



Effect of climate change on potential distribution of oriental beech (*Fagus orientalis* Lipsky.) in the twenty-first century in Turkey

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Abstract

The rising temperatures and decreasing rainfall are expected to have negative effects on ecosystem services by causing significant shrinkage or shift of forest distribution particularly in Mediterranean basin. In this study, it was aimed to determine the distribution of oriental beech (*Fagus orientalis* Lipsky.) by modelling the current and future potential locations of the habitats. With Maximum Entropy (MaxEnt) approach, we predicted its distribution under current and future conditions (RCP 4.5 and RCP 8.5) in Turkey. Modelling was performed by using eight bioclimatic variables that show significant relationship to the current distribution of oriental beech and were widely used in the literature. The fitted model had high quality (93.5% AUC) and is biological meaningful. The prediction of warmer condition in future showed that the populations on the southern slopes of the North Anatolian Mountains were expected to shrink and that there would be reduction in the populations found in the main distribution area in the Istranca Mountains and the Northern Anatolia, especially in populations in the transition zone of Central Anatolia. Also, oriental beech would lose its isolated-marginal populations in the southeast of Turkey. The results highlight the importance of a genetic conservation programme for beech population in Turkey. Otherwise, the genetic pools seem to extinct under climate change. Furthermore, the paper is intended to provide a starting point for a monitoring of oriental beech at the edge of its distribution, to observe its climatic migration.

1 Introduction

Oriental beech (*Fagus orientalis* Lipsky.), of which a significant portion of geographical distribution is mostly in Turkey, is also distributed in Bulgaria, Greece, Crimea, the Caucasus, and Iran. It is an economically and ecologically important species (Ertekin et al. 2015). The most suitable growth conditions are the north-facing slopes of the Northern Anatolian orogenic belt located in the Black Sea region and the Istranca Mountains in Thrace (Yaltrık 1982; Ertekin et al. 2015).

Including the Anatolian Peninsula, the entire Mediterranean basin is considered as one of the most vulnerable regions to climate change in the world (IPCC 2007; Ozdemir et al., 2011; Kovats et al. 2014). According to UNDP (2019), Turkey is included among the “countries at risk” that are highly vulnerable to climate change (UNDP 2019). Global climate change will rise to occasion with the rise of temperatures and a decrease in precipitation in the Mediterranean Basin (Giorgi and Lionello 2008). The rising temperatures are expected to have negative effects on ecosystem services such as water conservation and production, climate regulation, soil retention and flood control by causing significant changes in ecosystems.

Talu et al. (2011) state that climate change will affect Turkey through climate-related natural disasters such as frequent forest fires, droughts, floods, desertification and erosion as well as an increase in ecological degradation rate and depletion of water resources. Toros (2012) underlines that the rise in temperature during warm periods will be higher than the rise in temperature during cold periods. (Tayanc et al., 2009) emphasizes that there is a significant warming trend since 1993 in Turkey, and that the maximum temperatures in history have been recorded in recent years, while

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Sen (2013) reports that the average summer temperature in the 2000s in Turkey is about 1.5 °C higher compared to the temperature 30–40 years ago. Demircan et al. (2017) predicts that the snow will melt early in the spring due to this rise in temperature. In a study conducted by Erlat and Turkes (2011), it was stated that there was an overall reduction in the annual number of frost days in many stations around Turkey during the period between 1950 and 2010. Sen (2013) reported that no significant change was observed in the precipitation during the period, when climate records were kept, except north-eastern Turkey where precipitation increased regionally. In spite of that, future projections indicate that the annual total precipitation will decrease, especially in Central Anatolia and South-eastern Anatolia. Dalfes et al. (2007) stated that during the period between 1951 and 2004, winter precipitation considerably decreased in the western provinces of Turkey, whereas autumn precipitation increased in the stations located in the northern part of Central Anatolia. According to García Ruiz et al. (2011), precipitation decreased in the western coastline of Turkey between 1950 and 2002, despite the positive trend observed in the north of Turkey. Yalcin (2012) reported that the water potential of Turkey decreased down to 163.79 billion m³ from 178.15 billion m³ in the period between 1989 and 2009 depending on the decrease observed in the runoff.

According to future climate projections for the period between 2071 and 2100, it was stated that Turkey's average annual temperature would increase all across the country. The average temperature was expected to rise up to 6 °C, especially in the Aegean region (Dalfes et al. 2007). Sen (2013) stated that the average summer temperature will rise around 1.0 to 2.5 °C in the mid-twenty-first century and 5 to 5.0 °C by the end of the twenty-first century. Moreover, winter temperature increase was estimated to be higher in the eastern half of the country during this period. In the same period, it was stated that the precipitation would decrease along the Aegean and Mediterranean coastlines as well as Turkey's Black Sea coastline, while little or no change would be observed in Central Anatolia (Dalfes et al. 2007). While significant decrease in precipitation was expected to be observed in the south-western coast of Turkey, more precipitation was expected to occur in the coastal region of the Caucasus, and less winter precipitation in the Mediterranean coast (Yalcin 2012). Talu et al. (2011) estimate that there will be a greater decrease in summer precipitation in the northern half of Turkey compared to the southern half.

Forests are one of the ecosystems most affected by climate change. Adaptation of trees, which can survive for centuries or even for thousands of years, to rapid change in the climate is not that easy (Lindner et al., 2010). For this reason, local extinctions and loss of important functions and services are expected (Keenan 2012). Several dendroclimatological studies show that the most important factor of

annual ring growth in Turkey is the precipitation occurring in in May and June (Akkemik 2000; Akkemik et al. 2008). In addition to this limiting effect of precipitation, high temperatures experienced in the same period increase the severity of drought and limit radial growth (Kose et al. 2012, 2017; Guner et al. 2017; Akkemik et al. 2005, 2008; Touchan et al. 2007). Over the last two decades, researches on the effects of climate change, species adaptation and migration have increased significantly.

Oriental beech forests in Turkey are about 2.05 million hectares, which corresponds to 8.5% (OGM 2015) of the country's total forest area. The altitude range of the oriental beech in the Balkans is 10 to 800 m (m.a.s.l.) above sea level. In Turkey, it goes up to 1500 to 1700 m in the Black Sea valleys and up to 2000 m in the Aegean mountains (Atay 1982; Atalay 1992; Ata 1995; Ozel and Ertekin 2011; Ertekin et al. 2015). Apart from Northern Anatolia, where it is mainly distributed, oriental beech residual forests are also available in the Eastern Mediterranean region of Turkey including Adana, Osmaniye, Hatay and Kahramanmaraş (Yılmaz, 2010). Although oriental beech forests generally form mix stands with Caucasian fir (*Abies nordmanniana* (Steven) Spach), nordmann fir (*A. nordmanniana* (Stev. Spach. subsp. *bornmuelleriana* (Mattf.) Coon & Cullen), Ida Mountain fir (*A. equitrojani* Aschers et Sinten), Scots pine (*Pinus sylvestris* L.), Anatolian black pine (*P. nigra* Arnold subsp. *pallasiana* (Lamb.) Holmboe) and oriental spruce (*Picea orientalis* (L.) Link.) at high altitudes in Turkey. However, oriental beech also occurs in large areas in pure stands (Atalay 1992; Ata 1995; Ertekin et al. 2015). The distribution patterns of the *F. orientalis* in the south-eastern Balkans suggest that *F. orientalis* may occur on drier and warmer sites than *F. sylvatica* (Kandemir and Kaya 2009).

Modelling the possible future distribution areas of species such as climate change-sensitive oriental beech (Martin-Benito et al. 2018; Kose and Guner 2012) may be a significant guide in terms of forest protection and management. Species distribution models are among the most effective and widely used methods in understanding future distribution of species (Dyderski et al. 2018; Kramer et al. 2010). These models help to identify zones similar to the current distribution areas for species, in case the environmental variables change, by using the current distribution data of the species and various environmental variables (Pearson 2007; Li and Wang 2013; Elith and Leathwick 2009).

In this study, it is aimed to support high-accuracy silvicultural decisions in conservation and management practices by examining possible changes due to climate change in oriental beech forests towards the end of this century. For this aim, modelling was carried out with Maximum Entropy (MaxEnt) software using 8 different bioclimatic variables according to Representative Concentration Pathway (RCP) 4.5 and RCP 8.5 global climate change scenarios in 2050

and 2070 from WorldClim database. Specifically, we pursue the following objectives: (i) to model the present distribution of *F. orientalis*, and (ii) to project the future distribution of *F. orientalis* under different climate change scenarios.

2 Material and method

2.1 Study region and occurrence data

The current study focused on the distribution of oriental beech in the borders of Turkey. Oriental beech occurrence data were obtained from forest management plans of the General Directorate of Forestry of Turkey (GDF, traceable reference of occurrence data) which are much more sensitive spatial data than European Forest Genetic Resources Programme (EUFORGEN). In this study, we used 70% training and 30% test data set to validate the model across the entire dataset. The spatial data of the oriental beech used in the study and the location of the study area are given in Fig. 1.

2.2 Climate data

For our investigation, we used the WorldClim 1.4 (WorldClim 2019, 2.5-min spatial resolution). The climate data comprised the period from 1960 to 1990. The data is widely used in modelling studies for species distribution (Panagos

et al. 2017). In this platform, 19 bioclimatic variables are available which represent the types of seasonal trends pertinent to the physiological constraints of different species (Hijmans et al. 2005; O'Donnell and Ignizio 2012). All these bioclimatic variables and distributions related to beech were tested before the models were introduced. Highly correlated variables to best express the natural distribution of oriental beech were identified and screening was conducted among the bioclimatic variables. The eight most important bioclimatic variables, which are frequently used and widely used in species distribution modelling studies and also directly affect the natural distribution of oriental beech, were used in this study to optimize the future distribution of eastern beech in the literature (Graham 2003; Garcia et al. 2013; Haghshenas et al. 2016a, b; Qin et al. 2017; Yaman et al. 2021). In the study, eight variables are used as seen Table 1.

Hadley Global Environment Model 2-Earth System (HadGEM2-ES) 2.5-min spatial resolution featured climate model was used in this study also from the WorldClim 1.4 dataset. This global circulation model was selected because it fits best our assumptions for the climatic change in Turkey (see supplementary data 1 (S1a and S1b) and mentioned climatic assumptions in Sect. 1). We prefer the usage of one global circulation model instead of ensemble. In our case, we expect this to simplify the interpretation of results. That is why, we have applied four climatic situations to observe under which conditions range loss of beech starts. The

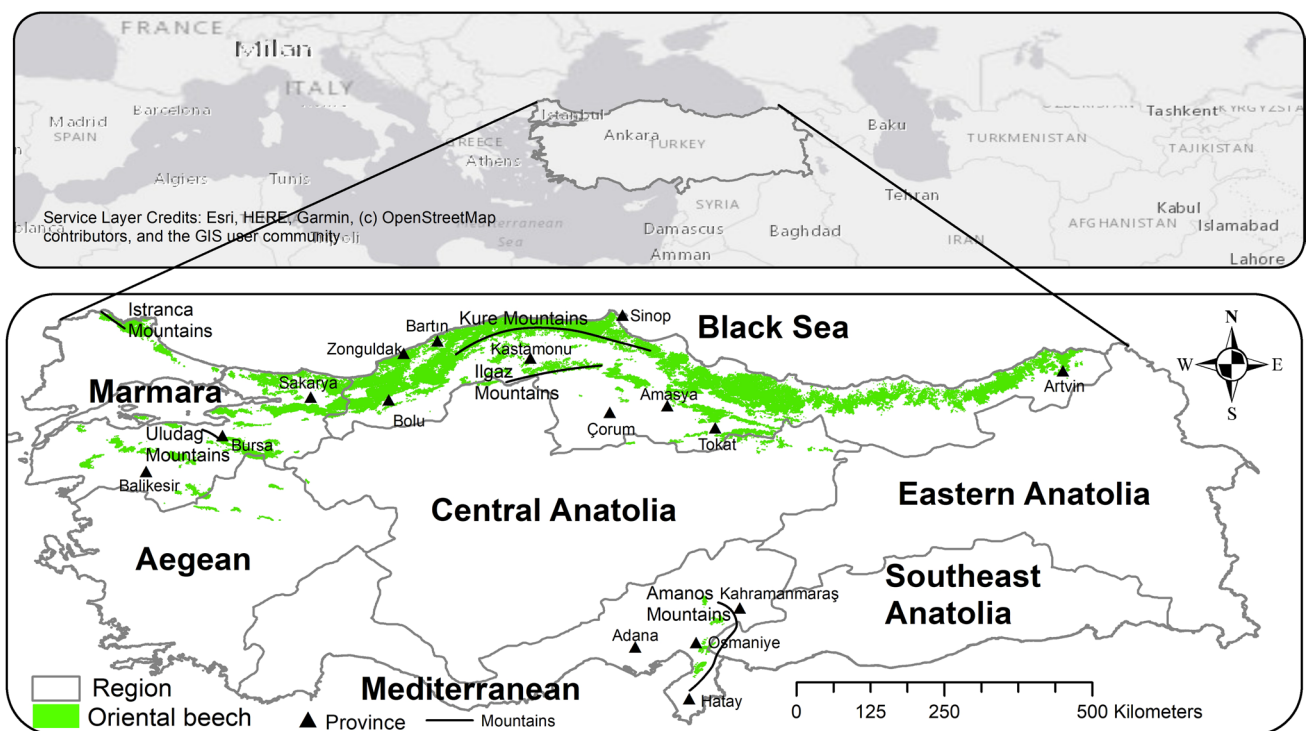


Figure 1 Input data for Maximum Entropy area of oriental beech in the study boundary

Table 1 WorldClim bioclimatic variables

Codes	Bioclimatic variables
Bio1	Annual mean temperature
Bio2	Mean diurnal range (mean of monthly (max temp–min temp))
Bio5	Max temperature of warmest month
Bio6	Min temperature of coldest month
Bio12	Annual precipitation
Bio14	Precipitation of driest month
Bio15	Precipitation seasonality (coefficient of variation)
Bio18	Precipitation of warmest quarter

most extreme and intermediate scenario were selected from HadGEM2-ES: the former achieving 8.5 W/m² by 2100 (RCP 8.5), while the latter an increase of 4.5 W/m² (RCP 4.5), also in the same deadline. These scenarios represent the concentration of greenhouse gases and pollutants resulting from human activity, adopted by the Fifth Assessment Report (IPCC 2014). Two time slots were studied for each RCP: 2050 (average for 2041–2060) and 2070 (average for 2061–2080).

2.3 Statistical model

The distribution of beech was fitted by Maximum Entropy. The approach uses the principle of Maximum Entropy on presence only data to estimate a set of functions that relate environmental variables and habitat suitability in order to approximate the species' niche and potential geographic

distribution (Phillips et al. 2006). It is a discriminative modelling technique, meaning it fits species occurrences relative to available habitat in a model as uniform as possible between two probability densities (Elith et al. 2011). Although Maximum Entropy was designed to use current only data, it also performs well when compared to presence absence procedures that utilize both real and pseudo absence data (Elith et al. 2006). Validation of the models created with receiver operating characteristic (ROC) curve, which was widely used in a wide variety of modelling studies, and area under curve (AUC), which expressed the area under this curve as well as the level of success of the model, was performed (Metz 1978; Alonzo and Pepe 2002; Bugday 2018; Laaribya et al. 2021). In ecological modelling studies, also the Jackknife test is applied in order to reveal the predictive sensitivity of the model (Efron 1982). In this validation method, the models with AUC values of 0.5 and above are taken into consideration. Here, the success of the model is defined by its proximity to the number 1. In the literature, the fact that the AUC value is 0.65–0.75 indicates a medium-scale model success, while values over 0.75 indicate an acceptable model success, and 0.95 and above indicate that the model success is excellent (Hanley and McNeil 1982; Rice and Harris 2005; Tharwat 2018).

In order to be able to model the existing and potential distribution areas, MaxEnt 3.4.1 software (Steven et al. 2020) was used, and map displays and the calculation of area gain or loss and species shift (Table 2) were made with ArcGIS 10.3 software (ESRI 2011).

Table 2 Predicted current and future potential natural distributions of oriental beech

		Current distribution	Potential distr. present	RCP 4.5		RCP 8.5	
				2050	2070	2050	2070
Habitat suitability area (km ²)		20,559.88	54,231.53	19,598.55	18,126.69	19,635.86	18,862.03
Percentage of <i>Fagus orientalis</i> in the forested areas (%)		8.5	23.97	7.37	6.39	7.12	6.25
Area loss (%)				-4.68	-11.83	-4.49	-8.26
Percentage of <i>Fagus orientalis</i> in Turkey (%)		2.62	6.92	2.50	2.31	2.51	2.41
Latitude (decimal degree)	Min	28.1983	40.7360	41.9650	42.0370	41.5973	41.9796
	Max	40.0420	40.8150	41.0700	41.3475	40.0779	40.5565
	Mean	40.5760	40.6290	41.1500	41.3210	41.2260	40.7410
Longitude (decimal degree)	Min	41.9810	39.0650	34.4490	34.919	32.1371	33.7205
	Max	36.9150	40.3840	41.3800	29.1623	29.1623	31.8023
	Mean	29.9230	39.1480	32.4380	32.4540	32.4540	30.9890
Elevation (m)	Min	0	0	0	0	0	0
	Max	2210	2258	2237	2316	2243	2311
	Mean	925	928	925	896	918	901

3 Results

As a result of the modelling done within the scope of this study, validation area under curve (AUC) value was found to be 0.935 (93.5%). This value indicates that modelling is done precisely and model quality is quite high (Fig. 2).

As a result of the Jackknife test applied in this study, Bio 2 (mean diurnal range (mean of monthly (max temp–min temp))) was defined as the most significant variable with a rate of 90.3%. This was followed by Bio 14 (precipitation of driest month) with 78.2% and Bio 18 (precipitation of warmest quarter) with 72.9%, respectively (Fig. 3).

The model results obtained based on the current and future (the years of 2050 and 2070) projections carried out in this study were mapped and displayed as below (Figs. 4, 5 and 6).

According to the RCP 4.5 scenario for the years of 2050 and 2070, it is predicted that oriental beech will lose its isolated and marginal populations found in Adana, Osmaniye, Hatay and Kahramanmaras provinces of eastern Mediterranean region of Turkey, and also its populations found on Istranca Mountains in Thrace will shrink and reduce. Also, it is predicted that in the Eastern Black Sea region, which is the main distribution area of the species, the populations will continue to exist on the northern slope of the mountains, where the humidity and precipitation economy are more advantageous; therefore, it will remain its existence in a narrower lane than its current distribution (Figs. 5 and 6).

According to the RCP 8.5 scenario for the years of 2050 and 2070, it is predicted that the oriental beech will lose its isolated and marginal populations in Adana, Osmaniye, Hatay and Kahramanmaras provinces, and also there will be reduction and significant spatial losses in populations inserted from the Black Sea towards Central Anatolia in

Figure 2 ROC curve and AUC value of the model

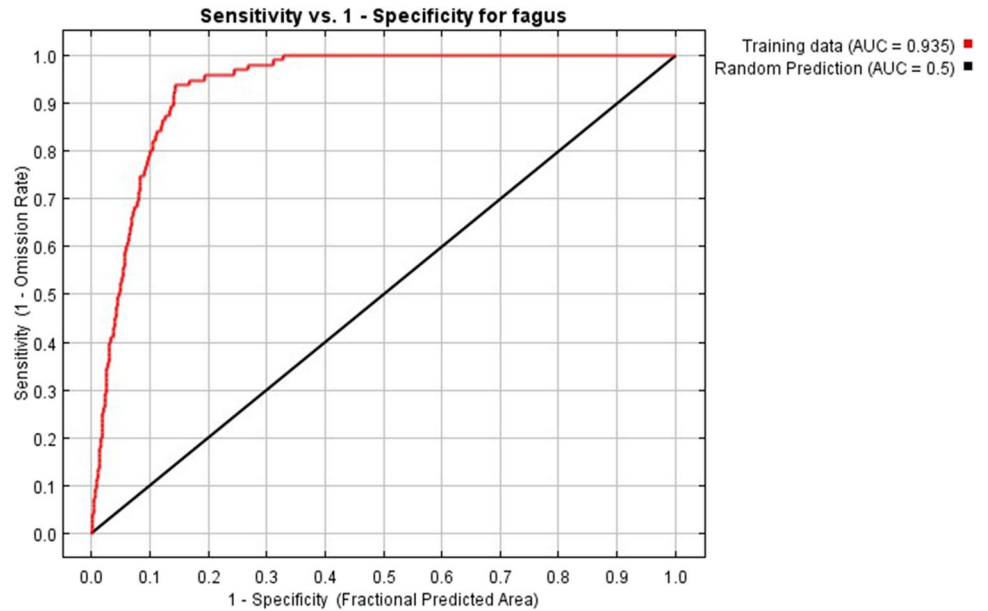


Figure 3 Predictive accuracy of the model variables — Jackknife test

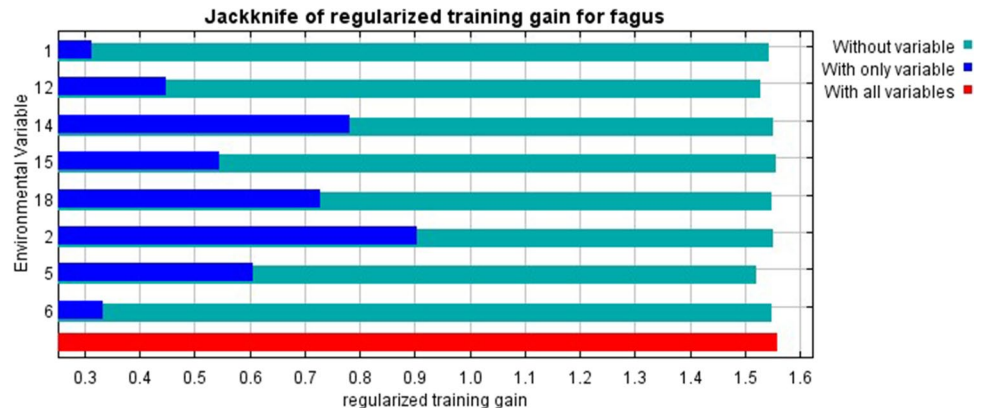


Figure 4 Potential distribution of oriental beech in Turkey according to the modelling results

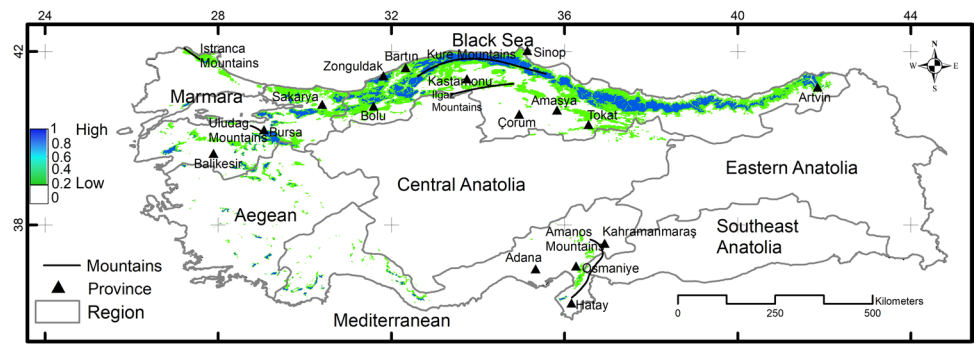


Figure 5 Future distribution of oriental beech in Turkey in 2050 (upper panel) and 2070 (lower panel) according to the RCP 4.5

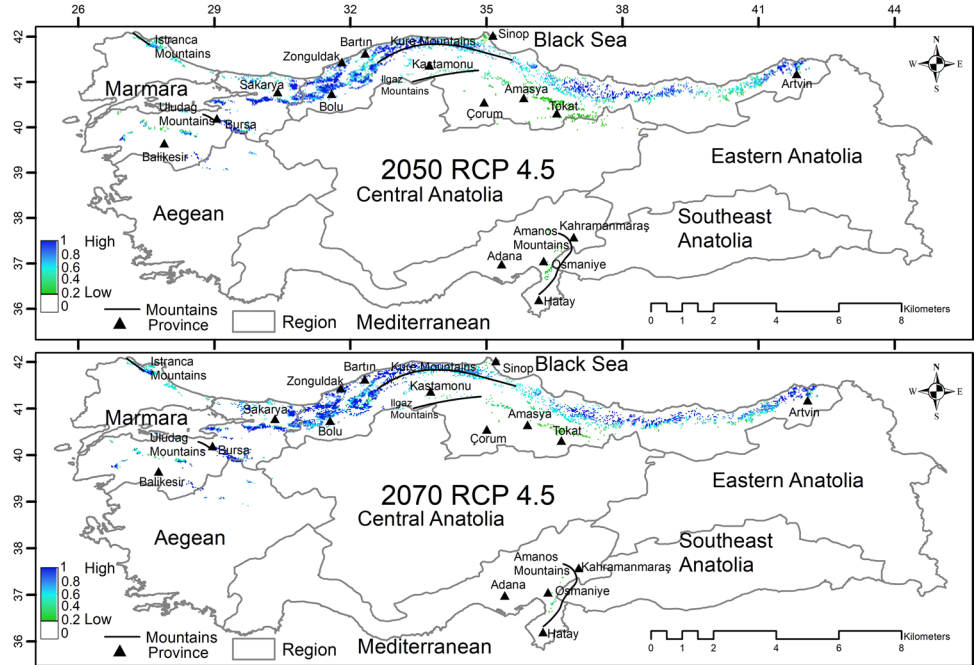
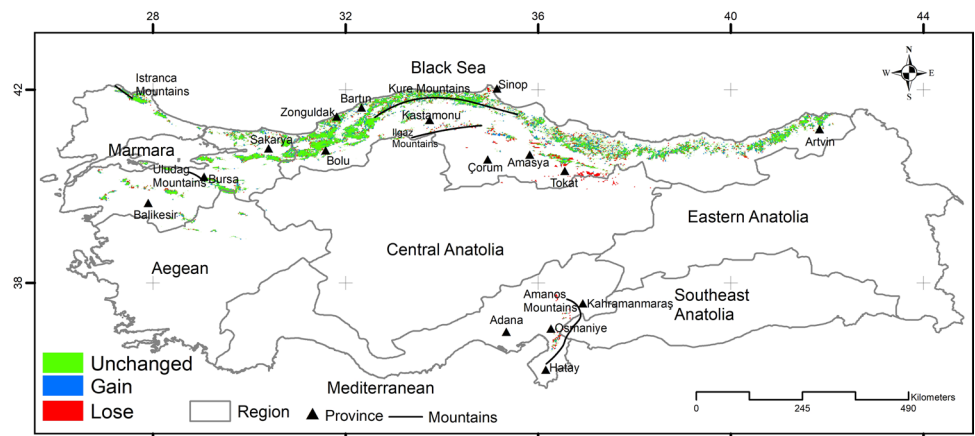


Figure 6 Change distribution of oriental beech in Turkey according to RCP 4.5



Tokat, Corum and Amasya provinces as well as Istranca Mountains in Thrace. Along with the narrowing of the populations on the Istranca Mountains, it is understood that there will be a reduction in the populations found in

Marmara region, especially in Balikesir province (Figs. 7 and 8).

Accordingly, current and future (years of 2050 and 2070) spatial distribution amounts and percentage changes are

Figure 7 Future distribution of oriental beech in Turkey in 2050 (upper panel) and 2070 (lower panel) according to the RCP8.5

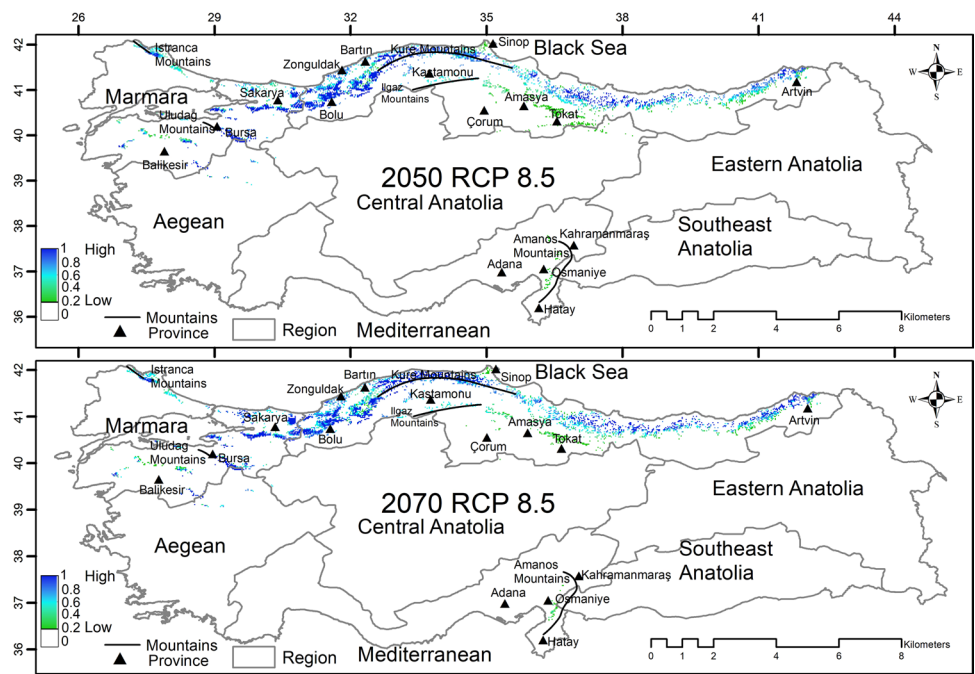
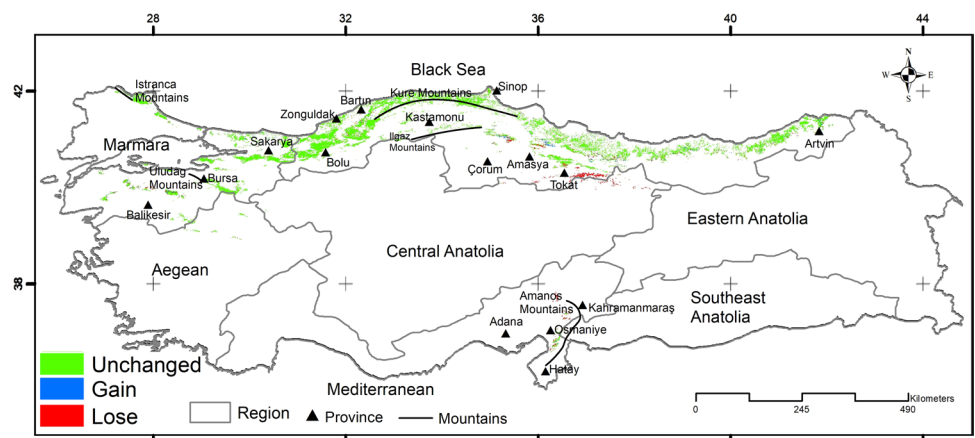


Figure 8 Change distribution of oriental beech in Turkey according to RCP 8.5



given in Table 2. Overall, it was found that there would be a reduction in terms of distribution of this species in the future, and that the species would lose its distribution in the south of Turkey. The total habitat suitability area decreased gradually from 2050 to 2070 under the moderate emission scenario (RCP 4.5) and the severe emission scenario (RCP 8.5) (Table 2).

As a result of the modelling, according to the projection obtained by using the RCP 4.5 scenario for 2050, it was predicted that the lowest vertical distribution of oriental beech species in Turkey would be around the coastlines in Zonguldak-Eregli in Western Blacksea Region and Istanbul-Sile (0 m) in Marmara Region. The highest distribution of oriental beech was projected to be around Bursa-Uludag (2000 m) and Bolu-Dortdivan (1950 m). According to the projection obtained by using the RCP 8.5 scenario for 2050,

it was predicted that the lowest vertical distribution of *Fagus orientalis* in Turkey would be around the coastlines in Zonguldak-Eregli and Sinop (0 m), whereas the vertically highest distribution of oriental beech would be around Bursa-Uludag (2000 m) and Artvin-Borcka (1980 m).

As a result of the modelling, according to the projection obtained by using the RCP 4.5 scenario for 2070, it was predicted that the lowest vertical distribution of oriental beech species in Turkey would be around the coastlines in Sakarya-Karasu and Bartın-Kurucasile (0 m). The highest distribution of the oriental beech was projected to be around Artvin-Borcka (2010 m) and Bursa-Uludag (2000 m). According to the projection obtained by using the RCP 8.5 climate change scenario for 2070, it was predicted that the lowest vertical distribution of beech in Turkey would be around the coastlines in Zonguldak-Eregli and Kastamonu-Inebolu

(0 m), whereas the vertically highest distribution of oriental beech would be around the areas located on the North of Bolu-Seben (2070 m) and around Bursa-Uludag (1900 m).

Until 2070 in Turkey, it is predicted that the horizontal distribution of oriental beech will become very limited in the southern parts, that it will expand in the central and north-eastern direction and that the density of oriental beech will increase in these areas. According to the RCP 8.5 scenario for 2050 and 2070, it is predicted that oriental beech will be extinct in the southern parts. According to WorldClim 2050 and 2070 climate change scenarios, the spatial distribution of *beech* in Turkey will be between 41°53'N latitude and 26°49'E longitude, and 39°51'N latitude and 41°48'E longitude.

4 Discussion and conclusions

It is well known that global climate change strongly affects plant distribution and survival. In this study, which aimed to model the distribution of oriental beech in Turkey, a total of eight bioclimatic variables were used. Evaluations were made based on two different climate scenarios, RCP 4.5 and RCP 8.5, which were obtained from WorldClim. According to these two different climate scenarios, it is predicted that the natural distribution area of oriental beech, which is one of the important primary forest tree species in Turkey and has important silvicultural functions for forest ecosystems, will reduce; that it will decrease to a great extent in the south and southwest locations of Turkey until 2070 and that it will completely lose its isolated marginal populations in Amanos mountains. Moreover, it is predicted that there will be reductions in its populations found in the Istranca Mountains, in the South of Marmara region and in the area between Central Black Sea and Black Sea regions.

Considering the MaxEnt's projections based on optimistic, moderate and severe scenarios for 2070, it is also foreseen by Dagtekin et al. (2019) that there will be a severe reduction in the geographical distribution of oriental beech, and the species will continue its existence, especially in the Caucasus. The results of MaxEnt showed that it could not catch the distribution on the Amanos Mountains for the current model. In opposition to MaxEnt outputs, random forest (RF) gave the result that there would be a small expansion in the southern Caspian Sea. This supports the idea of this region becoming a shelter region for the future (Dagtekin et al. 2019).

Many studies conducted emphasize that the density of *Fagus sylvatica* L. and *Picea abies* (L.) Karst. (Köble Seufert, 2001; EUROSTAT 2018), which are the most common species of Boreal and European forests, and are economically valuable, especially for their role in lumber industry, will decrease due to climate change in European

forests (Kellomaki et al. 2001; Hanewinkel et al. 2013; Ruiz-Labourdette et al. 2013; Forest Europe 2015), and it is stated that species with more thermophilic character will be found in the distribution areas of these species (Kullman 2008).

In a study conducted by Thurm et al. (2018), it is stated that there will be a 56% decrease in potential distribution area of *F. sylvatica*, and this result supports the previous studies assuming a large loss of habitat suitability for *F. sylvatica* (Maiorano et al. 2013; Meier et al. 2012). In addition, Haghshenas et al. (2016a, b) emphasized oriental beech may be sensitive to increasing temperatures in the Caspian forests, north of Iran. However, this result contradicts with the studies of Dyderski et al. (2018) and Falk and Hempelmann (2013) stating that there will be an increase in the distribution. The determining factor of gaining or losing in the distribution area of a species under global warming is closely related to the latitude centre and temperature adaptation of the current distribution. This situation confirms the hypothesis of the gain in distribution area of the southern tree species is stronger than the northern tree species (Thurm et al. 2018). Other studies focusing on mountainous areas show that climate change causes most of the studied plant species to shift upwards (Lenoir et al. 2008; Penuelas and Boada 2003; Rigling et al. 2013; Walther et al. 2005).

In a study conducted by Yalcin (2012) on the natural distribution area of oriental beech species in Turkey, it is stated that the change in suitable areas would be dramatic, most of the existing suitable areas would disappear by the end of 2050, and based on optimistic predictions, only 3–7% of current stands would remain suitable by 2080. Yalcin (2012) states that especially in Kastamonu province, the protected areas would remain along the Kure Mountains, for example most of the oriental beech forests in Kure Mountains National Park would be preserved. Also, it was emphasized that there would be some gain along the Ilgaz Mountains, another compact area would remain at high altitudes above 1000 m of Yenice forests; however, most of the existing beech distribution around the Uludag Mountains would be lost, and that the areas at high altitudes, where forest cover was not currently available, would become suitable for the oriental beech species in the future (Yalcin 2012).

In another study conducted in Georgia and the Western Caucasus, it was found that the effect of drought was quite low in oriental beech trees grown at high altitudes, while high temperatures in spring and summer increased the development of annual rings. It was predicted that the increase in temperature foreseen in the climate change scenarios could accelerate the growth of the oriental beech, which grew in the middle and upper altitudes in this region. The study results showed that the region could act as a potential shelter, especially considering the more arid regions surrounding the Western Caucasus, and emphasized that the naturally

aged forests in this region must be preserved (Martin-Benito et al. 2018).

In our study, in severe emission scenario conditions in both 2050 and 2070 periods, fewer area losses were detected in the distribution area of oriental beech than in the moderate emission scenario, interestingly. As it known, oriental beech, under Euxinian climate (a type of climate typical from northern aspects of the Black Sea Region) characterized by a totally different precipitation pattern (substantial summer rain) and higher humidity (López-Tirado et al. 2021), makes its widest and most suitable spread in Turkey in the middle and high parts of the mountains running parallel to the Black Sea coast, and especially in the pure and mixed forests, it forms in the northern mountains (Kandemir et al. 2016). The fact that the oriental beech shows less habitat loss in the severe emission scenario may be based on the positive effect of possible increased humidity due to the effect of increased temperature. The effect of Bio18 (Precipitation of Warmest Quarter) in modelling can be considered as a separate basis for explaining this situation. The Amanos Mountains are distinctive for this species, because the oriental beech of this is home to some relict populations (Avci 2018). However, Dagtekin et al. (2019) stated that they described a region of high importance such as Amanos Mountains as accurately as possible with the results of random forest (RF) community classifier. Future climatic conditions are expected to cause the current distribution of oriental beech to shift higher altitudes due to more mild and rainy climatic conditions. The dendroclimatological studies in the region support the model findings and designate that the oriental beech grown in the middle and upper altitudes may increase the growth by benefiting from the rising spring–summer temperatures, and that this region may be a potential shelter area in the future (Martin-Benito et al. 2018; Dagtekin et al. 2019).

Due to the fact that the percentage of empty seeds in the populations in the most southern part of the *Fagus crenata* distribution in Japan is high, it has been determined that the regeneration ability of the forest has weakened and the diameter increase has decreased in the last 50 years due to global warming. For this reason, it was assumed that those populations could be replaced with other species (Mizunaga et al. 2005). Similarly, Yilmaz (2010) pointed out that some unprecedented characteristics were observed in the oriental beech residual forests in response to summer drought in southern Anatolia, the empty seed rate was low and that the fragility of these forests significantly differed from the populations in the main distribution area.

The effects of climate change may vary depending on the ecological and geographical characteristics of a species. Oriental beech is a taxon to the areas that are moist in terms of ecological preferences and have summer rainfalls (Alsos et al. 2012). However, this species occupies a narrow ecological niche being sensitive to late spring frosts and summer

drought (Peters 1997). Consequently, it has been identified as especially vulnerable to climate change effects (Kose and Guner 2012; Haghshenas et al. 2016a, b). Preservation of genetic diversity of a species is of a great importance for adapting to climate change. Genetic diversity loss is likely due to the narrowing of the species' distribution areas (Alsos et al. 2012). Especially oriental beech may experience loss of genetic diversity due to the large distribution loss (Yalcin, 2012). Therefore, existing marginal populations are important tools to preserve genetic diversity in the future. They have already adapted to the optimum climatic conditions defined in relation to the main distribution of the species (Barbati et al. 2018). Establishing seed orchards with seed origin and/or clonal route is important as an ex situ protection measure with the production materials of marginal and edge populations. These orchards can be critical tools for afforestation works to be carried out in the future.

We recognize that species distribution models driven entirely by climate variables can only explain part of a species distribution. This can be seen also by the comparison of the real current distribution to the potential current distribution. Besides the anthropogenic influence, biotic effects and soil conditions have to be taken into account, especially on local level (Conedera et al. 2021). For our study, however, it was important to detect the large-scale patterns and these are mainly determined by the climate. Large-scale dieback caused by biotic pests, as we known from Chestnut blight fungus, also in Mediterranean region, is rather rare in oriental beech ecosystems. However, under increasing temperature, the impact of alien species on beech can increase and is very hard to predict.

Monitoring populations at the limits of their bioclimatic suitability will provide more information about species responses to climate change. A network of such monitoring stations should be immediately set up. Monitoring the bioclimatic suitability of the populations at the borders of distribution will provide more information on the species' responses to climate change. Based on the results of this study, the distribution for oriental beech, genetic monitoring can start to save local population which might extinct in future. Establishing a network of such monitoring stations is a priority. In future studies, the application of both different modelling methods and the combination of different parameters will further improve dispersion modelling studies. At the same time, Dagtekin et al. (2020) stated that comparing the model results with the distribution data obtained from different sources such as pollen data, when applying species distribution models, helps to understand the quality and accuracy of the models. Consequently, modelling the past distribution areas and possible future distribution areas of species is an important guide in terms of conservation and sustainable management of forests. In the next process, it is thought that comparative studies can be made using

different modelling methods including soil and topographic parameters.

5 Supplementary information

6 Ethics approval

Not applicable.

7 Consent for publication

All the authors consented to publish the paper.

8 Conflict of interests

The authors declare no competing interests.

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Author contribution SA and HBO performed background research and designed the study. EB obtained the data and analysed them by support TV. The modelling results were reviewed by EAT. SA wrote the manuscript. All authors discussed the results and commented on the manuscript. The order of the authors is based on the level of their contribution.

Availability of data and material The data belongs to the General Directory of Forestry, Turkey. That is why, we are not allowed to distribute the data ourselves, yet, it is available upon request to the General Directory of Forestry, Turkey. Contact information: Republic of Turkey, General Directorate of Forestry Address: Beştepe Mahallesi Sogutozu Caddesi No:8/1 06,560 Yenimahalle/Ankara/TURKEY.

Code availability Not applicable.

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