# **Original Article**

# Leaf thickness and elevation explain naturalized alien species richness in a tropical mountain forest: A case study from Mount Gede-Pangrango National Park, Indonesia

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**Abstract:** Exotic plant invasion is one of the major causes of species extinction. In many contexts, mountainous forests are the last refuge for native species. There are several inventory studies conducted in mountainous and tropical forests in Indonesia. However, there are no studies yet on the factors that explain the abundance and richness of surveyed naturalized alien species. This study investigated whether the number of individuals and abundanceweighted species richness (AWR) of naturalized alien plant species in the hiking-trail of Mount Gede-Pangrango National Park (MGPNP) forest area correlated with leaf traits (specific leaf area (SLA) and leaf thickness) and environmental factors (elevation, slope, and normalized difference vegetation index (NDVI)). We showed that leaf thickness and habitat elevation explained the AWR variations of naturalized alien species. We did not detect any important effect of leaf traits and environmental factors on the number of individuals per exotic species per plot. The influence of leaf thickness and habitat elevation indicates the important role of both biotic and abiotic factors on exotic species to develop a high species

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richness and become an invasive species in the tropical mountain forest ecosystem.

**Keywords:** Invasive species; Hiking trail; Cibodas Biosphere Reserve; Invasion ecology; SLA

## 1 Introduction

An invasive alien species (IAS) is defined as "alien species which becomes established in natural or semi-natural ecosystems or habitat, is an agent of change, and threatens native biological diversity" (IUCN 2000). IAS is one of the major threats to biodiversity loss (Gurevitch and Padilla 2004) and contribute to native ecosystem changes (Barney et al. 2013; Simberloff et al. 2013; Jeschke et al. 2014). Management of IAS is a global target in Convention on Biological Diversity (CBD) Aichi Biodiversity Target 9: "By 2020, invasive alien species and pathways are identified and prioritized, priority species are controlled or eradicated, and measures are in place to manage pathways to prevent their introduction and establishment" (Convention on Biological Diversity 2019). Therefore, invasive species surveillance, dispersal identification, containment, and eradication are crucial for biodiversity conservation and natural resources management in any ecosystem.

Plant invasion in tropical mountain forests contexts is one such concern. Plant invasions in the tropics may increase in the future due to the introduction of shade-tolerant exotic species in forest plantations (Fine 2002). Mountain forest ecosystems are isolated from surrounding habitats by their specific climate. These ecosystem barriers make highland ecosystems less likely to be invaded than lowland areas, but also vulnerable due to anthropogenic disturbances (Kašák et al. 2015; Martin and Bellingham 2016). 'Sleeper weeds' that are already introduced and naturalized in tropical environments are potential invasive species and will likely become invaders once the supporting biotic and abiotic factors occur (Duursma et al. 2013) due to high disturbance rates in these tropical forests. Naturalized alien species, which are defined as "alien species that reproduce consistently (cf. casual alien plants) and sustain populations over many life cycles without direct intervention by humans" (Richardson et al. 2000), are potential invaders into tropical forests. Human intervention or impact through socioeconomic activities is also believed to be one of biological invasion causes, termed 'invasion debt' (Essl et al. 2011). Lastly, the time needed for exotic species to become invasive (lag time) may be shorter for tropical ecosystems relative to sub-tropical (Daehler 2009).

Morphological, anatomical, biochemical, physiological or phenological features (Violle et al. 2007) are important factors for invasion ecology and invasibility. Several traits such as specific leaf area (SLA) and seed mass are useful proxies (Drenovsky et al. 2012; Junaedi et al. 2021) to predict the occurrence of plant invasion (Salguero - Gómez 2016, but see Funk et al. 2021 and Catford et al. 2019). For instance, Cornwell and Ackerly (2010) concluded that the local scale abundance of native coastal woody plants correlates with SLA, maximum plant height, and wood density. Leaf traits are useful for invasive species (and native species) management and studies because leaf traits are relatively easy to measure and are informative proxies for invasion process parameters. SLA is a reliable indicator to distinguish invasive exotics from non-invasive exotic plants (van Kleunen et al. 2010). SLA also correlates with plant growth rate (Gibert et al. 2016). Leaf thickness of native species is significantly different from introduced species under similar light irradiance (Osunkoya et al. 2014). Thus, leaf traits indicate the physiological and anatomical aspects of exotic invasive plant species.

While leaf traits are hypothesized as an important variable explaining plant invasion, environmental factors such as elevation may predict the distribution of invasive species (Becker et al. 2005; Ahmad et al. 2018; Arévalo et al. 2005). Alexander et al. (2011) detected a global pattern of exotic plant species decrease along elevational gradient at mountain forests. However, this pattern is debatable (Pysek et al. 2011). Therefore, disentangling the effect of leaf traits and elevation is needed to explain the abundance of the invasive species.

In this study we explored the influence of leaf traits and elevation on the number of individuals and richness of exotic plant species. Specifically, we tested the following hypotheses:

(i) Leaf traits and elevation influence the number of individuals of naturalized species; the thicker the leaf thickness the less the individual numbers of the exotic species. The higher the altitude the less the individual numbers of the exotic species; and (ii) Leaf traits and elevation influence the abundance weighted richness of naturalized species; the thicker the leaf thickness the less the exotic species richness. The higher the altitude the less the exotic species richness.

The study aimed to examine whether the number of individuals and abundance weighted richness of exotic plant species along the hiking-trail of the mountain forest area correlated with leaf traits and environmental factors. We posed two questions in this study. Firstly, whether the analyzed variables explained the number of individuals of naturalized alien plant species; secondly, whether these variables explained the abundance-weighted species richness (AWR) of the same naturalized alien species. We constructed and analyzed a multiple linear regression model of the number of individuals of naturalized alien plant species to answer the first question and an analogous model of AWR to answer the second question. Information on the correlation of exotic species traits and abundance in mountain forests will be useful for invasive species risk assessment to support exotic species management. This information may shed some light on invasion patterns in tropical forests. We conducted these studies at the Cibodas Biosphere Reserve (CBR), which is one out of eight Indonesian biosphere reserves. Invasive exotic species management in this CBR area could support native biodiversity conservation because CBR has important and strategic values for Indonesian biodiversity conservation due to the endemic and endangered species contained in this area.

#### 2 Materials and Methods

#### 2.1 Study area and plot design

This study was conducted within the core area (the conserved forested area) of the Cibodas Biosphere Reserve (CBR). Cibodas Biosphere Reserve is the oldest Indonesian biosphere established in 1977, and contains numerous endemic and rare species (Man and Biosphere Indonesia 2011). This biosphere reserve core area constitutes the Mount Gede-Pangrango National Park (MGPNP) and is considered an important national and global conservation area. The national park covers an area of 22,851 ha and is located in the regions of Cianjur, Sukabumi, and Bogor in West Java (Indonesia). According to the updated Koppen-Geiger climate classification (Kottek et al. 2006), the national park belongs to the Type Af (precipitation  $\geq$ 60 mm) that refers to tropical humid rainforest climate. The annual mean temperature in MGPNP decreases gradually from 18°C at 1,400 m asl. to a minimum of 0°C at mountain summits at 3,019 m asl. and 2,962 m asl. The annual rainfall ranges from 3,000 to 4,200 mm yr-1 with most of the precipitation in the wet season between December and March. The forest is classified as a moist montane tropical forest (van Steenis et al. 1972). The area hosts about 120 different tree species (DBH >10 cm), with the four most abundant ones (Schima wallichii, Altingia excelsa, Vaccinium varingiaefolium, and Castanopsis acuminatissima) accounting for 57% of the total biomass (Rozak et al. 2017).

We conducted sampling in five locations, at five different slopes of MGPNP: Bodogol (S6°46' 25.50", E106°50'30.65") at 736-918 m asl., Tapos (S 6°72'099", E106°88'826") at 748-1195 m asl., Cisarua (S6°73'422", E106°91'218") at 960-1256 m asl., Selabintana (S6°50'03.50", E106°58'11.20") at 1460-1537 m asl., and Tegalega (S 6°46"25.50" E 106°50'30.65") at 1251-1266 m asl. (Fig. 1). For all five locations, we sampled four to six plots placed along a transect defined by a hiking trail. During the sampling data collection, we started the sampling transect from the forest exterior and ended the transect in the forest interior. The minimum distance between each plot in a transect was 100 meters. The size of each plot was 10 meters wide by 50 meters long. In total, 24 plots covering an area of 12,000 m<sup>2</sup> (1.2 ha) were sampled.

We did not conduct sampling at the same altitude for all five locations for two main reasons. First, we aimed to examine the habitat elevation effect on exotic plant species abundance. Second, the land use contexts from one location to another were mostly different at the same elevation. For instance, at elevation 800 m asl., there is a forest ecosystem that exists in Bodogol, but we only found villages and agriculture land at the same elevation at Selabintana. Therefore, the starting point of the first plot for each trail was varied as there were some areas that at lower elevations had villages and agricultural lands.

We also conducted a species-area curve analysis to examine whether our sampling size was representative. The species-area curve from our analysis showed that the sampling number is representative because the curve shape that reached a plateau beyond 20 plots (Appendix 1).



**Fig. 1** Five sampling locations and plot design of the study in Mount Gede Pangrango National Park: Bodogol, Tapos, Cisarua, Selabintana, and Tegalega and its relative position within Java Island, Indonesia. Each plot covered an area of 500 m<sup>2</sup>. Altitude range = 736 - 1537 m asl. The figure also describes the NDVI map (based on Landsat 8 OLI, date July 18th, 2018, from https://earthexplorer.usgs.gov/, accessed on March 29th, 2019).

#### 2.2 Data collection and measurement

We counted the number of individuals of each exotic species found within the plot. In each plot, we collected leaf samples of each exotic species to calculate specific leaf area (SLA) and leaf thickness. We collected leaf samples near the end of the branches, exposed to maximum light intensity, and with varying height depending on the life form of the naturalized alien plant species (Perez-Harguindeguy et al. 2013). We recorded the latitude and longitude as well as the altitude of each plot using a GPS device. The normalized difference vegetation index (NDVI) and distance to the forest edge from the nearest border of the plot were calculated based on the position of each plot. A total of five explanatory variables (Table 1) were used to explain two dependent variables: the number of detected naturalized alien individuals and the abundanceweighted richness of naturalized alien species.

SLA is calculated as the ratio between leaf area (mm<sup>2</sup>) and dry leaf mass (mg). We collected five to ten leaves for each exotic species found in at least one plot. We measured SLA and leaf thickness from all leaves following the protocol from Perez-

**Table 1** The five explanatory continuous variables used in this study with the units, median, minimum value, and maximum value across the plots. This study did not include categorical or ordinal variables. Sample size = 104 measurements from 24 plots.

Variables	Units	Median	Min.	Max.
Specific leaf area	mm <sup>2</sup> mg <sup>-1</sup>	44.55	2.56	287.19
Leaf thickness	mm	18.11	0.29	37.46
NDVI	-	0.40	0.31	0.48
Habitat elevation	m	1147	736	1537
Distance to the forest edge	m	200	2.0	2660

Harguindeguy et al. (2013). Leaf thickness was measured using a Vernier Mitutoyo caliper. For SLA measurement, leaves were stored in a plastic bag when collected from the field then photographed for capturing leaf image and area data, and dried and weighed to collect dry leaf mass data. We measured the dry leaf mass in groups of 5-10 dry leaves of the same species.

The NDVI value of our study site was extracted from the Landsat 8 OLI (8<sup>th</sup> July 2018) and calculated using the Eq. (1):

$$NDVI = \frac{NIR - Red}{NIR + Red}$$
(1)

where NIR is a reflection in the near-infrared band ( $\lambda$ ~0.8 µm) and *Red* is a reflection in the red band ( $\lambda$ ~0.6 µm) regions of the spectrum, respectively, reflected by the vegetation and captured by the sensor of the satellite. The formula is based on the fact that chlorophyll absorbs Red whereas the mesophyll leaf structure scatters NIR. NDVI values thus range from -1 to +1, where negative values correspond to an absence of vegetation (Myneni et al. 1995). To minimize the atmospheric effects on our NDVI calculation, we selected a cloudless image for our study site, and therefore did not conduct atmospheric correction.

#### 2.3 Statistical model and analysis

# 2.3.1 Model of number of individuals per species

We modelled the linear correlation between the number of individuals per naturalized alien plant species per plot and the species' leaf traits and habitat data. The number of individuals per species per plot refers to the number of individuals detected during plot sampling. Based on our sampling result, the number of individuals may reach more than 400 individuals in a plot (Appendix 2).

Since the observed data were not normally distributed and varied in their ranges (Table 1), we standardized all variables (SV). We standardized the value (Gelman 2008) by subtracting it with the mean (M) and dividing it by the standard deviations value (SD). The SV was calculated by the Eq. (2):

$$SV = \frac{(value - M)}{SD}$$
(2)

where SD is calculated as Eq. (3):

$$SD = \sqrt{\frac{\sum (value - M)^2}{N - 1}}$$
(3)

Thus, we conduct data analysis based on the following model (Eq. (4)):

$$S = \beta_0 + \beta_1 \operatorname{SV}_1 + \beta_2 \operatorname{SV}_2 + \beta_3 \operatorname{SV}_3 + \beta_4 \operatorname{SV}_4 + \beta_5 \operatorname{SV}_5 + \operatorname{error}$$
(4)

where *S* refers to the observed number of individuals of a naturalized alien species in a given plot. The SV<sub>1</sub>, SV<sub>2</sub>, SV<sub>3</sub>, SV<sub>4</sub>, and SV<sub>5</sub> refer to a standardized specific leaf area for the species (SLA), standardized leaf thickness for the species, habitat elevation for the plot, distance to forest edge of naturalized alien species for the plot, and NDVI for the plot. We also normalized the data by using a log-transformation and conducted Pearson correlation tests to check for possible collinearity issues. All the models were analyzed using Bayesian multiple regression, conducted in R (R Core Team 2018) using package "rjags" to call JAGS from R and Rstudio (Plummer 2019).

# 2.3.2 Model of abundance-weighted richness (AWR)

For each plot *i*, an abundance-weighted richness (AWR<sub>*i*</sub>) was calculated as the product of the species number of exotic species in plot *i* ( $x_i$ ) and the number of exotic individuals in plot *i* ( $y_i$ ) relative to the total number of exotic individuals across all plots (z). Hence, for each plot, the AWR was calculated by the Eq. (5):

$$AWR_i = \frac{x_i \times y_i}{z} \tag{5}$$

A linear mixed model for AWR was developed to test for the effect of SLA ( $X_1$ ), leaf thickness ( $X_2$ ), the altitude of the plot ( $X_3$ ), distance to the forest edge ( $X_4$ ) from the plot, and NDVI in the plot ( $X_5$ ). Thus, the full model of AWR (Y) was modeled by the Eq. (6):

$$Y = \beta_0 + \beta_1 X_1 + \beta_2 X_2 + \beta_3 X_3 + \beta_4 X_4 + \beta_5 X_5 + u + \text{error}$$
(6)

**Table 2** Exotic plant species found in 24 sampling plots at five trails/locations in Mount Gede-Pangrango National Park. Surveys conducted on an elevation between 736-1537 m asl. Symbol "+" represents the presence of corresponding species in the corresponding location: (+) exotic species detected in one plot, (++) detected in two plots, (+++) detected in three plots, (+++) detected in four plots. Origin refers to the natural distribution of the species (http://www.plantsoftheworldonline.org/). (No.= Number of detected individuals)

Species name	Bodogol	Tapos	Cisarua	Tegalega	Selabintana	No.	Origin
Ageratum conyzoides		+				6	Mexico
Ageratina riparia		+	+	+++	++	678	Mexico
Austroeupatorium inulifolium	++	++	+++		+	247	Panama to South Tropical America, Trinidad
Borreria cf alata	+					5	Colombia to North South America and West Brazil
Brugmansia x candida			+++		+	77	South Colombia to Ecuador
Calliandra calothyrsus	++	+	++++	+		1047	South Mexico to Central America
Carex cf baccans					+++	16	Tropical & Subtropical Asia
Cestrum aurantiacum				+		14	Mexico to Venezuela
Cinchona pubescens		+	+		+	227	Costa Rica to West South America
Cinchona succirubra				+		10	Costa Rica to West South America
Clidemia hirta	++++	+++	++++	++++	++++	1136	Mexico to Tropical America
Clibadium surinamense		++				55	Tropical America
Costus cf speciosus		++				25	Tropical & Subtropical Asia and North East Queensland
Dracaena cf angustifolia			+			40	Tropical & Subtropical Asia to North Australia
Erechtites valerianifolius		+				13	Mexico to Tropical America
Erechtites cf hieracifolia	+					12	Tropical America
Eupatorium cf odoratum	++					66	Tropical & Subtropical America
Hedyotis philippensis		++				91	Hainan, Philippines
Hydrocotyle sibthorpioides			+			9	New Zealand to Kermadec Islands
Justicia cf tinctoria		+				5	South India, Sri Lanka, Andaman Islands to Nicobar Islands, Hainan to Vietnam
Lophatherum gracile		++				287	South China to Japan and Tropical Asia, North Queensland
Maesopsis eminii	+++	++	+++			151	Liberia to South Sudan and Zambi
Melastoma malabathricum		+			+	14	Seychelles, Tropical & Subtropical Asia to North & East Australia
Oxalis barrelieri		+				13	Tropical America
Piper aduncum		++				711	Mexico to Tropical America.
Pinus merkusii	+		++			12	Sumatera, Philippines
Solanum torvum	++	+	+			20	Mexico to North South America, Caribbean, East Brazil
Spilanthes cf paniculata	+					10	China (Guangdong, Guangxi, Yunnan), Taiwan, Laccadives to Queensland
Stachytarpheta jamaicensis	+	+				112	South East U.S.A. to Tropical America
Strobilanthes hamiltoniana				++		121	East Nepal to South East Tibet and North Thailand
Strobilanthes cf cernua			+			20	Sumatera to Bali
Strobilanthes cf paniculata		+				19	Indo-China to West Malesia
Strophacanthus dichotomus				+		6	South Malesia
Synedrella nodiflora	+					5	Tropical & Subtropical America
Wedelia biflora	+					27	Mozambique to KwaZulu-Natal, West Indian Ocean to Pacific
Total						5307	

where  $\beta$  is the coefficient of the predictor, and u is a random effect for plot. Plot locations were considered as a random factor to minimize spatial autocorrelation effect in the model. SLA, leaf thickness, altitude, and distance to the forest edge were not normally distributed (p <0.05, Shapiro-Wilk Normality Test). To fulfill normality assumptions as well as to avoid heteroscedasticity of the residuals, these variables were log-transformed. We also performed Pearson correlation tests to check the correlation between analyzed variables. All analyses in the plot level were performed using the following packages: "lme4" to fit linear mixed models (Bates et al. 2015), "glmulti" to predict the best fit model based on the lowest Akaike Information Criterion with correction (AICc) and to calculate the relative importance value for each fixed factor (Calcagno 2010), "MuMIn" to extract marginal (i.e., the proportion of variance explained by fixed factor) and conditional (the proportion of variance explained by a fixed and random factors)  $R^2$  of the model (Barton 2009), and "car" to analyze significance in differences between fixed factors (Fox and Weisberg 2019).

# 3 Results

We found a total of 5307 individuals that belongs to 35 exotics species in 24 sampling plots (Table 2). One species, i.e., *Clidemia hirta*, was found in all locations. The majority of the species (24 out of 35) were found in only one sampling plot.

#### 3.1 Model of number of individuals

We did not detect any significant effect of explanatory variables on the number of individuals of naturalized alien species (Fig. 2, Appendix 3). Apart from leaf thickness, we found insignificant negative correlations between explanatory variables with the number of naturalized exotic plant species individuals.

## 3.2 Model of abundance-weighted richness

The full model explained the AWR with marginal and conditional R<sup>2</sup> of 70% and 77%, respectively (Table 3). Leaf thickness and altitude were positively and negatively correlated with plot-level AWR, respectively. Those two variables showed high relative importance value (>0.8, Appendix 4) and always

**Table 3** The coefficient ( $\beta$ ), standard errors (SE), degree of freedom (df), t-value, and p-value (*P*) of the full model (Eq. 6). Detected correlations are marked by asterisks (\*).

Predictor	β	SE	df	<i>t</i> -value	Р
Intercept	18.89	10.49	7.34	1.80	0.113
SLA	0.81	0.54	17.74	1.50	0.152
Leaf thickness*	2.21	0.49	17.33	4.48	<0.001
Altitude*	-8.74	3.30	6.26	-2.65	0.037
Distance	-0.14	0.43	17.66	-0.34	0.740
NDVI	3.90	5.29	16.96	0.74	0.472

appeared in the best five models of AWR (Appendix 5). We did not detect any significant effect of SLA, distance to the forest edge, or NDVI to the plot-level AWR.

# 4 Discussion

Our study investigated the correlation of leaf traits and environmental factors with the number of individual and richness of naturalized alien species in a mountain region of MGPNP. We found that the richness of naturalized alien species was significantly influenced by those two variables, leaf thickness and altitude (Table 3). However, we did not detect any influence of the tested variables on the number of individuals of naturalized alien species (Fig. 2). Our hypothesis that altitude and leaf traits (leaf thickness) influence the naturalized alien species was thus supported only at the context of richness (AWR), but not for number of individuals (Fig. 2).

# 4.1 Leaf thickness and altitude affect the abundance-weighted richness (AWR) of naturalized alien species

We found leaf thickness and altitude significantly affect the richness of the exotic species in MGPNP (Table 3). The fact that leaf thickness and altitude correlate with AWR provides two insights. Firstly, the light may be a prominent abiotic factor for exotic species to establish and become dominant in native tropical rainforests. In this plot-level model, leaf thickness positively correlated with AWR, meaning that thicker leaves tend to support exotic species development and growth to gain optimum abundance. Thicker leaves indicate greater exposure of leaves to sunlight (Perez-Harguindeguy et al. 2013). Thus, the canopy gaps that provide abundant light resources in a tropical forest may positively correlate with AWR at plot-level.

Secondly, this richness model shows that the higher altitude area of mountain forests is colonized by less exotic plant species. The traits of these exotic species may limit their abundance at high altitudes. The elevational gradient of invasive species distribution in the mountain ecosystems is also confirmed by other studies (Arévalo et al. 2005; Becker et al. 2005; Ahmad et al. 2018). This negative elevation effect on exotic species richness may be an indication of high-altitude abiotic factors as the limitation for exotic species to become developed and abundant. For instance, the lower air temperature at higher elevation may not be suitable for these exotic species' habitat preferences. However, dispersal pathways may be more crucial than abiotic extreme conditions for invasion resistance within high-altitude plant ecosystems (Alexander et al. 2009).

# 4.2 Undetected effect of leaf traits and abiotic (habitat) factors on the number of individuals of naturalized alien species

Despite the suggested correlation between the abundance of exotic species and their traits (Cornwell and Ackerly 2010), we found no effect of five explanatory variables on the number of individuals of naturalized alien species (Fig. 2). The undetected effects of these abundance-trait correlations were surprising. These findings may be due to the exclusion of the life stages of the samples. We did not consider the life stages of measured individuals for leaf trait measurements. Leaf traits may have fluctuated, and the range of intraspecific variation may be driven by life-stages (Spasojevic et al. 2014; Funk et al. 2021). The plasticity of SLA of tropical forest plant species is relatively large (Rozendaal et al. 2006) and these variations may not be captured in our study.

Moreover, the facts that naturalized alien species with large number of individuals are having smaller SLA values are quite interesting since large SLA values are associated with potential invasiveness (Van Kleunen et al. 2010). This finding may indicate that larger SLA values are only associated with the early stage of invasion (naturalization), but not for the later invasion stages. Catford et al. (2019) stated that SLA is highly correlated with the abundance of exotic species at early plant invasion stages, but not for further invasion processes.

Furthermore, the naturalized alien species with



**Fig. 2** Variable coefficient results of the analysis results of the number of individual model (Eq. 4). Detected effects are indicated by a 95% confidence interval (horizontal lines) that does not include zero (red dashed lines). We did not detect any significant effect of explanatory variables of the number of naturalized alien individuals.

large number of individuals may have a conservative adaptation (invest more energy into biomass than into fast growing rate) due to their life strategy. The conservative strategy of these species may be indicated by their relatively low SLA value given the fertile soil conditions of the invaded habitat (Maracahipes et al. 2018) and low SLA is a common plant adaptation in tropical forest ecosystem (Tian et al. 2016). However, these hypotheses still need to be tested since we did not consider soil fertility aspects in this study. We suggest including this soil edaphic factor in further study to answer whether these naturalized alien species with large number of individuals have a conservative (aim for higher biomass) or acquisitive (aim for faster growth rate) adaptation strategy.

#### 4.3 Limitations of the study

There are several limitations within this study. First, we did not collect light intensity or canopy cover measurements as a proxy for light. Light is an important abiotic factor for plant invasion in tropical forests (Martin et al. 2009). Even though we collected NDVI as a proxy for canopy closure, we did not consider the possibility that wide leaf color ranges may bias the estimation of canopy closure based on NDVI. However, NDVI was considered an unimportant variable in both the number of individuals model and the richness model.

Second, we also did not consider the edaphic factors. Nutrition factors may contribute to exotic plant abundance. The ratio of N and P correlates with the growth and competitive dominance of invasive plant species (Zhang et al. 2017). However, we focused on leaf traits (SLA and leaf thickness) that could be utilized as a proxy for plant-environment relation indicators (Cornwell and Ackerly 2010; Spasojevic et al. 2014) and altitude, which is a simple proxy and an important factor for exotic plant species distribution and patterns in mountainous ecosystem contexts (Alexander et al. 2009; Pyšek et al. 2011).

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### **Authors' Contribution**

All authors were equally contributed to the field data collection. DIJ and AHR were conducted analysis and interpretation of data. DIJ conducted abundance model analysis. AHR conducted richness model analysis. IWH conducted NDVI data calculation and

#### References

- Ahmad M, Uniyal SKR, Singh RD (2018) Patterns of alien plant species richness across gradients of altitude: analyses from the Himalayan state of Himachal Pradesh. Trop Ecol 59(1): 35-43.
- Alexander JM, Naylor B, Poll M, et al. (2009) Plant invasion along mountain roads: the altitudinal amplitude of alien Asteraceae forbs in their native and introduced ranges. Ecography 32: 334-344.
- https://doi.org/10.1111/j.1600-0587.2008.05605.x
- Alexander JM, Kueffer C, Daehler CC, et al. (2011) Assembly of nonnative floras along elevational gradients explained by directional ecological filtering. Proc Natl Acad Sci USA 108(2): 656-661. https://doi.org/10.1073/pnas.1013136108
- Arévalo JR, Delgado JD, Otto R, et al. (2005) Distribution of alien vs. native plant species in roadside communities along an altitudinal gradient in Tenerife and Gran Canaria (Canary Islands). Perspect Plant Ecol Evol Syst 7(3): 185-202.

### **5** Conclusion

This study showed that leaf thickness and elevation are positively and negatively correlated with plant species richness, respectively. exotic Consequently, these traits are useful parameters to be used in the exotic plant species management in the mountain forests ecosystem. For the specific context of this study site (Mount Gede-Pangrango), the management of exotic plant species should be prioritized and focused in a forest area with gaps and located at a lower elevation. Further study needed to include other abiotic factors such as light and edaphic (soil) factors to model the abundance of exotic plant species in the tropical mountain forests.

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created map data. DIJ, ZM, MZ, IWH, and AHR were equally contributed to the methods design. DIJ, AHR, MZ, IWH, and ME were equally contributed to the manuscript writing. DIJ, AHR, IWH, and ME were equally contributed as main authors.

https://doi.org/10.1016/j.ppees.2005.09.003

- Barney JN, Tekiela DR, Dollete ES, Tomasek BJ (2013) What is the "real" impact of invasive plant species? Front Ecol Environ (11): 322-329. https://doi.org/10.1890/120120
- Bartoń K (2009) MuMIn: Multi-model inference, R package version 0.43.6. https://CRAN.R-project.org/package=MuMIn
- Bates D, Macchler M, Bolker B, Walker S (2015) Fitting linear mixed-effects models using lme4. J Stat Softw 67(1): 1-48. https://arxiv.org/abs/1406.5823
- Becker T, Dietz H, Billeter R, et al. (2005) Altitudinal distribution of alien plant species in the Swiss Alps. Perspect Plant Ecol Evol Syst 7(3): 173-183. https://doi.org/10.1016/j.ppees.2005.09.006

Calcagno V (2010) glmulti: Model selection and multimode;

- inference made easy, R package version 1.0.7.1. https://CRAN.R-project.org/package=glmulti
- Catford JA, Smith AL, Wragg PD, et al. (2019) Traits linked with

species invasiveness and community invasibility vary with time, stage and indicator of invasion in a long - term grassland experiment. Ecol Lett 22(4): 593-604. https://doi.org/10.1111/ele.13220

- Convention on Biological Diversity (2019) Quick guide to Aichi Biodiversity Targets: Invasive alien species prevented and controlled. (https://www.cbd.int/doc/strategic-plan/targets/ T9-quick-guide-en.pdf, accessed 2 June 2019)
- Cornwell WK, Ackerly DD (2010) A link between plant traits and abundance: evidence from coastal California woody plants. J Ecol 98: 814-821.

https://doi.org/10.1111/j.1365-2745.2010.01662.x

- Daehler C (2009) Short lag times for invasive tropical plants: evidence from experimental plantings in Hawai'i. PLoS One 4: e4462. https://doi.org/10.1371/journal.pone.0004462 Drenovsky RE, Grewell BJ, D'Antonio CM, et al. (2012) A
- functional trait perspective on plant invasion. Ann Bot 110: 141-153. https://doi.org/10.1093/aob/mcs100
- Duursma DE, Gallagher RV, Roger E, et al. (2013) Nextgeneration invaders? Hotspots for naturalised sleeper weeds in Australia under future climates. PLoS One 8: e84222. https://doi.org/10.1371/journal.pone.0084222
- Essl F, Dullinger S, Rabitsch W, et al. (2011) Socioeconomic legacy yields an invasion debt. Proc Natl Acad Sci USA 108(1): 203-207. https://doi.org/10.1073/pnas.1011728108
- Fine PVA (2002) The invasibility of tropical forests by exotic plants. J Trop Ecol 18: 687-705.

- https://doi.org/10.1017/S0266467402002456 Fox J, Weisberg S (2019) An {R} companion to applied regression, Third Edition. Thousand Oaks CA: Sage.
- Funk JL, Larson JE, Vose G (2021) Leaf traits and performance vary with plant age and water availability in Artemisia californica. Ann Bot 127(4): 495-503. https://doi.org/10.1093/aob/mcaa106
- Gelman A (2008) Scaling regression inputs by dividing by two standard deviations. Stat Med 27: 2865-2873.

https://doi.org/10.1002/sim.310

- Gibert A, Gray EF, Westoby M, et al. (2016) On the link between functional traits and growth rate: meta - analysis shows effects change with plant size, as predicted. J Ecol 104: 1488-1503. https://doi.org/10.1111/1365-2745.12594
- Gurevitch J, Padilla DK (2004) Are invasive species a major cause of extinctions? Trends Ecol Evol 19: 470-474. https://doi.org/10.1016/j.tree.2004.07.005
- International Union for Conservation Nature (2000) IUCN guidelines for the prevention of biodiversity loss caused by alien invasive species. https://portals.iucn.org/library/efiles/ documents/Rep-2000-052.pdf
- Jeschke JM, Bacher S, Blackburn TM, et al. (2014) Defining the impact of non - native species. Conserv Biol 28(5): 1188-1194. https://doi.org/10.1111/cobi.12299
- Junaedi DI, Guillera-Arroita G, Vesk PA, et al. (2021) Traits explain invasion of alien plants into tropical rainforests. Ecol Evol 11: 3808-3819. https://doi.org/10.1002/ece3.7206
- Kašák J, Mazalová M, Šipoš J, Kuras T (2015) Dwarf pine: invasive plant threatens biodiversity of alpine beetles. Biodivers Conserv 24: 2399-2415.

https://doi.org/10.1007/s10531-015-0929-1

- Kottek M, Grieser J, Beck C, et al. (2006) World map of the Koppen-Geiger climate classification updated. Meteorologische Zeitschrift 15: 259-263. https://doi.org/10.1127/0941-2948/2006/0130
- Maracahipes L, Carlucci MB, Lenza E, et al. (2018) How to live in contrasting habitats? Acquisitive and conservative strategies emerge at inter- and intraspecific levels in savanna and forest woody plants. Perspect Plant Ecol Evol Syst 34: 17-25. https://doi.org/10.1016/j.ppees.2018.07.006
- Man and Biosphere Indonesia (2011) Cagar Biosfer Cibodas. (http://www.mab-indonesia.org/cagar.php?i=cibodas, Accessed 10 May 2011)

- Martin PH, Bellingham PJ (2016) Towards integrated ecological research in tropical montane cloud forests. J Trop Ecol 32: 345-354. https://doi.org/10.1017/S0266467416000432
- Martin P, Canham C, Marks P (2009) Why forests appear resistant to exotic plant invasions: intentional introductions, stand dynamics, and the role of shade tolerance. Front Ecol Environ 7: 142-149. https://doi.org/10.1890/070096
- Myneni RB, Hall FG, Sellers PJ, Marshak AL (1995) The interpretation of spectral vegetation indexes. IEEE Trans Geosci Remote Sens 33(2): 481-486. http://sites.bu.edu/ cliveg/files/2013/12/myneni-tgars-1995.pdf

Osunkoya OO, Boyne R, Scharaschkin T (2014) Coordination and plasticity in leaf anatomical traits of invasive and native vine species. Am J Bot 101(9): 1423-1436. https://doi.org/10.3732/ajb.1400125

Pérez-Harguindeguy N, Díaz S, Garnier E, et al. (2013) New

handbook for standardised measurement of plant functional traits worldwide. Aust J Bot 61: 167-234. https://doi.org/10.1071/BT12225

Plummer M (2019) rjags: Bayesian graphical models using MCMC. R package version 4-10.

https://CRAN.R-project.org/package=rjags Pyšek P, Jarošík V, Pergl J, Wild J (2011) Colonization of high altitudes by alien plants over the last two centuries. Proc Natl Acad Sci U S A 108(2):439-440.

https://doi.org/10.1073/pnas.1017682108

- R Core Team (2018) R: A language and environment for statistical computing. Vienna, Austria: R Foundation for Statistical Computing. (https://www.r-project.org/) Richardson DM, Pyšek P, Rejmánek M, et al. (2001)
- Naturalization and invasion of alien plants: concepts and definitions. Divers Distrib 6: 93-107.

https://doi.org/10.1046/j.1472-4642.2000.00083.x

- Rozak AH, Astutik S, Mutaqien Z, et al. (2017) Hyperdominance of tree species and biomass in Mount Gede Pangrango National Park, Indonesia (In Indonesian). J Ilmu Kehutanan 11(1): 85-96. https://doi.org/10.22146/jik.24903
- Rozendaal DMA, Hurtado VH, Poorter L (2006) Plasticity in leaf traits of 38 tropical tree species in response to light; relationships with light demand and adult stature. Funct Ecol 20: 207-216. https://doi.org/10.1111/j.1365-2435.2006.01105.x
- Salguero-Gómez R (2016) Applications of the fast-slow continuum and reproductive strategy framework of plant life histories. New Phytol 213(4): 1618-1624. https://doi.org/10.1111/nph.14289

Simberloff D, Martin J, Genovesi P, et al. (2013) Impacts of biological invasions: what's what and the way forward. Trends Ecol Evol 28: 58-66. https://doi.org/10.1016/j.tree.2012.07.013

- Spasojevic MJ, Yablon EA, Oberle B, Myers JA (2014) Ontogenetic trait variation influences tree community assembly across environmental gradients. Ecosphere 5(10): 1-20.https://doi.org/10.1890/ES14-000159.
- Tian M, Yu G, He N, Hou J (2016) Leaf morphological and anatomical traits from tropical to temperate coniferous forests: Mechanisms and influencing factors. Sci Rep 6: 19703. https://www.doi.org/10.1038/srep19703
- Van Kleunen M, Weber E, Fischer M (2010) A meta-analysis of trait differences between invasive and non-invasive plant species. Ecol Lett 13: 235-245.

https://doi.org/10.1111/j.1461-0248.2009.01418.x Van Steenis CGGJ, Hamzah A, Moehamad T (1972) Mountain flora of Java. EJ Brill: Leiden.

Violle C, Navas ML, Vile D, et al. (2007) Let the concept of trait be functional! Oikos 116: 882-892.

https://doi.org/10.1111/j.0030-1299.2007.15559.x

Zhang HJ, Chang RY, Guo X, et al. (2017) Shifts in growth and competitive dominance of the invasive plant Alternanthera philoxeroides under different nitrogen and phosphorus supply. Environ Exp Bot 135: 118-125. https://doi.org/10.1016/j.envexpbot.2016.12.014