grassland	Temperate steppes
10	Steppe tundra, shrub tundra, dwarf shrub tundra,	Alpine meadows (tundra)
	prostrate shrub tundra, cushion forb lichen moss tundra	
11	Barren, land ice	Barren soil, ice

Table S2.

CMIP5 simulation	ns (code of model,	institute nat	me); crosses	indicate	if the	model is	used for	r
the scenario.								

Model	Institute	RCP2.6	RCP4.5	RCP8.5
bcc-csm1-1	Beijing Climate Center, China Meteorological Administration	Х	Х	Х
bcc-csm1-1-m	Beijing Climate Center, China Meteorological Administration	Х	Х	Х
CanESM2	Canadian Centre for Climate modelling, Canada	Х	Х	Х
CESM1-BGC	Community Earth System Model Contributors, NSF-DOE- NCAR, USA		Х	
CESM1-CAM5	Community Earth System Model Contributors, NSF-DOE- NCAR, USA		Х	
CMCC-CM	Centro Euro-Med per Cambiamenti Climatici, Italy		Х	Х
CMCC-CMS	Centro Euro-Med per Cambiamenti Climatici, Italy		Х	Х
CMCC-CESM	Centro Euro-Med per Cambiamenti Climatici, Italy			Х
CNRM-CM5	Centre National de Recherches Météorologiques / Centre Européen de Recherche et Formation Avancée en Calcul Scientifique, France	Х	Х	Х
GFDL-CM3	NOAA Geophysical Fluid Dynamics Laboratory, USA	Х	Х	
GISS-E2-H	NASA Goddard Institute for Space Studies, USA	Х	Х	
GISS-E2-H-CC	NASA Goddard Institute for Space Studies, USA		Х	Х
GISS-E2-R	NASA Goddard Institute for Space Studies, USA	Х	Х	Х
GISS-E2-R-CC	NASA Goddard Institute for Space Studies, USA			Х
HadGEM2-AO	Met-Office – Hadley Center, UK	Х	Х	Х
HadGEM2-CC	Met-Office – Hadley Center, UK		Х	
HadGEM2-ES	Met-Office – Hadley Center, contributed by Instituto Nacional de Pesquisas Espaciais, Spain	Х		Х
HadGEM2-ES- CC	Met-Office – Hadley Center, contributed by Instituto Nacional de Pesquisas Espaciais, Spain			
inmcm4	Inst. For Numerical Mathematics, Russia		Х	Х
IPSL-CM5A-LR	Institut Pierre-Simon Laplace, France	Х	Х	Х
IPSL-CM5A- MR	Institut Pierre-Simon Laplace, France	Х	Х	Х
IPSL-CM5B-LR	Institut Pierre-Simon Laplace, France		Х	Х
MPI-ESM-LR	Max-Planck Inst. für Meteorologie, Germany	Х	Х	Х
MPI-ESM-MR	Max-Planck Inst. für Meteorologie, Germany	Х	Х	Х
MRI-CGCM3	Meteorological Research Institute, Japan	Х	Х	Х
MRI-ESM1	Meteorological Research Institute, Japan			Х
NorESM1-M	Norwegian Climate Centre	Х	Х	Х
NorESM1-ME	Norwegian Climate Centre	Х	Х	Х
Nb		16	23	22
simulations				

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