#### **ORIGINAL RESEARCH**



# **Managing the Forest Landscape: Exploring the Quantitativ[e](http://crossmark.crossref.org/dialog/?doi=10.1007/s11842-020-09451-8&domain=pdf)  Interplay Between Forestland Patches, Areas and Landowner Numbers in Counties from Alabama, USA**

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## **Abstract**

Forestlands provide timber resources and valuable ecosystem services. To better manage forest landscape and develop policies, it is important to quantify the relationships between the number of forestland patches, patch areas, and landowner numbers. By using integrated analysis of information about the forestlands in 17 counties in Alabama, USA, similar scaling relationships are determined in the forestland patch quantity, areas, and owner numbers across various patch-size classes. Forestlands on individual properties of up to 50 acres cover about 59% of patch number and 21% of total area, encompassing 77% of landowner numbers. In Alabama, few private landowners have more than 500 acres of forestland. Similar relationships between diferent sizes of forestlands and the accumulated percentages of patch quantity, areas, and landowner numbers exist. These distribution relationships can be described by quadratic and power functions. A signifcant correlation exists between forestland prices and the exponents of these scaling relationships in forest patch numbers, total areas, and landowner numbers across counties. These results provide a new understanding of the distribution of forestland in Alabama. The implication is that an economic approach (e.g., adjusting forestland prices or taxes) may help to better manage the remaining forest landscape and develop conservation policy in this region that could be used to reduce forest fragmentation.

**Keywords** Forest landscape · Fragmentation · Land price · Scaling relationship · Socioeconomic factors

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#### **Introduction**

Forestlands bring not only direct income to landowners through timber sales, but also provide many intangible ecosystem services to society—such as absorbing atmospheric  $CO<sub>2</sub>$  for carbon sequestration, providing habitat for wildlife, providing recreational opportunities, regulating local climate, and protecting water and air quality (Millennium Ecosystem Assessment [2005;](#page-14-0) Chen [2016\)](#page-14-1). Change of forest landscape structure (e.g., land patches and their areas) or number of landowners may afect the sustainability of ecosystem services because of non-linear responses from both natural and socioeconomic interactions, such as the forest fre regime and risk through changing tree species or management practices (Chen [2007;](#page-14-2) Sutherland et al. [2016;](#page-15-0) Butsic et al. [2017](#page-14-3)). Forestland parcelization and fragmentation can lead to the loss of wildlife habitat and timber, decreased water quality, and loss of recreational access (LaPierre and Germain [2005\)](#page-14-4). Some of these ecological values are not necessarily refected in the market, but awareness of their socioeconomic and political relevance is growing. Thus it is necessary to manage forest landscape across a large scale, especially for the emergent patterns and ecological regime shifts.

Because private forestland covers about 430 million acres in the USA (Best [2002](#page-14-5)), forestland management or ownership change has the potential to change forest landscape structure and coverage pattern, which may lead to altered ecological functions (Wear et al. [1996;](#page-15-1) Chen and Fraser [2009](#page-14-6)). For example, a large tract of forest land can support more wildlife species than several small and isolated pieces. From an economic perspective, all forest landowners in the USA are subject to local, or state, or federal taxes. When property taxes increase, such as at the urban and rural interface, the benefts of growing forests and trees are less than the expense of holding a piece of land and paying annual taxes, and the forest landowners are likely to sell part or all their properties or change land use despite personal objectives ranging from timber production to preservation of a family legacy (Butler et al. [2012](#page-14-7)). In turn, this could lead to increased forest fragmentation and decreased area of forest lands, which can afect local or regional ecological processes.

After studying the land ownership and forest coverage across 66 watersheds in the state of Oregon, Stanfeld et al. ([2002\)](#page-15-2) concluded that patterns of land ownership and forest coverage were related in signifcant ways. Spatial patterns in many landowners' motivations and behaviors (e.g., harvesting forest or forest land sale) could be related to underlying similarities and diferences in biophysical, social, and economic factors in the southern forests of the USA (Poudyal et al. [2019\)](#page-15-3). Traditionally, only the total (or average) area of a forest landowner was considered, but its spatial condition was neglected, such as whether the land was separated into several disconnected patches. When the landscape becomes fragmented, more small patches appear. Therefore, it is important to monitor and study the patterns of forestland patches, their areas, and landowner number in a region to analyze their relationships with socioeconomic factors.

Alabama has the third largest commercial forest industry in the USA because of its diverse and abundant forest resources (Phillips [2006](#page-15-4)). Tree species richness in Alabama have been documented to vary from 145 to 193 species. In Alabama, the

total forest area is approximately 9.3 million ha, covering roughly two-thirds of the State ([www.forestry.alabama.gov\)](http://www.forestry.alabama.gov). Timber production, including the production of sawn timber, pulpwood, and fuelwood, and non-timber production, such as for hunting game, are typical objectives for private forest landowners in Alabama (Gan et al. [2003](#page-14-8); Fraser et al. [2005](#page-14-9); Pan et al. [2007\)](#page-15-5). In this area, poor landowners may be more likely to harvest timber or sell their forestlands because this can bring income (Alig et al. [1990](#page-14-10)). Previous studies reported that 5% of private landowners in Alabama own less than 8 acres on average (McNabb and Bliss [1994](#page-14-11)), while 32% hold less than 51 acres (Zhang et al. [1998;](#page-15-6) Pan et al. [2007\)](#page-15-5). Satellite images indicated a higher rate of deforestation and pattern change in private forests in Alabama (Li et al. [2009](#page-14-12)). It is believed that multiple factors, including human population density, age structure, urban–rural population structure, income sources, and land tenure type, are associated with forestland size distribution at the county level (Pan et al. [2009\)](#page-15-7). The complicated interactions, such as diferent forest harvest and burning regimes, may alter ecological processes. Typically, commercial forest coverage, such as that of pine plantations, increases in counties with a relatively weak economy (Chen [2010](#page-14-13), [2019](#page-14-14)).

Further research on the general and quantitative patterns of forestland patches, areas, and owner numbers across counties in Alabama is needed. The hypothesis is that a general scaling relationship may exist and can quantitatively describe the complicated forestland and owners across counties. This type of synthetic analysis would help to uncover the primary social and economic relationships driving forestland distribution in the State of Alabama. Thus, the specifc objectives of this study were to fnd (1) whether there are general and quantitative patterns in forestland patches, areas, and landowner numbers in Alabama counties; and (2) whether there are some main social and economic factors related to the general patterns of forest land. Understanding the general patterns and possible mechanisms may provide better information for managing forest landscape and developing new policies in Alabama or all of the southern region of the USA.

#### **Research Method**

Forestland information, including sites, areas, and landowners (e.g., name and address), was obtained from Alabama GIS [\(www.alabamagis.com\)](http://www.alabamagis.com), that was based on Plat maps showing the divisions of a piece of land and of the landowners. The Plat maps were developed by the United States General Land Office [\(www.en.wikip](http://www.en.wikipedia.org/wiki/Plat) [edia.org/wiki/Plat](http://www.en.wikipedia.org/wiki/Plat)). Due to limited forest information from the other ffty counties, 17 counties were included in this study (Table [1\)](#page-3-0). The forestlands were all privately owned and the ownership included individuals and companies. The details from the GIS of each county include patch numbers of forest land (or called as patch quantity), location, the area of each forestland patch, owner information, land value, and price. Land patch number, area, and landowner number represent three diferent characteristics of the forest landscape. Social and economic data, such as population and income, were obtained from census data.



<span id="page-3-0"></span>**Table 1** Background forestland information for 17 counties

The frequency distribution of patches was used to characterize the number of specifc groups and general distribution trend of land patches along with varied patch sizes in each county. Numbers of forestland patches in 50-acre size classes, including up to 50 acres, over 50–100 acres, and so on up to over 650 acres, and the total areas of forestland in these categories of patch size, as well as the number of landowners, were counted using GIS of forest coverage in each county. Repeated owners were only counted once in the numbers of landowners in each category. Accumulated percentages of various patch number (pieces), area (acres), and landowner number (individuals) were calculated based on the rates in the various classes. This accumulated percentage shows the general distribution of varying land patches, areas, and owner number in the overall patterns. The critical land scale (in acres) is defned as the spatial scale, which can reach 90% in the accumulated percentages in patch quantity, total area, or landowner numbers. This concept can be used to describe whether the forestland in a county is close to a critical condition. A low value in critical scale means a low threshold to reach 90% of patch numbers, total areas and owner numbers.

The ecological scaling relationship, which means the relationship that can be extrapolated to other scales (e.g., spatial), is often described by power functions. A power function in statistics is a functional relationship between two variables  $(y = ax^b)$ , where *x* is an independent and *y* a dependent variable), for which a relative change in variable *x* results in a proportional change in variable *y*, independent of the initial size of those variables (Bar-Yam [2011](#page-14-15)). One attribute of this scaling relationship is the scale invariance, which means the results from a small scale can

be extrapolated to a larger extent. Thus, they are also called power laws. Comparing the scaling relationships (exponents) in forestland across spatial scales among diferent counties could indicate new information, such as the regime of integrated interactions in an area. This concept has been widely used in forest ecology (e.g., by Chen et al. [2017;](#page-14-16) Chen [2018\)](#page-14-17). A power function can be changed into a linear relationship if the two variables on logarithmic axes are presented in a plot, such as  $log(y) = b*log(x) + log(a)$ . Plotting two variables against each other in this way is how generally to determine if there is a power scaling relationship. Correlation analysis for power exponents in patch number, area, and owner number and their relationships between each other and the socioeconomic conditions across counties was conducted by using the least-squares regression from SAS software. The statistical test was found significant at  $p < 0.05$ .

#### **Results**

Power scaling relationships exist in the forestland patch quantity, areas, and also landowner numbers across diferent patch size classes with similar exponents (Table [2\)](#page-5-0), with Autauga County serving as a typical example (Fig. [1\)](#page-6-0). Most of the exponents concentrate around  $-1.6$  to  $-3.2$ ,  $-0.8$  to  $-1.9$ , and  $-2.0$  to  $-3.2$  for patch numbers, total area, and owner numbers, respectively. The similar values may indicate similar regime for the forestland distribution in these counties, while the negative values mean smaller numbers in patches, patch areas, and landowners with the increase of patch size. However, the relationships regarding the total areas at Bibb, Perry, Pike, Russell, and Sumter counties are not statistically signifcant. Generally, as the patch size of forestland increases for a county, there are fewer patches, lower total areas, and fewer landowners. Overall, forestlands no larger than 50 acres cover about 59% of patch quantity, 21% of the total area, and 77% of landowner numbers (Fig. [2\)](#page-7-0). Forestlands larger than 500 acres have low levels for patch quantity, total area, and landowner numbers across counties (Fig. [3](#page-7-1)). These large forestlands (larger than 500 acres) cover about 25% of the total forestland in Bibb County and 20% in Russell County, but no forestlands larger than 500 acres are found in Perry and Pike counties.

By using accumulated percentage, the relationships between diferent scales of forestland and the proportion of forestland patch quantity, areas, and owner numbers are found to follow an "S" shape, such as those for Autauga County (Fig. [4\)](#page-8-0). Both power and quadratic functions are observed in each county (Table [3\)](#page-9-0). The power exponents are concentrated around 0.1–0.28 for the percentages of patches, 0.3–0.8 for the percentages of total areas, and 0.02–0.08 for the percentages of landowner numbers. The critical scale to cover 90% of forest patch quantity, total areas, or landowner numbers varies with the study items and counties (Fig. [5\)](#page-10-0). The critical scale for the percentage of total area, patch numbers, and owner numbers is about 500 acres, 200 acres, and 100 acres, respectively.

There are signifcant correlations among the power exponents in forest patches, areas, and owner numbers (Fig. [6\)](#page-11-0). The changes in forest patches, areas, and owner numbers have diferent regimes (diferent power exponents) in diferent counties.

| County    | Patch quantity             | Total area                 | Forest landowner number    |
|-----------|----------------------------|----------------------------|----------------------------|
| Autauga   | $-2.5793$                  | $-1.2856$                  | $-3.175$                   |
|           | $R^2$ = 0.9429, $p$ < 0.01 | $R^2$ =0.7757, $p < 0.05$  | $R^2$ = 0.9715, $p < 0.01$ |
| Bibb      | $-1.8876$                  | $-0.6533$                  | $-2.9547$                  |
|           | $R^2$ = 0.8706, $p < 0.01$ | $R^2$ = 0.4505, $p > 0.05$ | $R^2$ = 0.8935, $p$ < 0.01 |
| Chambers  | $-2.2955$                  | $-1.0692$                  | $-3.1818$                  |
|           | $R^2 = 0.9383, p < 0.01$   | $R^2 = 0.7278, p < 0.05$   | $R^2$ =0.9561, $p$ < 0.01  |
| Cleburne  | $-2.4066$                  | $-1.189$                   | $-3.5212$                  |
|           | $R^2$ = 0.9679, $p$ < 0.01 | $R^2$ =0.8366, $p$ <0.05   | $R^2$ = 0.98, $p$ < 0.01   |
| Coosa     | $-2.4709$                  | $-1.1779$                  | $-2.6021$                  |
|           | $R^2$ = 0.9582, $p$ < 0.01 | $R^2$ = 0.8173, p < 0.05   | $R^2$ = 0.9609, $p$ < 0.01 |
| Covington | $-2.5332$                  | $-1.3666$                  | $-3.242$                   |
|           | $R^2$ =0.9099, $p$ < 0.01  | $R^2$ =0.7636, $p$ < 0.05  | $R^2$ = 0.9414, $p < 0.01$ |
| Crenshaw  | $-3.1288$                  | $-1.9329$                  | $-3.7966$                  |
|           | $R^2$ = 0.9277, $p < 0.01$ | $R^2$ =0.8074, $p < 0.05$  | $R^2$ = 0.9718, $p$ < 0.01 |
| Fayette   | $-3.1596$                  | $-1.8716$                  | $-4.1204$                  |
|           | $R^2$ =0.9632, $p$ < 0.01  | $R^2$ = 0.8754, $p$ < 0.05 | $R^2$ = 0.9931, $p$ < 0.01 |
| Geneva    | $-2.5199$                  | $-1.3373$                  | $-3.6563$                  |
|           | $R^2$ =0.9033, $p$ < 0.01  | $R^2$ =0.7127, $p < 0.05$  | $R^2$ = 0.9552, $p$ < 0.01 |
| Lamar     | $-2.979$                   | $-1.7503$                  | $-3.8866$                  |
|           | $R^2$ =0.9678, $p$ < 0.01  | $R^2$ = 0.8825, $p$ < 0.01 | $R^2$ = 0.9863, $p$ < 0.01 |
| Lowndes   | $-1.7838$                  | $-0.5667$                  | $-2.7797$                  |
|           | $R^2$ =0.9571, $p$ < 0.01  | $R^2$ =0.6117, p <0.05     | $R^2$ = 0.9329, $p$ < 0.01 |
| Marengo   | $-2.0452$                  | $-0.8487$                  | $-3.2107$                  |
|           | $R^2$ =0.9586, $p < 0.01$  | $R^2$ =0.7594, $p < 0.05$  | $R^2$ = 0.9829, $p$ < 0.01 |
| Perry     | $-3.44$                    | $-0.4141$                  | $-1.3114$                  |
|           | $R^2$ =0.7689, $p$ < 0.05  | $R^2$ =0.0563, $p > 0.05$  | $R^2$ = 0.4801, $p > 0.05$ |
| Pike      | $-1.6439$                  | $-0.3524$                  | $-1.9803$                  |
|           | $R^2$ =0.7667, $p$ < 0.05  | $R^2$ = 0.1878, $p > 0.05$ | $R^2$ = 0.8464, $p < 0.05$ |
| Russell   | $-1.6996$                  | $-0.4199$                  | $-2.3049$                  |
|           | $R^2$ = 0.8589, $p$ < 0.05 | $R^2$ = 0.2414, $p > 0.05$ | $R^2$ = 0.9499, $p$ < 0.01 |
| Sumter    | $-1.6661$                  | $-0.437$                   | $-3.0293$                  |
|           | $R^2$ =0.943, $p$ < 0.01   | $R^2$ = 0.4858, $p > 0.05$ | $R^2$ = 0.9792, $p$ < 0.01 |
| Wilcox    | $-1.8441$                  | $-0.6631$                  | $-3.2745$                  |
|           | $R^2$ =0.9677, $p < 0.01$  | $R^2$ =0.7461, $p$ < 0.05  | $R^2$ = 0.9675, $p$ < 0.01 |

<span id="page-5-0"></span>**Table 2** Power exponents in forestland patch quantity (pieces), total area (acres) and forest landowner number (individuals) in selected Alabama counties

However, these regimes are also correlated with each other. This result may indicate the intrinsic quantitative relationships between forestland patches, areas, and owners across diferent counties. It is possible to use one variable to estimate the other two based on the scaling relationships. A signifcant correlation also exists between forestland prices and the power exponents in forest patch numbers, total areas, and numbers of landowners across these counties if Perry County is excluded (Fig. [7](#page-12-0)). This result means the land price is signifcantly related to the forest landscape (patches and areas) and number of landowners. The higher the land price, the lower the power exponents for patch quantity, areas, and landowner numbers.

<span id="page-6-0"></span>

### **Discussion**

Forest landscape management emphasizes the integrity of ecological processes between forest patches and landowners (Chen and Fraser [2009;](#page-14-6) Chen [2017](#page-14-18)). Despite different forest landscape patterns, there is a general tradeoff among forest landscape, landowners, and socioeconomics in Alabama counties. This emergent trend is shown by the similar power exponents in forest patch numbers, areas, and owner numbers across diferent counties. If the information of historical forestlands is available, the time of change could be detected (Chen et al. [2010](#page-14-19)). This result is consistent with Pan et al. [\(2009](#page-15-7)). The deviations in exponents may indicate diferent regimes. In these Alabama counties, there are many small forestland patches and many landowners, such that forest areas of up to 50 acres account for approximately 59% of forest land patches and include 77% of landowners. Forestlands no less than



<span id="page-7-0"></span>**Fig. 2** Percentages of the forestland no more than 50 acres in forestland patch quantity (pieces), total forestland area (acres) and forest landowner number (individuals) in each county



<span id="page-7-1"></span>**Fig. 3** Percentages of the forestland no less than 500 acres in forestland patch quantity (pieces), total forestland area (acres) and forest landowner number (individuals) in each county

500 acres are scarce in the counties of Alabama. The quantitative approach applied in this study is based on this complex condition.

Various factors are responsible for the fragmented patterns in forestland in this region. Economic factors (e.g., income and tax) are considered important (Butler et al. [2012\)](#page-14-7). As all forestlands are taxable, when property taxes increase, if the cost of holding a large piece of land (e.g., annual taxes) becomes more than the benefts from the forest, then landowners may likely sell part or the entirety of their forest-land (Pan et al. [2009\)](#page-15-7). Landowners have to be sufficiently wealthy to purchase or



<span id="page-8-0"></span>**Fig. 4** Quadratic relationships and power functions between diferent patch sizes and the accumulated percentage in forestland patch quantity, areas, and landowner numbers in Autauga County

maintain a large piece of forest land. However, the wealth distribution among people usually follows a power function (Levy and Solomon [1997\)](#page-14-20), which show that a small number of people own most of the wealth while most people are poor. This fact may be the cause for various scaling relationships in forestland patch numbers, areas, and landowner numbers. It is self-organization in the socioeconomic system (e.g., county). Global forests also follow power scaling in patch quantity, such as the most pieces of land in small sizes and only a small number with large pieces and the mean power exponent is 1.967 (Saravia et al. [2018\)](#page-15-8), which is quite diferent from that observed in Alabama counties.

Historical factors also play a role in the forestlands in Alabama. Because of poor fnancial performance for the forest products industry, companies selling traditional vertically integrated forest products (e.g., a supply chain) had to sell over 18.3 million acres of forestlands in the early 2000s. This strategic change and timberland transactions also afected the forestland distribution in the southern region (Clutter et al. [2005](#page-14-21)). In addition, population growth, an increase in number of older people

| County    | Percentage of patch quantity            |                          | Percentage of the total area            |                          | Percentage of forest land-<br>owner number |                          |
|-----------|---|--------------------------|---|--------------------------|--|--------------------------|
|           | Quadratic                               | Power                    | Quadratic                               | Power                    | Quadratic                                  | Power                    |
| Autauga   | $-0.0001,$<br>0.1454<br>$R^2 = 0.8688$  | 0.1441<br>$R^2 = 0.8304$ | $-0.0003,$<br>0.3074<br>$R^2 = 0.9827$  | 0.5633<br>$R^2 = 0.9214$ | $-0.0001,$<br>0.0995<br>$R^2 = 0.7050$     | 0.0841<br>$R^2 = 0.6775$ |
| Bibb      | $-0.0001, 0.127$<br>$R^2 = 0.8708$      | 0.1499<br>$R^2 = 0.8853$ | $-5E-05$ ,<br>0.1501<br>$R^2$ = 0.9625  | 0.6037<br>$R^2 = 0.9759$ | $-6E-05,$<br>0.0568<br>$R^2 = 0.6748$      | 0.0468<br>$R^2 = 0.6650$ |
| Chambers  | $-0.0002,$<br>0.2202<br>$R^2 = 0.8795$  | 0.2256<br>$R^2 = 0.8199$ | $-0.0003$ ,<br>0.3461<br>$R^2 = 0.978$  | 0.6647<br>$R^2 = 0.9065$ | $-0.0002$ ,<br>0.1456<br>$R^2 = 0.7785$    | 0.1207<br>$R^2 = 0.7208$ |
| Cleburne  | $-0.0001, 0.135$<br>$R^2 = 0.8699$      | 0.147<br>$R^2 = 0.8613$  | $-0.0001,$<br>0.2112<br>$R^2 = 0.9718$  | 0.5728<br>$R^2$ = 0.9665 | $-6E-05,$<br>0.059<br>$R^2 = 0.6737$       | 0.0469<br>$R^2 = 0.6472$ |
| Coosa     | $-0.0001,$<br>0.1047<br>$R^2 = 0.888$   | 0.101<br>$R^2 = 0.8669$  | $-0.0002,$<br>0.2714<br>$R^2 = 0.9867$  | 0.5037<br>$R^2 = 0.9561$ | $-7E-05,$<br>0.0702<br>$R^2 = 0.8047$      | 0.0594<br>$R^2 = 0.7743$ |
| Covington | $-0.0001,$<br>0.1226<br>$R^2 = 0.7854$  | 0.1182<br>$R^2 = 0.7661$ | $-0.0002,$<br>0.2272<br>$R^2 = 0.9305$  | 0.4194<br>$R^2 = 0.9065$ | $-9E-05,$<br>0.0862<br>$R^2 = 0.7127$      | 0.0723<br>$R^2 = 0.6824$ |
| Crenshaw  | $-0.0001$ ,<br>0.1344<br>$R^2 = 0.7784$ | 0.135<br>$R^2 = 0.7373$  | $-0.0002$ ,<br>0.2737<br>$R^2 = 0.9373$ | 0.4327<br>$R^2 = 0.8545$ | $-0.0002$ ,<br>0.1416<br>$R^2 = 0.8268$    | 0.0528<br>$R^2 = 0.6245$ |
| Fayette   | $-0.0001$ ,<br>0.0986<br>$R^2 = 0.7979$ | 0.081<br>$R^2 = 0.7654$  | $-0.0003$ ,<br>0.2723<br>$R^2 = 0.9438$ | 0.3537<br>$R^2 = 0.8883$ | $-0.0002$ ,<br>0.1047<br>$R^2 = 0.871$     | 0.0279<br>$R^2 = 0.6333$ |
| Geneva    | $-0.0002,$<br>0.2189<br>$R^2 = 0.8173$  | 0.2149<br>$R^2 = 0.7517$ | $-0.0003,$<br>0.3264<br>$R^2 = 0.9405$  | 0.5508<br>$R^2 = 0.8561$ | $-0.0005,$<br>0.2657<br>$R^2 = 0.8531$     | 0.0973<br>$R^2 = 0.6395$ |
| Lamar     | $-0.0001,$<br>0.1366<br>$R^2 = 0.8026$  | 0.1269<br>$R^2 = 0.7583$ | $-0.0003,$<br>0.2936<br>$R^2 = 0.943$   | 0.4358<br>$R^2 = 0.8664$ | $-0.0002$ ,<br>0.1268<br>$R^2 = 0.8349$    | 0.0402<br>$R^2 = 0.6203$ |
| Lowndes   | $-0.0002$ ,<br>0.2367<br>$R^2 = 0.9598$ | 0.2901<br>$R^2 = 0.9237$ | $-0.0002, 0.3$<br>$R^2 = 0.9982$        | 0.8718<br>$R^2 = 0.9711$ | $-0.0002, 0.176$<br>$R^2 = 0.8803$         | 0.1188<br>$R^2 = 0.7852$ |
| Marengo   | $-0.0002,$<br>0.1797<br>$R^2 = 0.9127$  | 0.2068<br>$R^2 = 0.8824$ | $-0.0002, 0.264$<br>$R^2 = 0.9924$      | 0.671<br>$R^2 = 0.966$   | $-0.0001$ ,<br>0.1061<br>$R^2 = 0.7409$    | 0.0807<br>$R^2 = 0.6854$ |
| Perry     | $-0.0019,$<br>0.8547<br>$R^2 = 0.9799$  | 0.5581<br>$R^2 = 0.947$  | $-0.0013,$<br>0.8327<br>$R^2$ = 0.9689  | 1.2078<br>$R^2 = 0.9681$ | $-0.0019,$<br>0.8309<br>$R^2 = 0.9664$     | 0.4413<br>$R^2 = 0.9187$ |
| Pike      | $-0.0001$ ,<br>0.0898<br>$R^2 = 0.9413$ | 0.0667<br>$R^2 = 0.9559$ | $-3E-05$ ,<br>0.1397<br>$R^2 = 0.9058$  | 0.319<br>$R^2 = 0.9327$  | $-0.0001,$<br>0.0738<br>$R^2 = 0.8698$     | 0.0481<br>$R^2 = 0.8736$ |
| Russell   | $-0.0002,$<br>0.1864<br>$R^2 = 0.9572$  | 0.2571<br>$R^2 = 0.9463$ | $-0.0001,$<br>0.2177<br>$R^2 = 0.9949$  | 0.9423<br>$R^2 = 0.9833$ | $-0.0001,$<br>0.1365<br>$R^2 = 0.8863$     | 0.1359<br>$R^2 = 0.8565$ |

<span id="page-9-0"></span>**Table 3** Parameters of quadratic relationships and power exponents between diferent forestland sizes (acres) and the accumulated percentage of patch quantity (pieces), total area (acres) and forest landowner number (individuals) in Alabama counties (all  $p < 0.05$ )



#### **Table 3** (continued)

<span id="page-10-0"></span>**Fig. 5** Critical scale (acres) to include 90% of the forestland patch quantity (pieces), total areas (acres), and landowner number (individuals) in Alabama counties

County

who moved from northern States to warmer rural regions in Alabama and purchased higher numbers of small households, makes a contribution to this pattern. This is called parcelization, which happens when a large forest tract held in single ownership is divided into smaller parcels with many owners (Alig [1986](#page-14-22); Pan et al. [2009\)](#page-15-7). Older people may also make the legacy efect, which means they split up their lands between children (Butler et al. [2012](#page-14-7)). A high percentage of small parcel lands can easily cause forest fragmentation owing to land-use change. Li et al. [\(2009](#page-14-12)) confrmed the high vegetation changes in private lands through satellite images.

A critical concept in this study is the forestland patch, which characterizes the spatial condition of forestlands (i.e., disconnection or fragmentation). Smaller patches of isolated forestland have been considered to be one of the greatest threats to biodiversity conservation (Rosenberg and Raphael [1986](#page-15-9)). A study by Wintle et al. [\(2019](#page-15-10)) indicates that these small and isolated patches are extraordinarily important for biodiversity conservation. In order to decrease parcelization and fragmentation in forestland, larger and intact forestlands should be conserved with their surrounding areas. Fragmented forestlands need to be functionally restored through cooperative



<span id="page-11-0"></span>**Fig. 6** Correlations among the power exponents in forest patches, areas, and landowner numbers in Alabama counties

stewardship mechanisms at a landscape level (Best [2002](#page-14-5)). Some landscape metrics, such as mean patch size, may provide an indicator of parcelization and fragmentation at local scales (Kilgore et al.  $2013$ ). The method used in this study (e.g., scaling relationship) may help to statistically monitor the parcelization and fragmentation for a large area (e.g., a county).

Using the accumulated percentage can fnd the relationships between scales of forestland patch quantity, areas, and owner number. All these relationships follow a similar trend of "S" shape, in which the accumulated percentage is saturated at a specifc scale. Here, the spatial scale, which can include 90% in land patch quantity, areas, or landowner numbers, is used as a critical scale. These critical scales may be helpful for native forest landscape management and conservation in the counties of Alabama. Generally, both quadratic and power functions can also ft all these relationships across the counties. However, a quadratic relationship needs two parameters, while a power scaling only needs one. These similar quadratic relationships may also show a similar regime in the processes of forestland distribution and conversion in Alabama counties. Power exponents can easily indicate the regime, which may be linked to the socioeconomic mechanisms. Poudyal et al. [\(2014](#page-15-11)) suggested that landowners' decisions to convert forests to other land-covers are infuenced mainly by sociodemographic factors (e.g., enrolling in cost assistance programs), ownership motivation, and expected fnancial returns from forestry and alternative land use.

Power exponents usually show the system underlying self-organizing processes (Marquet et al.  $2005$ ; Chen et al.  $2017$ ). There are significant correlations among

 $220$ 

2200

 $2200$ 

<span id="page-12-0"></span>

the power exponents in forest patch numbers, total areas, and owner numbers. These exponents may refect similar or correlated regimes in forest land distribution across these Alabama counties. Still, they are quite diferent from that of the global forests (Saravia et al.  $2018$ ), which may be due to the different spatial scales and local socioeconomic settings. In this study, these power exponents are not signifcantly correlated with population, per capita income, mean household income, or household numbers across the counties. However, unit land price shows a signifcant correlation with these power exponents. This relationship means the unit land price is correlated with the distribution of forest patch numbers, total areas, and landowner numbers. The mechanism may be understood as follows: when forest land prices are low, more people can purchase land in various pieces. Conversely, when forestland price is high, only a few people or

companies can buy small numbers of large tracts. This result is consistent with the explanation from economic factors (Butler et al. [2012](#page-14-7)).

Variations in rural land value in Alabama are related to location (near cities of more than 25,000 population), distance to a public transportation facility, land physical properties (soil type, topographic feature, and water availability), and tract size (Spurlock and Adrian [1978](#page-15-12)). Urbanization and land development can increase the local land price and thus afect local forestland distribution and biodiversity conservation (Hansen et al. [2005](#page-14-25); Mondal et al. [2013\)](#page-15-13). Income inequality, land, and wealth are considered to promote agricultural expansion or defor-estation in Latin America (Ceddia [2019](#page-14-26)). Although other factors (mortality rates, population density, income, and urbanization) may also contribute to forestland change (Pan et al. [2009;](#page-15-7) Zhang et al. [2009](#page-15-14)), maintaining suitable or similar forestland prices through policy intervention may be necessary for keeping forestland presence at the county level.

#### **Conclusions and Policy Implications**

Forest lands in Alabama are a complex mosaic with a high number of small land patches and landowners. This pattern is an obstacle to broad-scale landscape planning that some landowners may not change land use in order to achieve regional ecological services (e.g., carbon storage, wildlife habitat, and high water quality) and environmental conservation. Developing a complete understanding of the complicated relationships between forest land area, patch quantity, and landowner numbers will be invaluable for making decisions about forest land use and policy for the future. The existing power scaling relationships in the forestland patch quantity, areas, and landowner numbers in some counties of Alabama could be linked to similar social and economic institutions at the local level. The correlation between forestland prices and the power exponents of forest patch numbers, total areas, and landowner numbers might provide new ideas for changing forestland distribution and implementing environmental conservation via economic approaches, such as enhancing the role of forestland prices or taxes on forestry development including forest ecological values. This research may provide a case study for exploring empirical relationships between forest landscape patterns and combined socioeconomic forces. These results illustrate the importance of understanding the integrated efects of socioeconomic forces manifested in the landscape patterns. The limitation of the method used here is that it needs a number of land patches and landowners in most categories. Some counties (e.g., Perry and Pike counties) with limited forestland patches and owners, then, it is not necessary to use this approach.

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#### **References**

- <span id="page-14-22"></span>Alig RJ (1986) Econometric analysis of the factors infuencing forest acreage trends in the Southeast. For Sci 32:119–134
- <span id="page-14-10"></span>Alig RJ, Lee KJ, Moulton RJ (1990) Likelihood of timber management on nonindustrial private forests: evidence from research studies. General Technical Report SE-60, USDA Forest Service, Southeastern Forest Experiment Station, Asheville, NC
- <span id="page-14-15"></span>Bar-Yam Y (2011) Concepts: power law. New England Complex Systems Institute. [https://necsi.edu/](https://necsi.edu/power-law) [power-law.](https://necsi.edu/power-law) Accessed 5 July 2020
- <span id="page-14-5"></span>Best C (2002) America's private forests challenges for conservation. J For 100:14–17
- <span id="page-14-7"></span>Butler BJ, Catanzaro PF, Greene JL, Hewes JH, Kilgore MA, Kittredge DB, Ma Z, Tyrrell ML (2012) Taxing family forest owners: implications of federal and state policies in the United States. J For 110:371–380
- <span id="page-14-3"></span>Butsic V, Syphard AD, Keeley JE, Bar-Massada A (2017) Can private land conservation reduce wildfre risk to homes? A case study in San Diego County, California, USA. Landsc Urban Plan 157:161–169
- <span id="page-14-26"></span>Ceddia MG (2019) The impact of income, land, and wealth inequality on agricultural expansion in Latin America. Proc Natl Acad Sci USA 116:2527–2532
- <span id="page-14-2"></span>Chen X (2007) Spatial pattern of wildfre occurrences in Alabama, USA. Int J Environ Stud 64:229–242
- <span id="page-14-13"></span>Chen X (2010) Trends of forest inventory data in Alabama, USA during the last seven decades. Forestry 83:517–526
- <span id="page-14-1"></span>Chen X (2016) A case study of using remote sensing data to compare biophysical properties of a forest and an urban area in northern Alabama, USA. J Sustain For 35:261–279
- <span id="page-14-18"></span>Chen X (2017) Will more tree diversity bring back more income from timber? A case study from Alabama of USA. For Lett 110:20–25
- <span id="page-14-17"></span>Chen X (2018) Diverse scaling relationships of tree height and diameter in fve tree species. Plant Ecol Divers 11:147–155
- <span id="page-14-14"></span>Chen X (2019) Dynamics of forest composition and growth in Alabama of USA under human activities and climate fuctuation. J Sustain For 38:54–67
- <span id="page-14-6"></span>Chen X, Fraser R (2009) Quantifying impacts of land ownership on regional forest NDVI dynamics: a case study at Bankhead National Forest of Alabama, USA. Photogr Eng Remote Sens 75:997–1003
- <span id="page-14-19"></span>Chen X, Li B-L, Allen FM (2010) Characterizing urbanization, conservation and agricultural land use change in Riverside County, California, USA. Ann N Y Acad Sci 1195:E164–E176
- <span id="page-14-16"></span>Chen X, Guo Q, Brockway DG (2017) Power laws in cone production of longleaf pine across its native range in the United States. Sust Agric Res 4:64–73
- <span id="page-14-21"></span>Clutter M, Mendell B, Newman D, Wear D, Greis J (2005) Strategic factors driving timberland ownership changes in the U.S. South. Warnell School of Forest Resource, University of Georgia, Athen, GA
- <span id="page-14-9"></span>Fraser RF, Gyawali BR, Schelhas J (2005) Blacks in space: land tenure and well-being in Perry County, Alabama. Small Scale For Econ Manag Policy 4:21–33
- <span id="page-14-8"></span>Gan J, Kolison SH Jr, Tackie NO (2003) African-American forestland owners in Alabama's Black Belt. J For 4(5):38–43
- <span id="page-14-25"></span>Hansen AJ, Knight RL, Marzluff JM, Powell S, Brown K, Gude PHKJ (2005) Effects of exurban development on biodiversity: patterns, mechanisms, and research needs. Ecol Appl 15:1893–1905
- <span id="page-14-23"></span>Kilgore MA, Snyder SA, Block-Torgerson K, Taff SJ (2013) Challenges in characterizing a parcelized forest landscape: why metric, scale, threshold, and defnitions matter. Landsc Urban Plan 110:36–47
- <span id="page-14-4"></span>LaPierre S, Germain RH (2005) Forestland parcelization in the New York City watershed. J For 103:139–145
- <span id="page-14-20"></span>Levy M, Solomon S (1997) New evidence for the power-law distribution of wealth. Physica A 242:90–94
- <span id="page-14-12"></span>Li M, Huang C, Zhu Z, Shi H, Lu H, Peng S (2009) Assessing rates of forest change and fragmentation in Alabama, USA, using the vegetation change tracker model. For Ecol Manag 257:1480–1488
- <span id="page-14-24"></span>Marquet PA, Quiñones RA, Abades S, Labra F, Tognelli M, Arim M, Rivadeneira M (2005) Scaling and power-laws in ecological systems. J Exp Biol 208:1749–1769
- <span id="page-14-11"></span>Mcnabb K, Bliss JC (1994) Nonindustrial private forest owner attitude toward the use of silvicultural herbicides. J Natl Res Life Sci Edu 23:46–50
- <span id="page-14-0"></span>Millennium Ecosystem Assessment (2005) Ecosystem and human well-being, vol 2. Island, Washington,  $DC$
- <span id="page-15-13"></span>Mondal P, Butler BJ, Kittredge DB, Moser WK (2013) How are America's private forests changing? An integrated assessment of forest management, housing pressure, and urban development in alternate emissions scenarios. Land Use Policy 32:230–238
- <span id="page-15-5"></span>Pan Y, Zhang Y, Butler BJ (2007) Trends among family forest owners in Alabama, 1994–2004. South J Appl For 31:117–123
- <span id="page-15-7"></span>Pan Y, Zhang Y, Majumdar I (2009) Population, economic welfare and holding size distribution of private forestland in Alabama, USA. Silva Fenn 43:161–171
- <span id="page-15-4"></span>Phillips D (2006) Discovering Alabama forests. The University of Alabama Press, Tuscaloosa
- <span id="page-15-11"></span>Poudyal NC, Joshi O, Hodges DG, Hoyt K (2014) Factors related with nonindustrial private forest landowners' forest conversion decision in Cumberland Plateau, Tennessee. For Sci 60:988–993
- <span id="page-15-3"></span>Poudyal NC, Butler BJ, Hodges DG (2019) Spatial analysis of family forest land ownership in the southern United States. Landsc Urban Plan 188:163–170
- <span id="page-15-9"></span>Rosenberg KV, Raphael MG (1986) Efects of forest fragmentation on vertebrates in Douglas-fr forests. In: Verner J, Marrison ML, Ralph CJ (eds) Wildlife 2000: modeling habitat relationships of terrestrial vertebrates. University of Wisconsin Press, Madison, pp 263–272
- <span id="page-15-8"></span>Saravia LA, Doyle SR, Bond-Lamberty B (2018) Power-laws and critical fragmentation in global forests. Sci Rep 8:17766
- <span id="page-15-12"></span>Spurlock SP, Adrian JL (1978) Variations in rural land values in the wiregrass region of Alabama. Bulletin 504, Agricultural Experiment Station/Auburn University, Auburn, AL
- <span id="page-15-2"></span>Stanfeld BJ, Bliss JC, Spies TA (2002) Land ownership and landscape structure: a spatial analysis of sixty-six Oregon (USA) Coast Range watersheds. Landsc Ecol 17:685–697
- <span id="page-15-0"></span>Sutherland IJ, Bennett EM, Gergel SE (2016) Recovery trends for multiple ecosystem services reveal non-linear responses and long-term tradeofs from temperate forest harvesting. For Ecol Manag 374:61–70
- <span id="page-15-1"></span>Wear DN, Turner MG, Flamm RO (1996) Ecosystem management with multiple owners: landscape dynamics in a southern Appalachian watershed. Ecol Appl 6:1173–1188
- <span id="page-15-10"></span>Wintle BA, Kujala H, Whitehead A, Cameron A, Veloz S, Kukkala A, Moilanen A, Gordon A, Lentini PE, Cadenhead NCR, Bekessy SA (2019) Global synthesis of conservation studies reveal the importance of small habitat patches for biodiversity. Proc Natl Acad Sci USA 116:909–914
- <span id="page-15-6"></span>Zhang D, Warren S, Bailey C (1998) The role of assistance foresters in nonindustrial private forest management: Alabama landowners' perspectives. South J Appl For 22:101–105
- <span id="page-15-14"></span>Zhang Y, Liao X, Butler BJ, Schelhas J (2009) The increasing importance of small scale forestry: evidence from family forest ownership patterns in the United States. Small-Scale For 8:1–14

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