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# Inverse Box-Counting Method: A Fractal-Based Procedure to Create Biospheric Landscape Patterns

CYRIL FLEURANT\*, JON BURLEY+ LUIS LOURES\*+ WADE LEHMANN+  
& JESSICA MCHUGH+

\*Unité de Recherche Paysage; Institut National d'Horticulture et du Paysage  
2 rue le Nôtre, 49045 Angers cedex 01, FRANCE

+ Landscape Architecture Program; School of Planning, Design, and Construction,  
Michigan State University, 48824-1221 East Lansing, U.S.A.

\*+ Department of Landscape Architecture; Faculty of Natural Resources,  
University of Algarve, 8005-139 Faro, PORTUGAL

e-mail: c.fleurant@wanadoo.fr; burleyj@msu.edu; lcloures@ualg.pt;  
lehmann9@msu.edu; mchughje@msu.edu

*Abstract:* Planners and designers are interested in replicating biospheric landscape patterns to reclaim surface mines to match existing natural landscape patterns. One approach that shows promise is the use of fractal geometry to generate biospheric landscape patterns. While the measurement of the actual fractal dimension of a landscape can be difficult, a box-counting method was developed at INHP, Angers, France which approximates the spatial patterns of biospheric landscapes. Essentially the procedure entails covering a natural object/pattern with a regular grid of size  $r$  and then one simply counts the number of grid boxes,  $N(r)$ , that contain some part of the object. The boxes are subdivided and the value of  $r$  is progressively reduced and  $N(r)$  is similarly re-measured until some of the boxes become empty (containing no landscape objects of interest). Then the fractal dimension of the object is approximated to be the  $\log(N(r))/\log(1/r)$ . We illustrate this procedure by measuring and replicating a stand of trees in the Upper Peninsula of Michigan. Our study revealed a fractal number of 1.017 ( $p \leq 0.01$ ), with a mean of 77.4 trees per 100 m by 100 m stand, and a standard deviation of 34.87 trees per stand.

*Key-words:* - landscape architecture, landscape planning, physical geography, landscape ecology, landscape science, plant ecology

## 1 Introduction

Planners, designers, and environmental specialists are interested in assessing the spatial composition of landscape features such as the distribution of hills, arrangement of vegetation, and shapes of water bodies to blend disturbed landscapes with natural landscapes. However natural looking compositions were difficult to mathematically replicate. Typical approaches employed to replicate landscapes included gestalt methods and ecological field laboratory methods. The gestalt method was heuristic in nature where an individual would artistically blend and integrate patterns together. The ecological field laboratory method employed the measures of frequency, density, and size to construct patterns. A different approach evolved that relied upon the concept of fractals to quantify spatial patterns in the landscape.

### 1.1 Origin of Fractals

Fractals were first noticed/observed at the end of the 19th century. Although the term "fractal" was only attributed later, the Peano curves seem to be the very

first examples of fractal objects, first described by Giuseppe Peano (1858 – 1932). These were curves that could, through a series of iterations and a few simple rules, fill a space [10]. Such mathematical objects have been considered as mere mathematical curiosities for a long time.

Fractals have been the heart of a new branch of mathematics only in the second half of the 20th century, thanks to the work of the French mathematician Benoît Mandelbrot. While researching "econometry" (mathematics applied to economy), he discovered that there is no difference in the shape/pattern of the curves of predicting short-term and long-term prices. He presents a comprehensive description of the curves following this property and invented the word fractal (coming from the latin word *fractus*, meaning broken) to name the objects where irregularity distinguishes them from the Euclidian geometry curves. Since their discovery, the use and application of fractals have spread. They are now used in many sciences like geology, biology or econometrics.

## 1.2 Further Descriptions Illustrating Fractals

To illustrate the concept of fractals, imagine a tour along the French coastline of Brittany, a rugged rocky coastline. What is the actual length of this coastline? To determine the length of the coastline, one can look at two forms for resolution:

1. a series of pictures from 10 000 meters high and calculating the visible length of the coast.
2. a second series of pictures from 500 m high and observing details of the coastline one meter by one meter.

After calculating the length, one will discover the coast is more precisely known in the second case and the calculated length is actually longer. If one examines the coast at an even higher resolution, new details appear and the length of the coast will increase even more. The more precise the measuring instrument is, the more the length of the coast increases, because any one section of the coastline is equally as complex at any scale or resolution. The Brittany coastline example introduces a fundamental understanding of the fractal world. The complexity of the Brittany coast (being unable to be described with Euclidian geometry) makes it a fractal object.

A useful conceptual definition of a fractal is a "geometrical shape resulting from infinite regular fragmentation of a given form." It is indeed possible to describe a fractal as a repetition of the same operation on each part of the curve. An essential property results from this kind of internal homothetia: self-similarity. If one looks closely at a piece of the curve, it looks like the whole curve itself. The von Koch's snowflake illustrates this property. This von Koch's snowflake fractal, as most all the fractals, is easy to design even if the resulting shape is complex. The von Koch's snowflake has the geometric property where as the construction iteration process increases towards infinity, the total length  $L$  increases towards infinity. Therefore, the length of the curve is infinite. Here lies a paradox: the area of the von Koch's snowflake  $A$  is a finite measure (see equations 1 and 2).

$$L = \lim_{n \rightarrow \infty} 3 \times \left(\frac{4}{3}\right)^n = \infty$$

$$A = \lim_{n \rightarrow \infty} \left[ \sqrt{\frac{4}{3}} + 3 \times \sqrt{\frac{3}{20}} \times \left(1 - \left(\frac{4}{9}\right)^n\right) \right] = 2 \times \sqrt{\frac{3}{5}} \quad (1), (2)$$

In many respects there are little differences between the mathematics of fractals and descriptive statistics.

## 1.3 Geometric Properties of Fractals

Geometric properties of fractals are used in many models and numerous sciences. For example in economics, fractals are used in complex random phenomena, such as in finance to represent the variations of the prices on the trade market. In climatology, fractal models can also be applied to understand the turbulence of atmospheric movements. In geology, they can be used for modeling the earth relief or rock porosity. For computer sciences, fractals assist in finding the optimal arrangement of electronic components, to avoid crossings of circuit tracks. In chemistry, they are used to design new materials. The fractal nature of such materials gives them exceptional properties, such as a very high thermal cooling power.

## 1.4 Planning and Design Applications

There is a belief that fractals may have an application to recreate complex landscape patterns that are difficult to describe with typical Euclidian approaches because the landscape is full of fractals: rivers, trees, networks in general [1]. Fractals are highly detailed, complex geometric shapes and one measure of their complexity is fractal dimension [10].

Thus several authorities have examined fractals in landscape planning and design including studies by Diaz-Delgado, Lloret, and Pon; DiBari; Griffith, Martinko, and K.P. Price; Li; Milne; Palmer; Thomas, Grankhauser, and Biernacki; Van Noordwijk and Mulia [3, 4, 7, 8, 11, 12, 13, 15]. However, the use of fractals seems to be looking for a practical application. For example in describing landscapes, it has always been easy to calculate an existing pattern, but difficult to replicate the pattern. In this paper we present an approach to replicate the pattern and possibly a practical approach in the use of fractals.

## 2 Methodology

The approach in the methodology is related to the dimensions of fractals. Both Euclidian geometry and fractal geometry have dimension. In Euclidian geometry, the point (the elementary unit in geometry) is of Euclidian dimension 0. Lines or curves are of dimension 1. Areas are of dimension 2, such as a circle or rectangle. Volumes are of dimension 3, such as ball or cube. Euclidian dimensions are also call topological dimensions and are named in honor of Euclidian geometric objects such as a circle or a square. Fractal objects have dimensions too.

## 2.1 Fractal Dimensions

To illustrate fractal dimensions, consider the Brittany coastline. If one needs to measure 1 m length of a relatively straight line with a 20 cm ruler, this ruler will be used 5 times, 10 times for a 10 cm ruler, 20 times for a 5 cm ruler. Let's suppose now that the line one needs to measure is highly variable and curved. One will not be able to follow the coastline line precisely with the ruler and one will under-estimate the real length. But, the smaller the ruler is, the more accurate the result. To analyze this phenomenon in a mathematical way, one can say that the result tends towards the exact length of the line when the ruler is small when compared to the curvature of this line. If one can divide the length of a ruler of an infinite small size by "n," one has to use this ruler n times more (same as if the line were straight). This property can define the topological dimension of the curve or line as we have (Equation 3):

$$D_{topological} = \frac{\log(n)}{\log(n)} = 1 \quad (3)$$

Replicating the process again with a surface, one can use a square where the length of the side is L. To measure its area, one can use a smaller square where the length of the side is L/2, then you will need 4 of them, 16 with an L/4 square, and so on. So, if the length of the side of the measuring square is divided by "n," the number of such squares used is multiplied by "n" (Equation 4):

$$D_{topological} = \frac{\log(n^2)}{\log(n)} = 2 \times \frac{\log(n)}{\log(n)} = 2 \quad (4)$$

Similar results can be obtained for volumes and the topological dimension of a Euclidian geometric object with a fractal dimension of 3.

In the relatively simple case of self-similar fractal objects (meaning they seem the same whichever zooming factor is used), resulting in a constant iterative factor "k," the fractal dimension is (Equation 5):

$$D_{fractal} = \frac{\log(n)}{\log(k)} \quad (5)$$

n = is the number of the subsets counted during the scaling process using a factor 1/k (self-similarity factor).

k = is the number of iterations

The von Koch's snowflake illustrates how to calculate the fractal dimension of self-similar fractal objects. Call L the initial length of the triangle (the snowflake starts as a equilateral triangle). If one uses a ruler of length L and applies it on the

snowflake, one can only measure the initial triangle and find a length of 3L for the snowflake. If one uses a smaller ruler of size L/3, we can follow the snowflake more precisely and apply it 12 times. One can continue by dividing again the size of the ruler by 3 (the snowflake presents an infinite number of spikes, with smaller and smaller sizes), it will be applied 48 times, and so on. In other words, each time the size of the ruler is divided by 3, the number of times it is applied on the snowflake is multiplied by 4. This process can be carried on indefinitely. Then according to the same reasoning one can calculate the fractal dimension of the von Koch's snowflake (Equation 6)

$$D_{fractal} = \frac{\log(4)}{\log(3)} \approx 1.262 \quad (6)$$

Therefore, we can only conclude that the fractal dimension of this strange curve is not 1 as any of classic linear geometrical curves. The von Koch's snowflake has a topological dimension equal to 1 (it's a broken line), but a fractal dimension strictly greater than 1, and moreover, which is not an integer but a real number.

## 2.2 Inverse box-counting method: a tool for replicating landscapes

The fractal dimension is not easy to calculate but can be estimated by several methods. The box-counting method is one of the easier and more popular methods to implement: the natural object is covered with a regular grid of size r and one simply counts the number of grid boxes, N(r), that contain some part of the object. The value of "r" is progressively reduced and N(r) is similarly measured. As "r" tends to very small values (0 in a theoretical way) one finds that  $\log(N(r))/\log(1/r)$  tends to the fractal dimension of the object.

In our study, we illustrate the application of fractals in the planting pattern of trees in the Upper Peninsula of Michigan in Iron and Dickinson counties. The location of trees can be placed on a map (100 meters by 100 meters) derived from an aerial photograph and measured. This set of points (location of trees) can be viewed as a complex and fractal object in the landscape. The box-counting method is a simple way to characterize the complexity of this planting through the value of its fractal dimension. The greater the value of the fractal dimension (2 is the maximum value in a plane), the less the complexity of the planting pattern (in terms of scale, alignment, structure, etc.). This method was developed by Duchesne *et al.* [5] and computed by Durandet in the Landscape Department of the National Institute of Horticulture

and Landscape (Angers, France) [5, 6]. By using the inverse box-counting method one is able to control the randomness of a planting of trees or other natural landscape pattern with several parameters: the fractal dimension (D), the average minimum distance between two trees ( $\epsilon_{\min}$ ) and the average maximum size of the glades ( $\epsilon_{\max}$ ).

In the process, the pairs of values  $r$  and the number of boxes  $N(r)$ , start with a value of  $r$  being 100 meters, and  $N(r)$  being one. Then  $r$  is divided in half and  $r$  is 50 meters, while  $N(r)$  can range from one to four, depending upon how many boxes contain trees. The pairs for the regression analysis start with the first pair where at least one box is empty and end when only one tree is found in any box. We selected five 100 meter by 100 meter boxes in Iron County and five 100 meter by 100 meter boxes in Dickinson County [9, 14]. The slope of the regression equations represents the fractal number. The areas that we selected to measure were rocky and dry xeric northern forests, an environment similar to waste rock piles on a surface mine where a fractal planting plan for dry forests might be appropriate [2]. These forests are predominantly composed of about 16% red pine (*Pinus resinosa* Sol. Ex Aiton), 21% jack pine (*Pinus banksiana* Lamb.), 15% Eastern white pine (*Pinus strobus* L.), and 12% northern pin oak (*Quercus ellipsoidalis* E.J. Hill), plus a scattering of other trees such as 7% quaking aspen (*Populus tremuloides* Michx.), 3% red maple (*Acer rubrum* L.), 4% paper birch (*Betulus papyrifera* Marsh.), 4% northern red oak (*Quercus rubra* L.), 7% white oak (*Quercus alba* L.) and 7% of bigtooth aspen (*Populus grandidentata* Michx.).

### 3 Results

Figure 1 illustrates the results related to one of the aerial plots, Iron County 2. From the 10 plots of trees, 43 pairs of numbers were derived (Table 1). The regression analysis revealed an adjusted r-square of 0.792, with a significant regression ( $p \leq 0.01$ ), a significant constant ( $p \leq 0.01$ ) and a significant predictor  $\ln(1/r)$  ( $p \leq 0.01$ ). The regression is expressed in Equation 7. The slope of the line expressed in Equation 7 is 1.017. This suggests that the fractal dimension is nearly a line in typology.

$$\ln(N(r)) = 1.017 \ln(1/r) + 5.875 \quad (7)$$

Where:

$$\begin{aligned} N(r) &= \text{number of boxes with trees} \\ r &= \text{length of one side of box} \end{aligned}$$

The investigation revealed that each stand contained an average of 77.4 trees and a standard deviation of 34.87 trees per stand.

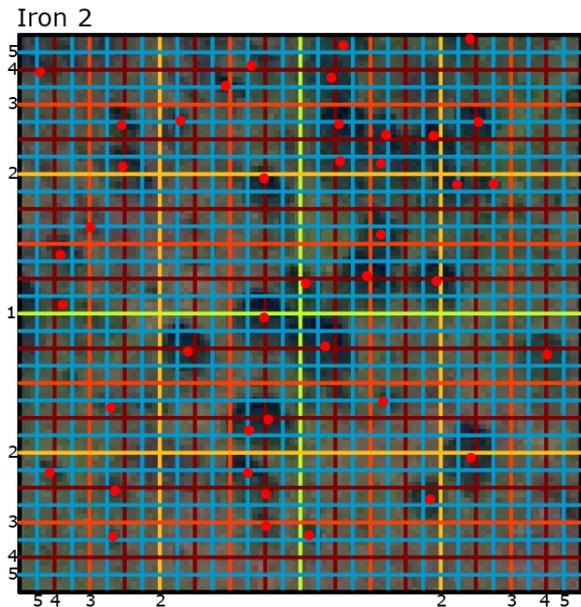


Figure 1. An aerial photograph from Iron County, Michigan with dimensions 100 meters by 100 meters divided into grids and noting the location of trees.

### 4 Discussion & Conclusion

To apply the inverse box-counting approach to this area in the landscape one would then follow these procedures:

- A. Divide the landscape to be planted in 100m grid.
- B. Divide each 100m grid into grids with sides equal to 3.125 metres (the size of the smallest boxes in Figure 1).
- C. Randomly fill the 100m grids with an average of 77.4 trees per grid and a standard deviation of 35 trees. The number of trees per grid can be increased proportionally if the mortality rate of the trees is known, such as a 20% mortality rate means that the grids should be planted with an average of 96.75 trees.
- D. The composition of the stands should be about:
  - 21% jack pine (*Pinus banksiana* Lamb.),
  - 16% red pine (*Pinus resinosa* Sol. Ex Aiton),
  - 15% Eastern white pine (*Pinus strobus* L.),
  - 12% northern pin oak (*Quercus ellipsoidalis* E.J. Hill)
  - 7% quaking aspen (*Populus tremuloides* Michx.),
  - 7% bigtooth aspen (*Populus grandidentata* Michx.),
  - 7% white oak (*Quercus alba* L.),
  - 4% paper birch (*Betulus papyrifera* Marsh.)

4% northern red oak (*Quercus rubra* L.),  
 3% red maple (*Acer rubrum* L.),  
 4% assorted list of 24 trees by Curtis [2].

Table 1. Pairs of numbers for regression analysis.

Country	Ln(1/r)	Ln(N(r))
Iron 1	-3.219	2.773
	-2.526	4.043
	-1.833	4.521
	-1.139	4.787
Iron 2	-3.219	2.773
	-2.526	3.434
	-1.833	3.738
Iron 3	-4.605	0.000
	-3.912	1.099
	-3.219	2.485
	-2.526	3.044
	-1.833	3.526
Iron 4	-1.139	3.714
	-3.219	2.773
	-2.526	3.951
	-1.833	4.575
Iron 5	-1.139	4.796
	-3.912	1.386
	-3.219	2.708
	-2.526	3.219
Dickinson 1	-1.833	3.367
	-3.219	2.773
	-2.526	4.060
	-1.833	4.533
Dickinson 2	-1.139	4.727
	-3.219	2.773
	-2.526	3.912
	-1.833	4.489
Dickinson 3	-1.139	4.700
	-0.446	4.718
	-3.912	1.386
	-3.219	2.708
Dickinson 4	-2.526	3.526
	-1.833	3.807
	-1.139	3.829
	-3.219	2.773
Dickinson 5	-2.526	3.871
	-1.833	4.407
	-1.139	4.443
	-3.219	2.773
Dickinson 5	-2.526	3.714
	-1.833	4.382
	-1.139	4.190

The planting scheme can be accomplished with seedlings being planted by hand or even with

machine planting, as long as the tree is placed in the correct designated box.

The inverse box-counting process illustrates that it possible to use the fractal pattern to create a stand of vegetation. The process employs calculating the fractal score of an existing pattern and employing the inverse box process to apply the pattern to a landscape. However the inverse box-counting process is a reverse process, as opposed to a forward process when investigators first began calculating the fractal scores of objects. The reverse process takes an existing score to create something new. Currently there is no mathematical proof that this process is truly reversible.

In addition this process has been employed with vegetation. We believe that it is possible to replicate fractal patterns of hills, waterways, and complex multi-species patterns. We expect to explore this potential in the future. In our study we did not differentiate various species of vegetation. With more careful on-site study, it may be possible to gather multi-species data and construct patterns with numerous species.

We encourage reclamation and restoration planning and design specialists to explore the inverse box-counting method to create biospheric landscapes.

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