





Potential occurrence of *Araucaria angustifolia* (Bertol.) Kuntze in the urban forest of Curitiba, Paraná, Brazil

Allan Rodrigo Nunho dos Reis, Daniela Biondi, Severo Ivasko Júnior, Jennifer Viezzer, Bruna Kovalsyki & Jefferson Dias de Oliveira

Departamento de Ciências Florestais, Universidade Federal do Paraná, Curitiba, Paraná. allan.nunho@gmail.com, dbiondi@ufpr.com, severoivasko@gmail.com, jen.viezzer@gmail.com, kovalsyki.b@gmail.com, jeffddo@gmail.com

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Abstract

The objective of this study was to develop the potential distribution model of *Araucaria angustifolia* and verify the relevance of Curitiba's urban forest for its conservation. The potential distribution model was developed considering meteorological and topo-edaphic criteria through the MaxEnt[®] algorithm. The potential distribution map was classified into three classes of environmental adequacy: high, medium, and low. Pedology and declivity were the criteria most representative of the species distribution. The model presented an accuracy of 93.4%. The northern region of Curitiba and the areas along watercourses presented the highest environmental adequacy for *A. angustifolia*. A total of 72.94% of the analyzed green areas have medium and/or high adequacy for the species. We recommend creating protected areas in the regions indicated by the model, aiming at favoring the conservation of *A. angustifolia* and reducing pressures on their populations in the urban environment.

Keywords: environmental adequacy; MaxEnt; Paraná pine; urban green areas.

Posible aparición de *Araucaria angustifolia* (Bertol.) Kuntze en el bosque urbano de Curitiba, Paraná, Brasil

Resumen

El objetivo de esta investigación fue desarrollar el modelo de distribución potencial de *A. angustifolia* y verificar la relevancia del bosque urbano de Curitiba para su conservación. El modelo de distribución potencial fue desarrollado considerando variables meteorológicas y topo-edáficas, utilizando el algoritmo MaxEnt[®]. El mapa de distribución potencial se clasificó en tres clases de adecuación ambiental: alta, media y baja. Las variables de pedología y pendiente fueron las más representativas de la distribución de especies. El modelo mostró una precisión del 93,4%. La región norteña de Curitiba y las áreas a lo largo de los cursos de agua tienen las mayores adecuaciones ambientales para *A. angustifolia*. De las áreas verdes analizadas, 72,94% tienen adecuación media y o alta para la especie. Se recomienda la creación de áreas protegidas en las regiones indicadas por el modelo, con el objetivo de favorecer la conservación de *A. angustifolia* y reducir la presión sobre sus poblaciones en el ambiente urbano.

Palabras clave: adecuación ambiental; áreas verdes; MaxEnt; Pino de Paraná.

1. Introduction

The transformation of natural or rural ecosystems into urban spaces promotes several impacts on plant species which remain in the city due to the loss and degradation of habitats, as well as changes in the structure and dynamics of ecosystems, weakening their ecological resilience. Thus, fragmentation of the native vegetation habitats is incurred, forming small and isolated remnants which are characterized by being little representative of the original forest [1].

The Atlantic Forest is the most fragmented and urbanized biome in Brazil. It consists of various ecosystems such as the Mixed Ombrophilous Forest (MOF), typical of the plateaus of Southern Brazil, with disjunctions in the country's Southeast Region, Paraguay, and Argentina [2,3]. Due to the predominance of *Araucaria angustifolia* (Bertol.) Kuntze

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(araucaria, Paraná pine), mainly in the cold and humid mountain regions of Southern and Southeastern Brazil, MOF is also called Araucaria Forest [4].

The presence of *A. angustifolia* characterizes the landscape of MOF regions. Furthermore, the species forms ecological associations with both other fauna and flora species, and which are essential to maintain the functional balance of ecosystems [3]. However, the indiscriminate exploitation of the species until the middle of the 20^{th} century, in addition to the pressure for agricultural and urban expansions, led to a constant threat to their populations in Southern Brazil [5].

The deforestation of the Araucaria Forest has caused a reduction estimated to be more than 80% of its original cover, leaving fragments in the landscape which are small, isolated, intensely impacted, and with few characteristics of the original vegetation [5,6]. As a result, *A. angustifolia* is currently considered "Endangered" (EN) by the National List of Endangered Flora Species, published in the Brazilian Ministry of the Environment Ordinance no. 443 from December 17th, 2014 [7]. The threat category is no longer severe due to the species being present in protected areas and having high cultivation potential [5].

Nevertheless, although most of Curitiba is located in the area covered by MOF, the suitability for the forest fragments in the city to the autoecology of *A. angustifolia* is not known, especially those protected by green areas. Therefore, the hypothesis tested herein was that the urban forest fragments in Curitiba generally have relevant environmental conditions to the occurrence and conservation of the species.

Thus, the objective of this study was to verify the relevance of the urban forest of Curitiba, Paraná, Brazil, for the conservation of *A. angustifolia*, considering the potential distribution of the species and the spatialization of the protected areas of the municipality.

2. Material and methods

2.1 Study area

The study covered the municipality of Curitiba, located in the First Plateau of Paraná, in the Southern Region of Brazil (Fig. 1), whose ground zero is located at the coordinates 25°25'46,89754" S and 49°16'16,56011" W [8]. The total area of Curitiba is 432.17 km², at 934.6 m of altitude [9].

The climate zone of Curitiba is Cfb according to the Köppen-Geiger classification, with characteristics of a humid subtropical climate [9]. The average annual temperature is 17.51 °C, reaching 33.87 °C in the summer and -2.35 °C during winter; the average rainfall is 1587.52 mm/year and the average annual relative humidity is 81.94% [10].

There are forest ecosystems (Montane and Alluvial MOF) and natural grassland in Curitiba, where the eastern limit of the geographic distribution of *A. angustifolia* was located. It originally dominated the forest canopy and characterized the region's landscape [3,11]. In addition to *A. angustifolia, Ocotea porosa* (Nees & Mart.) Barroso (imbuia) and *Ocotea odorifera* (Vell) Rohwer (sassafras) tree species predominated and helped characterize the landscape of the MOF regions together with other species from the Fabaceae and Myrtaceae botanical families [3,11].

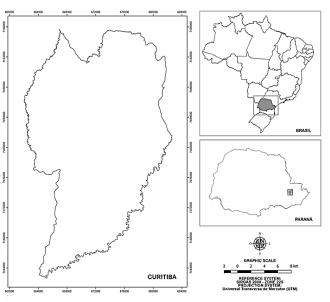


Figure 1. Map of the location of Curitiba, Paraná, Brazil. Source: The authors.

Grasslands occurred in the south-central portion of the municipality with a predominance of species from the Poaceae family, interspersed by small forest nuclei mainly consisting of *A. angustifolia*, *O. porosa* and *O. odorifera* [2].

The urban forest of Curitiba covers 43.69% of its total area, being 34.70% private and 8.98% public, of which only 3% are within green areas [12]. The urban forest of Curitiba is currently composed of 1.183 green areas, including parks, woods, landscaped boulevards, gardens, and Private Reserves of the Municipal Natural Heritage (RPPNMs), among others [13].

2.2 Methodological procedures

The MaxEnt[®] (Maximum Entropy) algorithm [14], version 3.4.1 of 2017, was used to elaborate the potential distribution model of *A. angustifolia* in Curitiba. This algorithm is defined as a machine-learning technique which estimates the probability distribution of species occurrence in the landscape through an exponential function [15]. The potential distribution modeling enables evaluating the representativeness of the most suitable sites for the conservation of the species within protected areas [16].

A logistic function was used to elaborate the model, which provides an estimate ranging from 0 to 1% probability of the species' presence [14]. This occurrence probability indicated the environmental adequacy for the species' occurrence [17]. A total of 1,000 combinations were established with 10 repetitions in the cross-validated method, and the radius was adjusted to "-30" due to the work scale [18].

Verification of the environmental criteria most relevant to the model when used alone and the accuracy estimation were performed through the Jackknife test and the Area Under the Curve (AUC), respectively [18]. Thus, 10 models were generated and the one with the highest AUC values (closer to 1) was chosen [18].

Table 1.
Abiotic criteria used for elaborating the potential distribution modeling of A.
angustifolia

Abiotic variable	Variable type	Unit	Variable range	Source
Altitude	Continuous	m	859.58 – 1087	[19]
Terrain horizontal curvature	Continuous	°/m	- 5 - 5	[19]
Terrain vertical curvature	Continuous	°/m	- 0.145 - 0.139	[19]
Declivity	Continuous	0	0.178 - 68.709	[19]
Phytogeography	Categorical	-	*	[20]
Terrain shape	Continuous	-	1 - 9	[19]
Geology	Categorical	-	**	[20]
Terrain orientation	Continuous	0	0-359.99	[19]
Pedology	Categorical	-	***	[8]
Average annual precipitation	Continuous	mm	1657.73 – 1756.71	[21]
Shaded relief	Continuous	-	0 - 0.999	[19]
Maximum temperature	Continuous	°C	28.82 – 32.17	[22]
Minimum temperature	Continuous	° C	6.62 - 9.12	[22]

Source: The authors.

Note: *: Montane Mixed Ombrophilous Forests, Alluvial Mixed Ombrophilous Forests, and grassland; **: Yellow Cambissol, Red-yellow Latossol, Red-yellow Argissol, Aluminic Argisol e Hydromorphic Soil; ***: Modern Sediments, Gneiss Migmatitic Complex and Guabirotuba Formation. Source: Reis et al. (2019a). [18]

Next, a total of 26 georeferenced points of *A. angustifolia* collected from GeoEye-1 satellite images with a spatial resolution of 0.5 m from 2016 were used to compose the model. These images were available in the Google Earth[®] Pro software, which were later confirmed in the 2019 image. The unique shape of the *A. angustifolia* top facilitated locating and georeferencing individuals.

Thirteen environmental criteria considered relevant for the species distribution were also used, with a spatial resolution of 30 m [18] (Table 1). All abiotic criteria were previously correlated by Pearson's Correlation to avoid spatial autocorrelation [18].

The original map generated by the MaxEnt[®] algorithm contained 14 classes of occurrence probability of *A. angustifolia*, and the delimitation of protected areas was then reclassified into three environmental adequacy classes for the species: high, medium, and low. This reclassification was performed based on the intervals of the original classes, each approximately 33% of the occurrence probability of the species [17].

This step helps to quantify potential areas for the presence of the species, thus enabling to define the best areas for its conservation [17]. To do so, a supervised classification was used in the ArcGis[®] 10.3 software.

The model map was superimposed to the protected forest fragments represented by the delimitation of 85 public and private green areas with the most preserved natural characteristics of the study area. Therefore, the term Selected Green Areas (SGA) was chosen, aiming toward not including predominantly anthropic areas such as introduced vegetation and impermeabilized soil. Thus, all green areas which met the requirement to be less anthropized were considered.

Table 2.

Percentage contribution of each abiotic criteria used for modeling.

Criteria	Contribution (%)	
Pedology	45.4	
Declivity	2.2	
Maximum temperature	12.5	
Geology	4.3	
Terrain orientation	3.8	
Shaded relief	3.3	
Terrain horizontal curvature	2.5	
Terrain shape	2.0	
Phytogeography	1.7	
Average annual precipitation	0.5	
Terrain vertical curvature	0.4	
Altitude	0.2	
Minimum temperature	0.1	

Source: The authors.

The analyzed green areas were defined from vector files provided by the Institute of Research and Urban Planning of Curitiba (*IPPUC*) from November 2019, totaling 85 green areas. They were: 28 parks, 25 Private Reserves of the Municipal Natural Heritage (*RPPNMs*), 18 woods, 10 Urban Biodiversity Conservation Woods (*BCBUs*), 1 Ecological Station (ES), 1 Wildlife Reserve (*RVS*), 1 botanical garden, and 1 zoo.

The area occupied by the occurrence probability classes within each protected area was subsequently calculated [17]. Such quantification is important in order to better detail the terrain surface of each SGA, as differences can occur mainly related to changes in soil properties depending on the water regime and its fertility [17,23]. Spatial analyses were performed in ArcGis[®] 10.3.

3. Results

Training data values ranged from 0.926 to 0.961 and Test data values ranged from 0.362 to 0.968. The chosen model had AUC values for both training data and test data simultaneously closer to 1, with 0.934 and 0.945 respectively.

The pedology variable contributed with 45.4% of the response provided by the model (Table 2), followed by declivity (23.2%) and maximum temperature (12.5%). The least relevant variable was the minimum temperature, with 0.1% of the total response indicated by the model.

The pedology, maximum temperature, and declivity variables were the most representative of the potential distribution of the A. angustifolia in Curitiba when they were used alone, as indicated by the Jackknife test.

The potential distribution map indicated the northern region of Curitiba with the highest environmental adequacy for the species (Fig. 2), presenting the three largest and most suitable continuous polygons for the occurrence of A. angustifolia. Although well distributed, the occurrence probabilities in the rest of the municipality are higher along the watercourses.

A total of 62 (72.94%) of the 85 green areas evaluated have a medium and or high degree of adequacy for A. angustifolia, represented by 25 parks, 14 RPPNMs, 14 woods, 5 BCBUs, 1 ES, 1 RVS, the botanical garden, and the zoo. Thus, 59 of these areas presented medium adequacy (69.41%) and 36 showed high adequacy (42.35%) (Fig. 2).

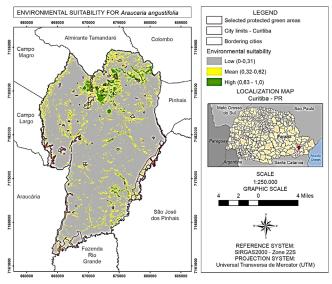


Figure 2. Environmental adequacy for *A. angustifolia* in the municipality of Curitiba, Paraná. Source: The authors.

Table 3. Classes of environmental adequacy for *A. angustifolia* in the municipality of Curitiba, Paraná.

Classes	EAA		AWPA	
Classes	ha	%	ha	%
High	1,463.50	3.40	114.94	7.85
Medium	5,730.40	13.20	334.72	5.84
Low	36,309.70	83.40	1,669.34	4.60
Total	43,503.60	100.00	2,119.00	18.29

Source: The authors.

Note: EAA: Environmental adequacy area; AWPA: Area within protected areas.

Most of the area in Curitiba does not present conditions which are favorable to the occurrence of *A. angustifolia*. However, all of the municipality presents areas of medium or high environmental adequacy regarding spatial distribution, mainly in the northern region, coinciding with the Montane and Alluvial MOF regions. A total of 7,193.9 ha (16.6%) of Curitiba corresponds to high and medium environmentally adequate regions for the occurrence of the species. Of this area, 449.66 ha are within the green areas selected for this study, which corresponds to 13.69% of the relative area present within SGA (Table 3).

The green areas with the highest amount of medium and high classes of environmental adequacy are Iguaçu Park, with 93.5 ha (17.6% of its total area); Bugio *RVS*, with 80 ha (10.9%); and Barigui Park, with 64.5 ha (48%).

Proportionally to the size of each green area, five have 100% of their surface suitable for the occurrence of *A. angustifolia*: Alemão, Gutierrez, Zaninelli Woods, and Bosque da Coruja, and Bacacheri *RPPNM*s, which together have 14.5 ha. Other SGA present more than 90% of their areas as being favorable to the occurrence of the species: 300 Anos, Fazendinha, Pilarzinho, Irmã Clementina, and João Paulo II Woods, Vista Alegre and São Lourenço Parks, and Barigui, and Mirante do Parque Barigui *RPPNM*s.

4. Discussion

This study aimed to verify the relevance of the urban forest of Curitiba for the conservation of *A. angustifolia* from a comparison between the potential distribution model of the species with green areas previously selected from the municipality.

Although this is a common species in the Curitiba region, the potential distribution modeling for *A. angustifolia* indicated that its occurrence is conditioned by specific landscape factors such as topography and pedology. The presence of species individuals in a given location may not necessarily characterize it as the best environment for its development, since individuals may have adapted to less favorable conditions, even if they do not meet all the autecological demands of the species and therefore do not develop as well as possible [18].

Hence, the results found herein were able to detail the most suitable environments for *A. angustifolia* in Curitiba, indicating that even though the environmental adequacy for the species is distributed throughout the whole municipality, which was already expected, the northern region presents the best environmental conditions to meet its autecological demands.

The AUC values indicated that the model generated from the selected environmental variables explains 93.4% of the species' distribution in the study area. This value is considered satisfactory since it is close to 100% [15].

As observed in Fig. 2, the northern region of Curitiba favors the occurrence of *A. angustifolia*. This is explained by pedology and declivity, as these variables were the most significant among the criteria used in the potential distribution model of the species.

Variables related to pedology, especially soil depth, are among the main factors responsible for establishing the species [24], since the soils need to be at least 1 m deep. Even under appropriate climatic conditions, the occurrence probability of a given species decreases if the soils do not present adequate characteristics for their establishment [25].

The result found for *A. angustifolia* in Curitiba regarding declivity is consistent with another study which verified non-homogeneous distribution of individuals of the species in Irati, Paraná, Brazil, and predominantly found the individuals in higher declivity [26].

On the other hand, the occurrence of *A. angustifolia* is also related to flatter reliefs located in the south-central portion of Curitiba, as confirmed by most of the linear polygons of the medium class presented in the environmental adequacy map. The species occurrence was significant in valleys near watercourses in Curitiba before its urbanization [2,3]. Plains are formed in these localities where the soil results from alluvial sediments, where the drainage is favorable and the groundwater is superficial and or commonly emerges, thereby originating Alluvial Mixed Ombrophilous Forest [6].

Areas with soil structure and texture favoring drainage, soil aeration, and water retention, along with greater depth for root development, are considered a priority for the conservation of *A. angustifolia* [27]. These regions generally have more accentuated slopes where water accumulation is frequent.

The results show that the species can establish itself in different declivity situations, provided that there is a certain depth to the soil. Moreover, in the case of anthropized environments, the heterogeneity of the urban landscape should be considered as the most important factor to predict the most appropriate areas for the occurrence of species in cities due to the influence that the landscape exerts on its autecology [28].

Although the species is indigenous to Curitiba, most of the municipality has environmental conditions which are not the most favorable to the occurrence of *A. angustifolia*. Furthermore, most of the existing protected areas currently have medium to high adequacy for establishing the species individuals, especially parks and woods. These green areas are mainly located in the northern region of the municipality and close to waterways. The green areas of Curitiba which have the best environmental conditions for the occurrence of *O. odorifera* are those located in the northern portion of the city [17]. Thus, these forest fragments are apt for preserving the predominant and indigenous endangered MOF species in Curitiba.

Although forest fragments with extensive areas more significantly contribute to the conservation and propagation of threatened species, the role of smaller forest fragments becomes increasingly important due to the constant exploitation of *A. angustifolia* [29]. Therefore, the result shows the importance of creating new urban protected green areas, including in private areas, in the region with greater environmental adequacy for *A. angustifolia* in Curitiba.

Most of the Private Reserves of Municipal Natural Heritage (*RPPNMs*) are already located in the north of the municipality [30], demonstrating to be an effective measure for preserving *A. angustifolia* and other indigenous MOF species which compose the urban forest of Curitiba.

According to Reis et al. (2019b), the SGA with the greatest contributions to the environmental adequacy of *A. angustifolia* may provide better conditions to protect current species individuals, and also to promote natural regeneration and reintroduce planting. Moreover, the implementation of Urban Biodiversity Conservation Woods (*BCBUs*) by the Curitiba government is an important tool to preserve the characteristic species of the MOF in the region. Reis et al. (2019b) corroborate this statement, recommending to implement *BCBUs* aimed at preserving native MOF species, especially those ecologically associated with *A. angustifolia*.

Hopefully, the results found herein may provide subsidies for preserving the species in the urban environment, thus guiding public mangers to actions which favor good development of its individuals, especially considering that the potential distribution of native species in urban environments contributes to promoting biotic interactions between them, and thus favor the functionality of ecosystems [28].

5. Conclusion

It can be concluded that the potential distribution model employed was satisfactory and effective in assigning the best areas for cultivating and preserving *A. angustifolia*, presenting an accuracy of 93.4%.

Establishing *A. angustifolia* is mainly favored in the northern region of Curitiba, although possible occurrence of

the species is well distributed throughout the entire territory of the municipality, especially in valleys along the watercourses, or in areas where drainage, aeration, depth and water retention in the soil are greater, constituting characteristics of Alluvial Mixed Ombrophilous Forests.

A total of 7,193.9 ha (16.6%) of Curitiba has medium and or high environmental adequacy for the species, and 449.66 ha of it (13.69%) is located within the selected green areas for the conservation of *A. angustifolia*.

We primarily recommend planting and preserving *A*. *angustifolia* in the potential distribution area indicated by the model through creating *RPPNMs* or *BCBUs* in locations with a higher degree of slope or near watercourses.

We expect that the municipal public sector will take the necessary measures to contribute to the species conservation given its economic and ecological importance, and look for alternatives to reduce its threatened extinction status. To do so, knowing how environmental characteristics influence the adaptability of native species in more detail is essential, especially in urban environments where the presence of these species significantly contributes to mitigate the impacts of climate change currently potentiated in urban centers.

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A.R.N. dos Reis, received the BSc. Eng. in Forest Engineering in 2017, the MSc. in Forestry Engineering in 2019, all of them from the Universidade Federal do Paraná. Curitiba, Brazil. Currently pursuing a PhD. in Forest Engineering at the same institution. ORCID: 0000-0001-5878-4707

D. Biondi, received the BSc. Eng. in Forest Engineering in 1979, from the Universidade Federal Rural de Pernambuco, Recife, Brazil, the MSc. in Forestry Engineering in 1985, and the PhD. In Forestry Engineering in 1995, all of them from the Universidade Federal do Paraná, Curitiba, Brazil. ORCID: 0000-0003-0532-7363

S. Ivasko Júnior, received the BSc. Eng. in Forest Engineering in 2016, from the Universidade Estadual do Centro-Oeste, Irati, Brazil, the MSc. in Forestry Engineering in 2018, from the Universidade Federal do Paraná. Curitiba, Brazil. Currently pursuing a PhD. in Forest Engineering at the same institution.

ORCID: 0000-0003-1620-4000

J. Viezzer, received the BSc. Eng. in Forest Engineering in 2011, the MSc. in Forestry Engineering in 2014, all of them from the Universidade Federal do Paraná. Curitiba, Brazil. Currently pursuing a PhD. in Forest Engineering at the same institution.

ORCID: 0000-0002-5733-2212

B. Kovalsyki, received the BSc. Eng. in Forest Engineering in 2013, the MSc. in Forestry Engineering in 2016, all of them from the Universidade Federal do Paraná. Curitiba, Brazil. Currently pursuing a PhD. in Forest Engineering at the same institution. ORCID: 0000-0002-1213-2102

J.D. de Oliveira, received the BSc. Eng. in Forest Engineering in 2016, from the Universidade Federal de Santa Catarina, the MSc. in Forestry Engineering in 2018, all of them from the Universidade Federal do Paraná. Curitiba, Brazil. Currently pursuing a PhD. in Forest Engineering at the same

ORCID: 0000-0003-0122-4543

institution