



# WPI

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## CS 543: Computer Graphics

# Fractals & Iterative Function Systems

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(with lots of help from Prof. Emmanuel Agu :-)

## What are Fractals?

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- Mathematical expressions
- Approach infinity in organized way
- Utilize recursion on computers
- Popularized by Benoit Mandelbrot (Yale University)
- Dimensionality
  - Line is one-dimensional
  - Plane is two-dimensional
  - Fractals fall somewhere in between
- Defined in terms of self-similarity

## Self Similarity

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- Level of detail remains the same as we zoom in
- Example
  - Surface roughness, or silhouette, of mountains is the same at many zoom levels
  - Difficult to determine scale
- Types of fractals
  - Exactly self-similar
  - Statistically self-similar

## Examples of Fractals

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- ❑ Modeling mountains (terrain)
- ❑ Clouds
- ❑ Fire
- ❑ Branches of a tree
- ❑ Grass
- ❑ Coastlines
- ❑ Surface of a sponge
- ❑ Cracks in the pavement
- ❑ Designing antennae ([www.fractenna.com](http://www.fractenna.com))

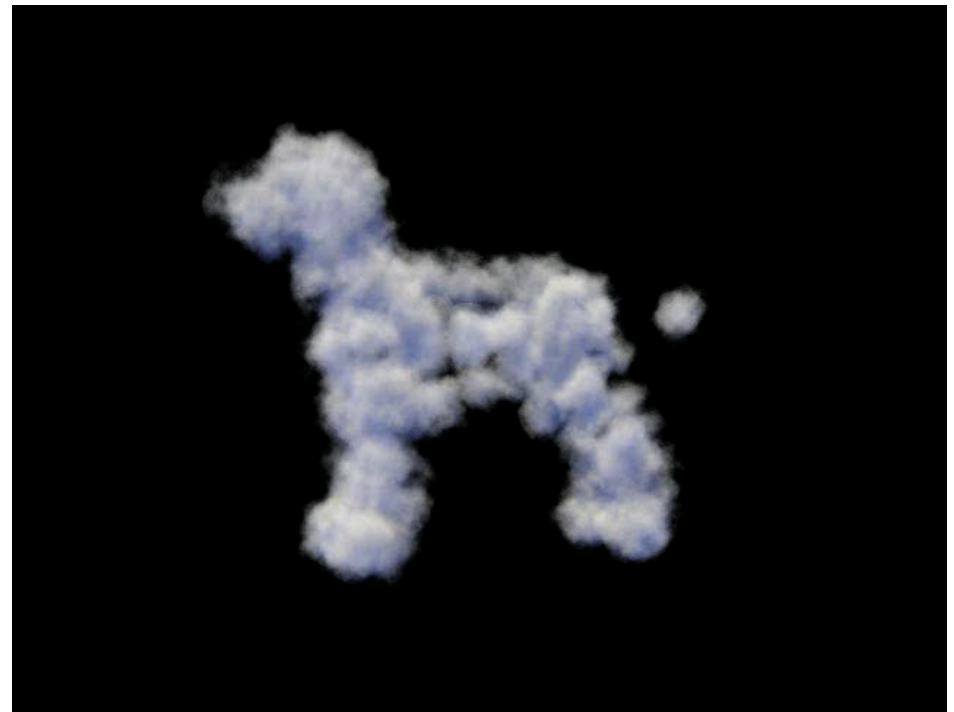
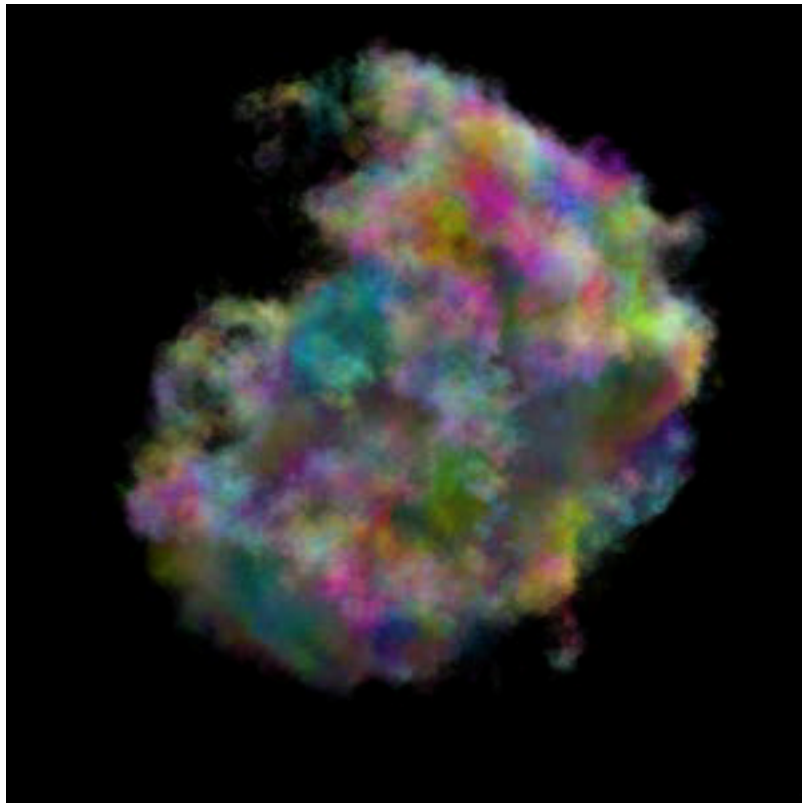
## Examples of Fractals: Mountains

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## Examples of Fractals: Clouds

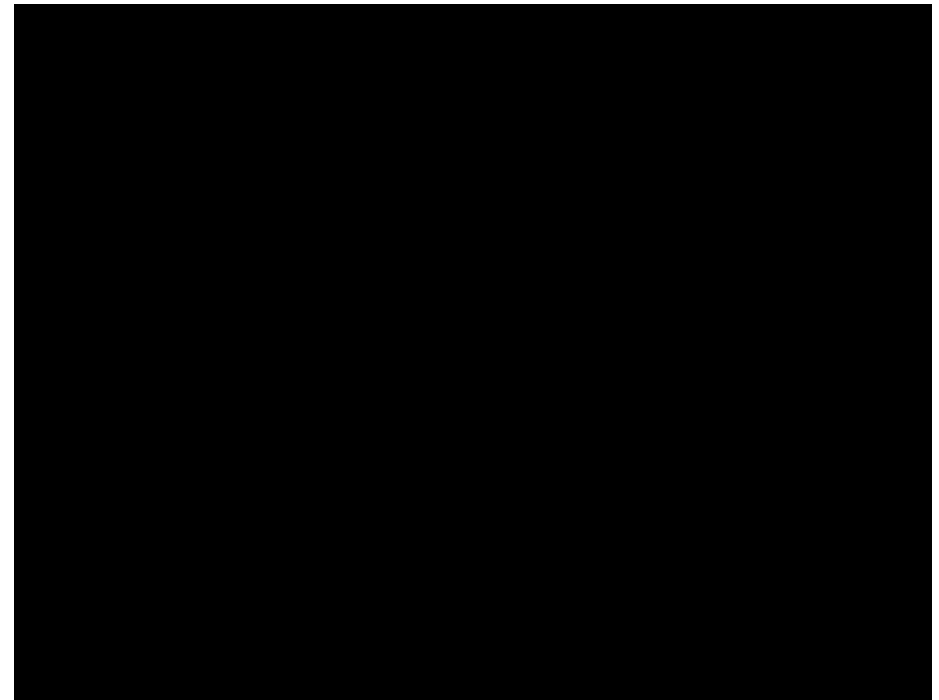
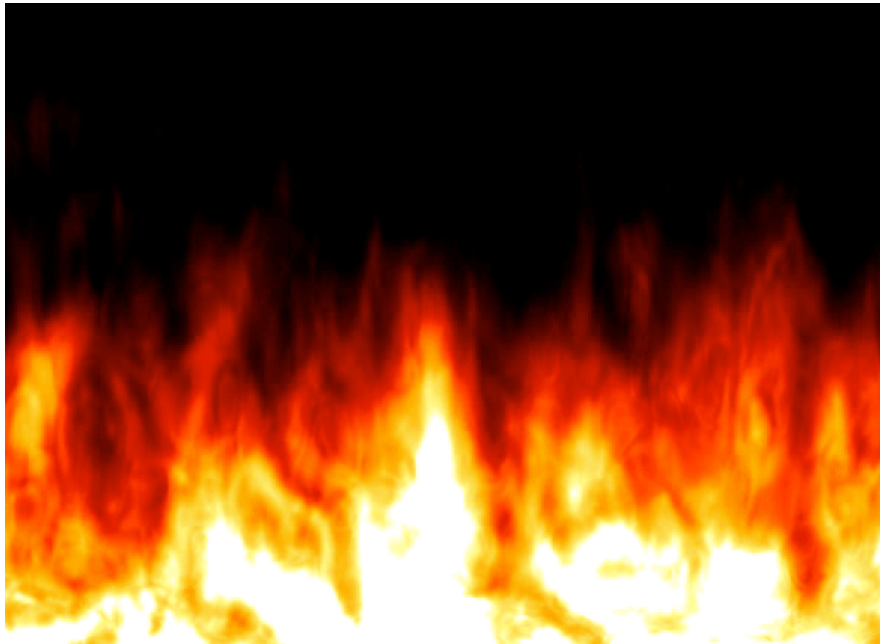
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Images: [www.kenmusgrave.com](http://www.kenmusgrave.com)

## Examples of Fractals: Fire

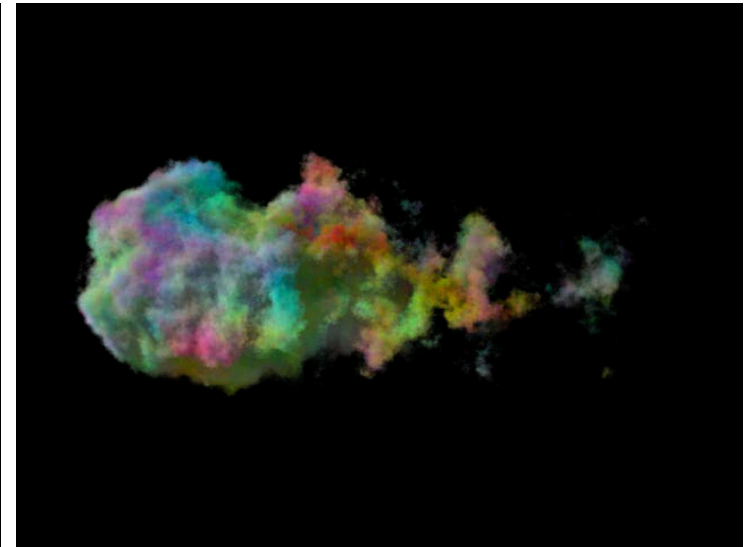
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Images: [www.kenmusgrave.com](http://www.kenmusgrave.com)

## Examples of Fractals: Comets?

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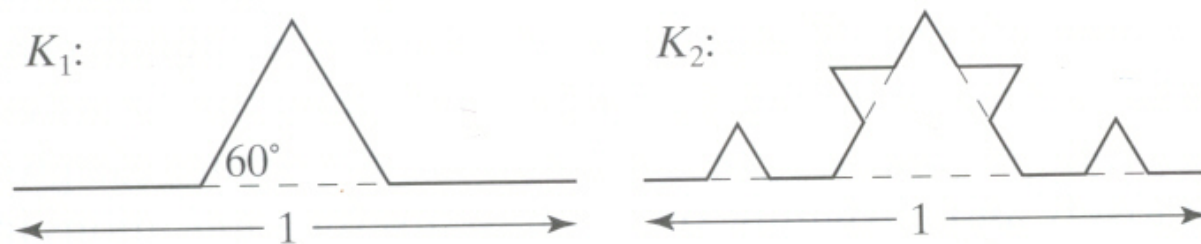


Images: [www.kenmusgrave.com](http://www.kenmusgrave.com)



## Koch Curves

- ❑ Discovered in 1904 by Helge von Koch
- ❑ Start with straight line of length 1
- ❑ Recursively
  - Divide line into three equal parts
  - Replace middle section with triangular bump with sides of length  $1/3$
  - New length =  $4/3$



# Koch Snowflake

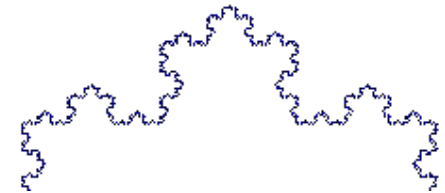
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- Can form Koch snowflake by joining three Koch curves
- Perimeter of snowflake grows as:

$$P_i = 3\left(\frac{4}{3}\right)^i$$

where  $P_i$  is the perimeter of the  $i$ th snowflake iteration

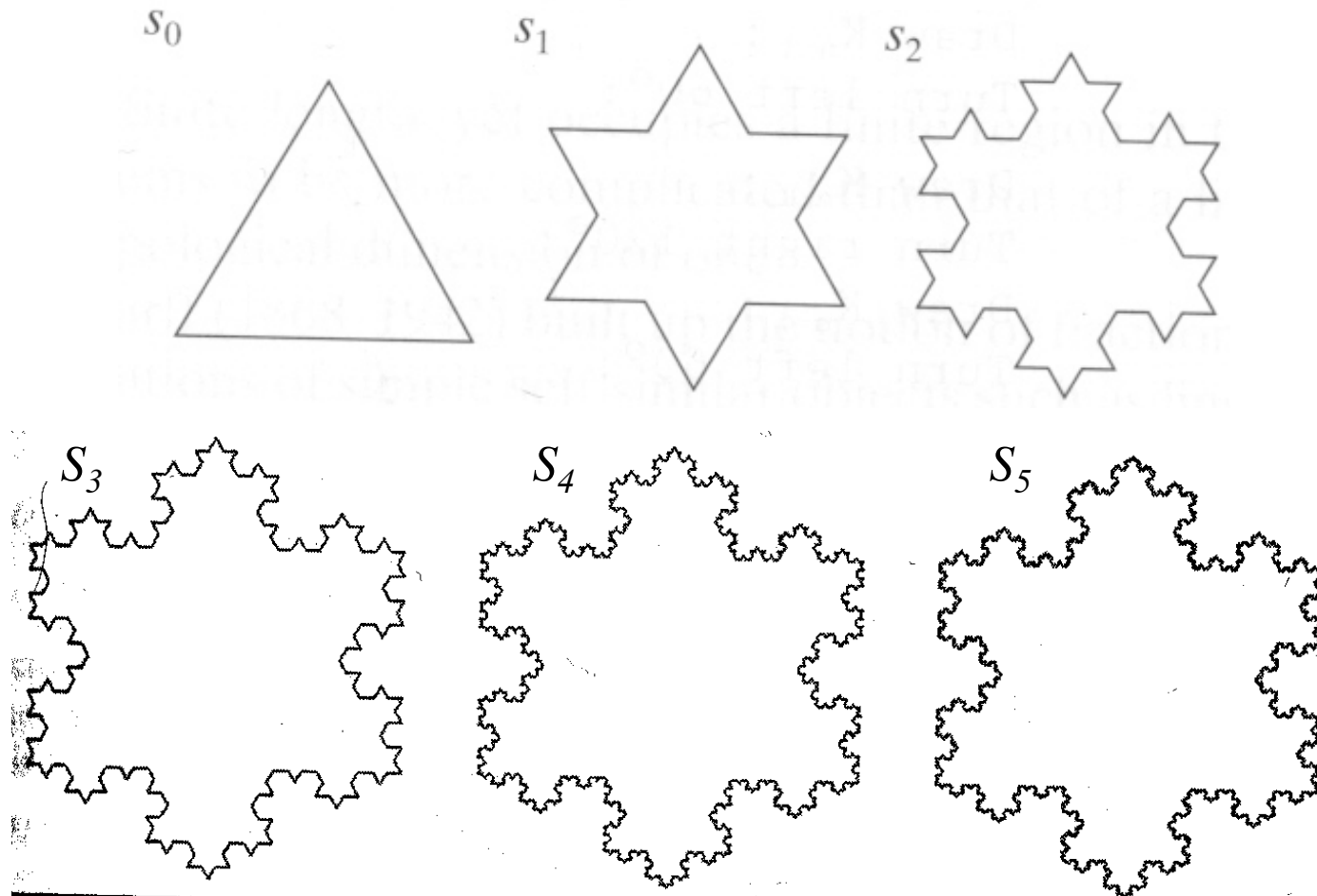
- However, area grows slowly as  $S_\infty = 8/5!$
- Self similar
  - Zoom in on any portion
  - If  $n$  is large enough, shape is the same
  - On computer, smallest line segment  $>$  pixel spacing



[www.jimloy.com](http://www.jimloy.com)

## Koch Snowflake

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# Pseudocode to draw Koch Curve

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```
if (n equals 0) {  
    draw straight line  
} else {  
    Draw  $K_{n-1}$   
    Turn left  $60^\circ$   
    Draw  $K_{n-1}$   
    Turn right  $120^\circ$   
    Draw  $K_{n-1}$   
    Turn left  $60^\circ$   
    Draw  $K_{n-1}$   
}
```

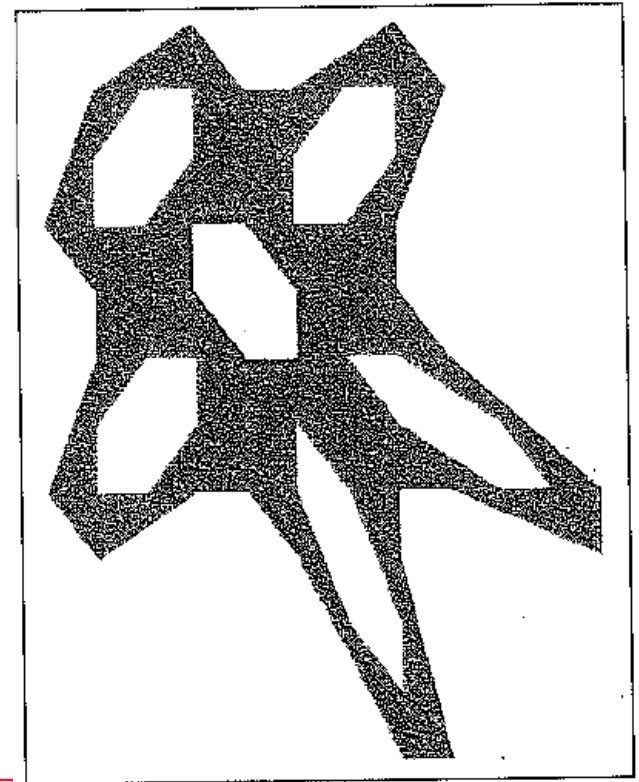
# Gingerbread Man

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- Each new point  $\mathbf{q}$  is formed from previous point  $\mathbf{p}$  using the equation

$$q.x = M(1 + 2L) - p.y + |p.x - LM|;$$
$$q.y = p.x.$$

- For 640 x 480 display area,  
use  $M = 40$      $L = 3$
- A good starting point is  
(115, 121)



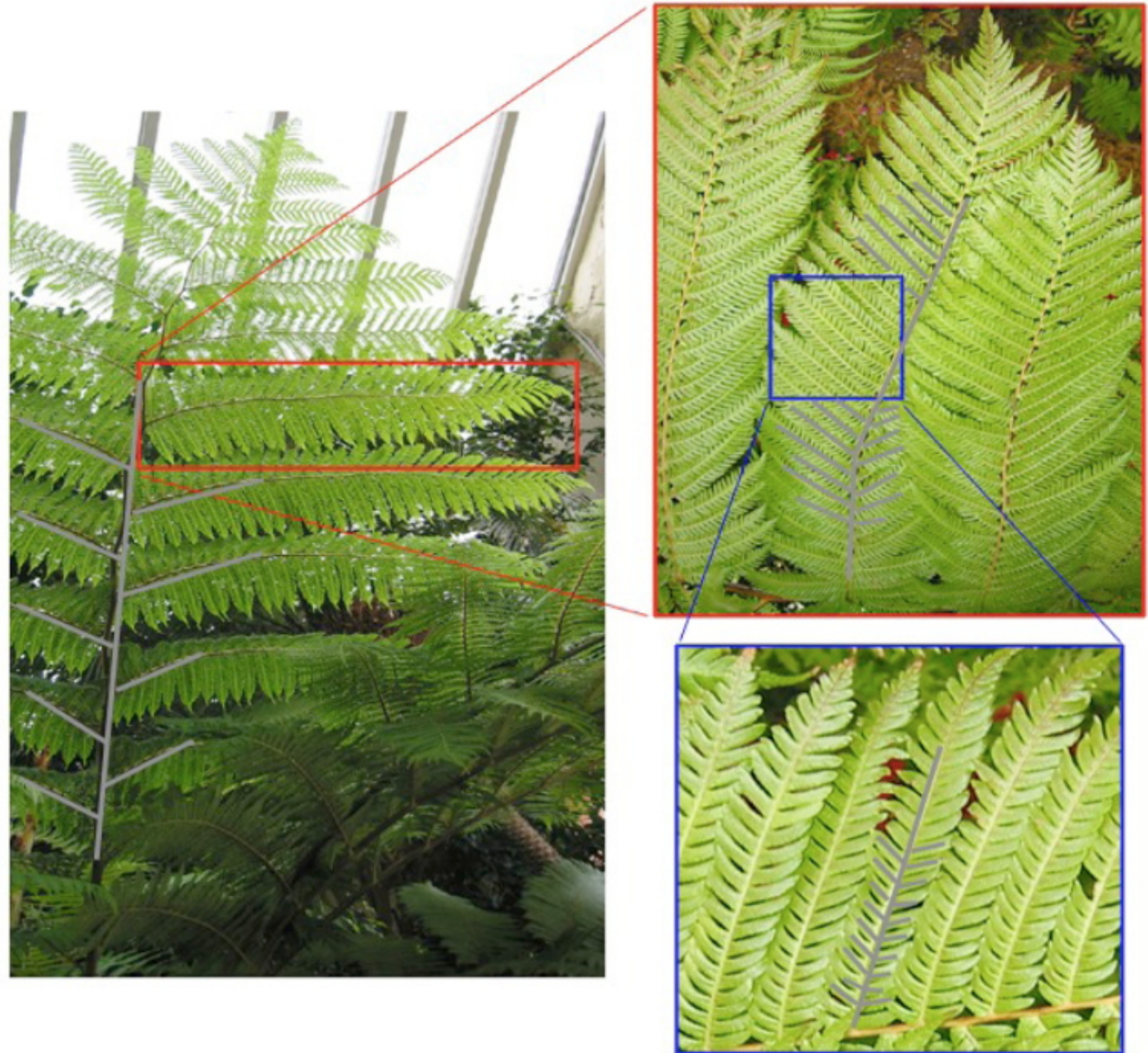
# Iterated Function Systems (IFS)

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- Subdivide
- Recursively call a function
- Does result converge to an image? What image?
- IFS do converge to an image
- Examples
  - The Fern
  - The Mandelbrot set

# Example: Ferns

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# Fractals and Self-Similarity

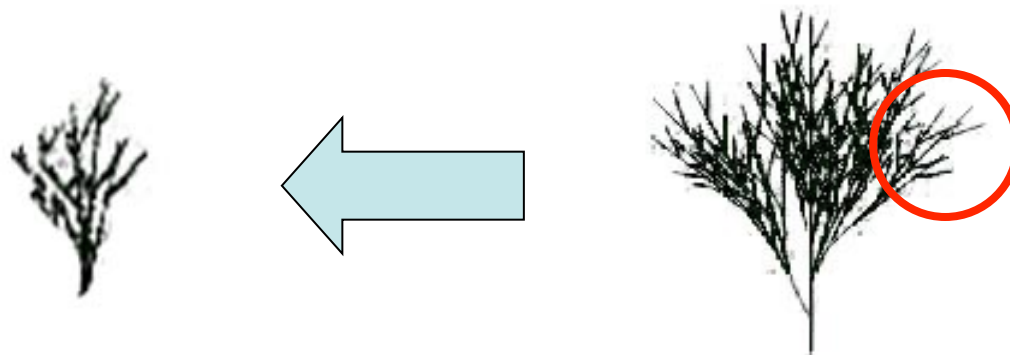
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## □ **Exact Self-similarity**

- Each small portion of the fractal is a reduced-scale replica of the whole (except for a possible rotation and shift).

## □ **Statistical Self-similarity**

- The irregularities in the curve are statistically the same, no matter how many times the picture is enlarged.





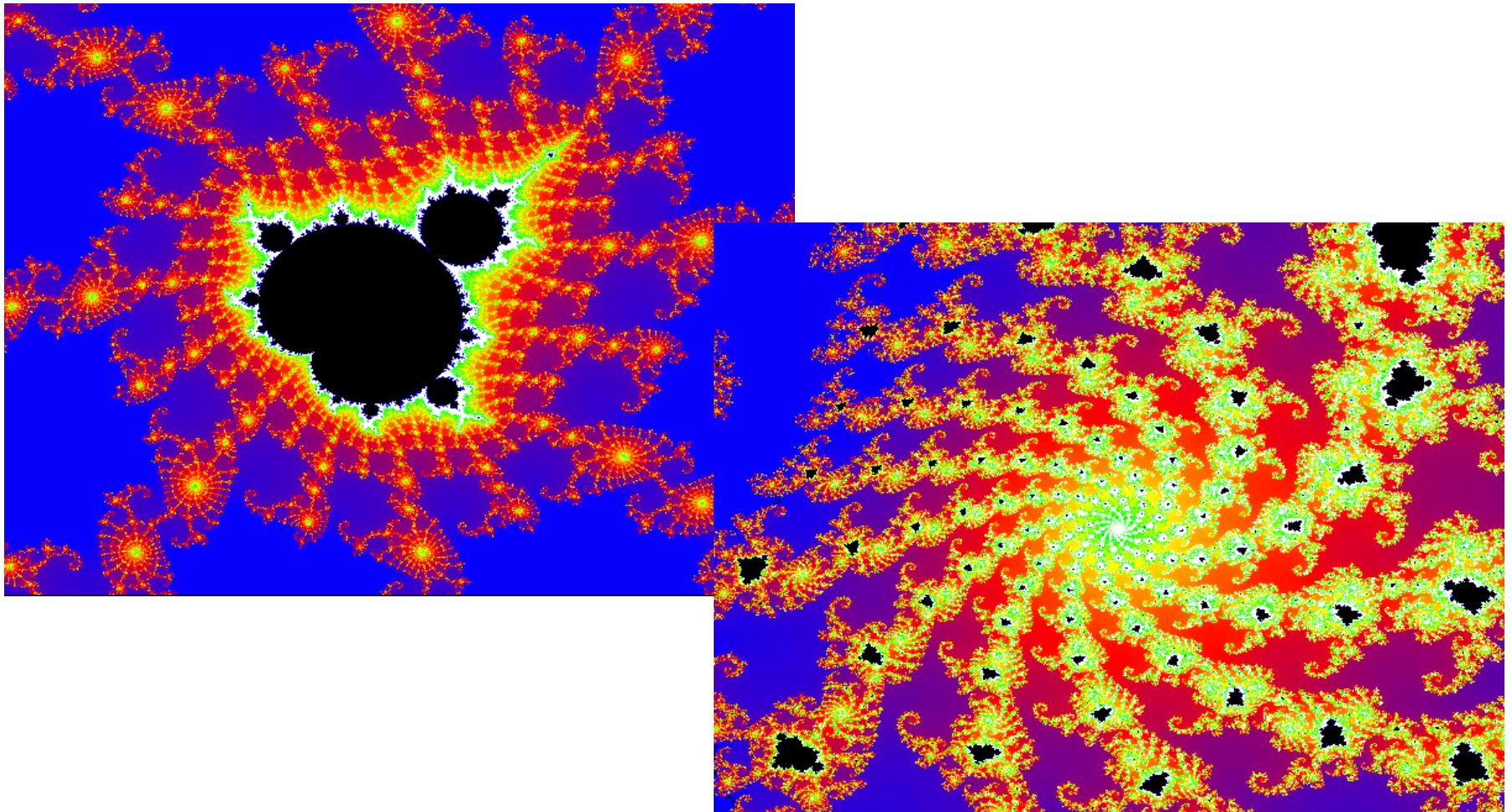
## The Fern

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- Any (sub) branch looks similar to any other (sub) branch
- Including ancestors and descendents

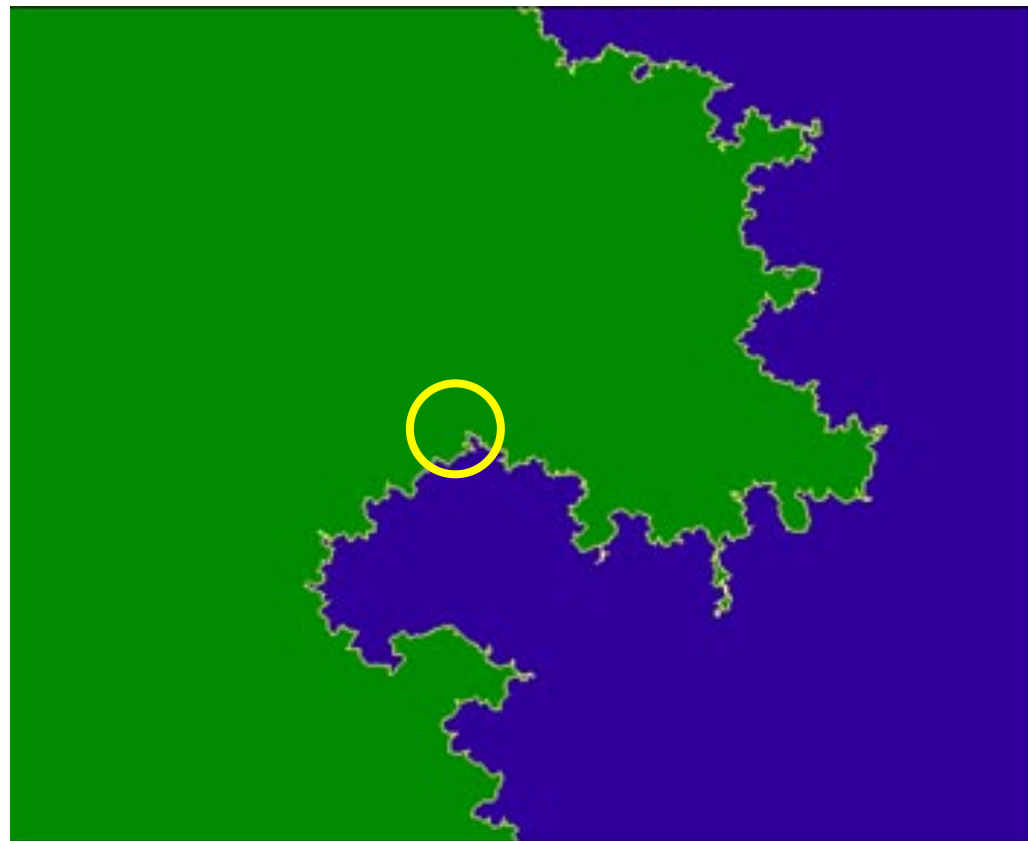
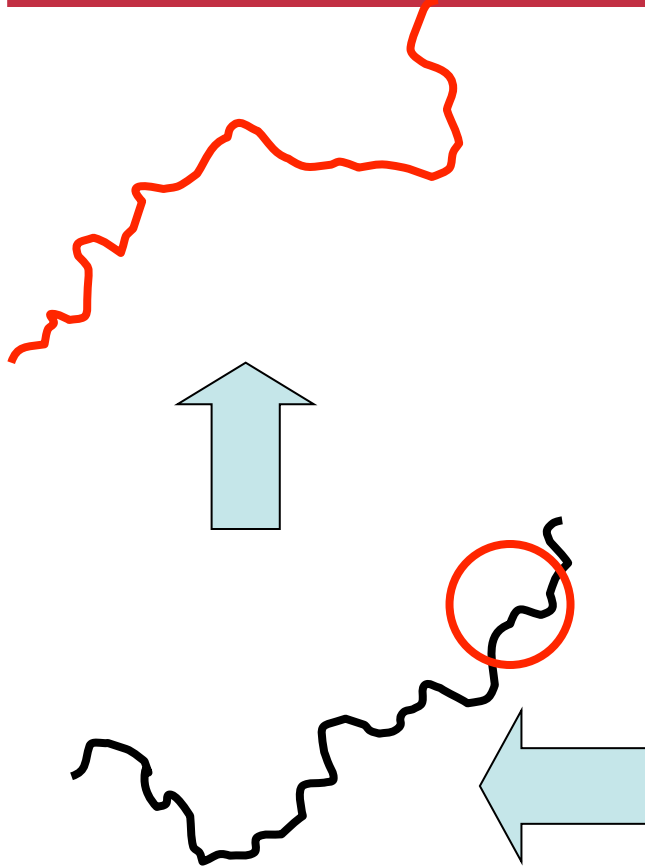


## Mandelbrot Set



## Fractal Coastline

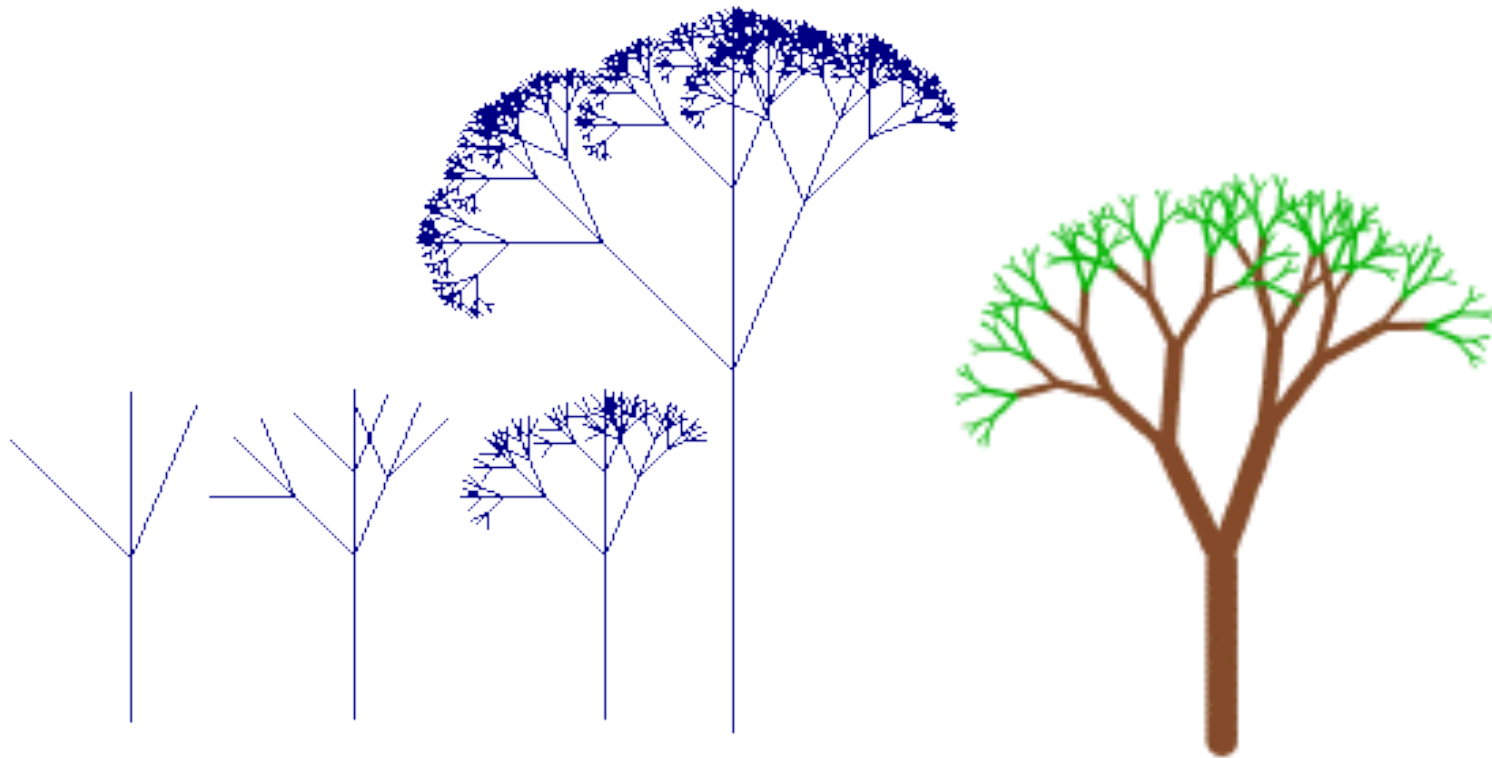
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## Examples of Fractals: Trees

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Fractals appear “the same” at every scale.

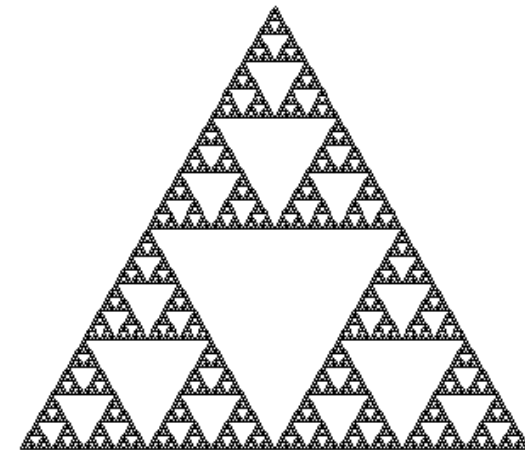
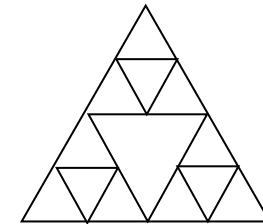
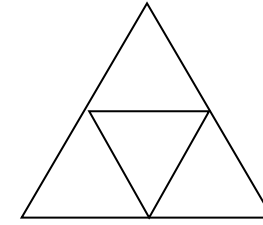


# Fractal Dimension – Eg. 2

## The Sierpinski Triangle

$$D = \frac{\log N}{\log \left( \frac{1}{s} \right)}$$

$$N = 3, \quad s = \frac{1}{2}$$
$$\therefore D = 1.584$$



# Space-Filling Curves

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- There are fractal curves which completely fill up higher dimensional spaces such as squares or cubes.
- The space-filling curves are also known as Peano curves (Giuseppe Peano: 1858-1932).
- Space-filling curves in 2D have a fractal dimension 2.

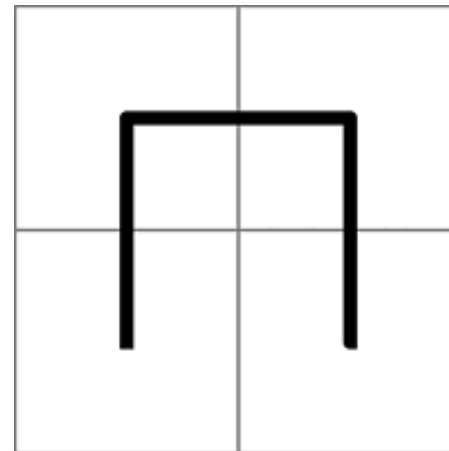
You're not expected to be able to prove this.

# Hilbert Curve

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- ❑ Discovered by German Scientist, David Hilbert in late 1900s
- ❑ Space filling curve
- ❑ Drawn by connecting centers of 4 sub-squares, make up larger square.
- ❑ Iteration 0: 3 segments connect 4 centers in upside-down U

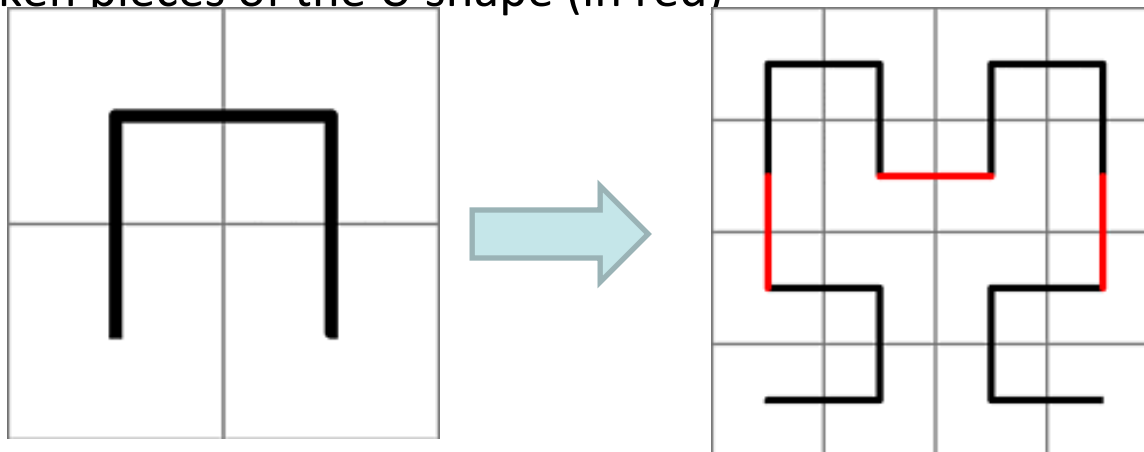
**Iteration 0**





## Hilbert Curve: Iteration 1

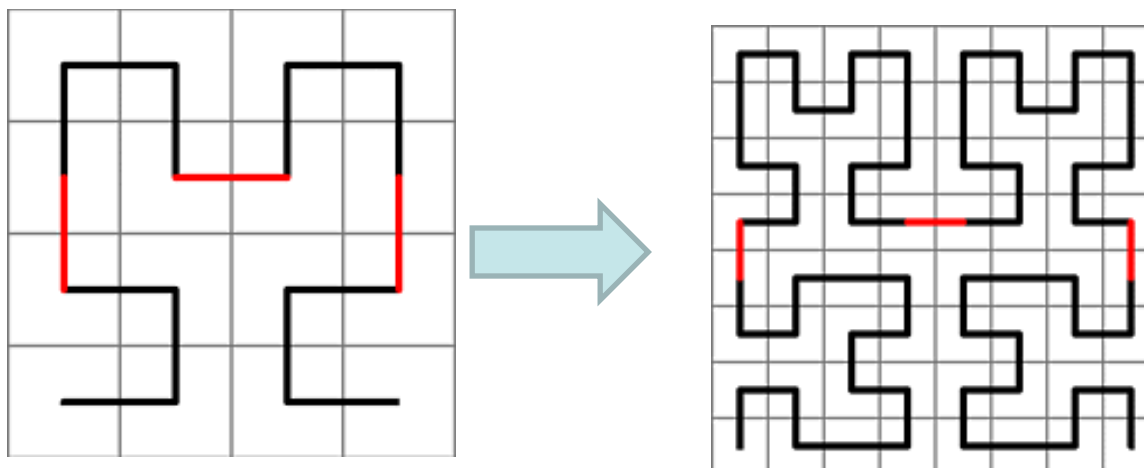
- ❑ Each of 4 squares divided into 4 more squares
- ❑ U shape shrunk to half its original size, copied into 4 sectors
- ❑ In top left, simply copied, top right: it's flipped vertically
- ❑ In the bottom left, rotated 90 degrees clockwise,
- ❑ Bottom right, rotated 90 degrees counter-clockwise.
- ❑ 4 pieces connected with 3 segments, each of which is same size as the shrunken pieces of the U shape (in red)





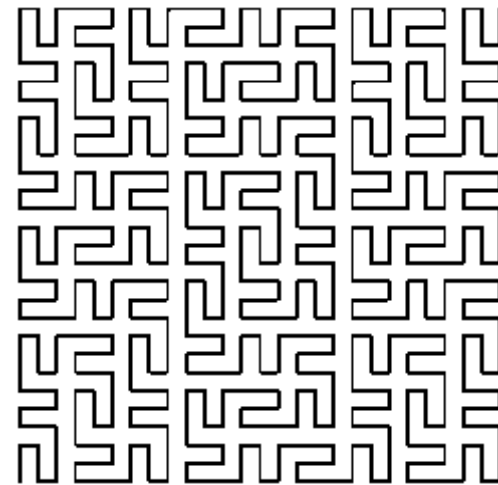
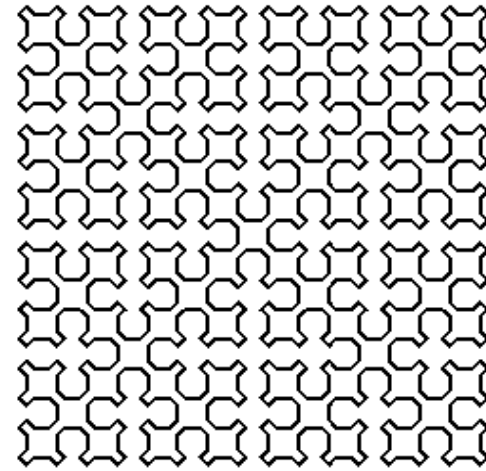
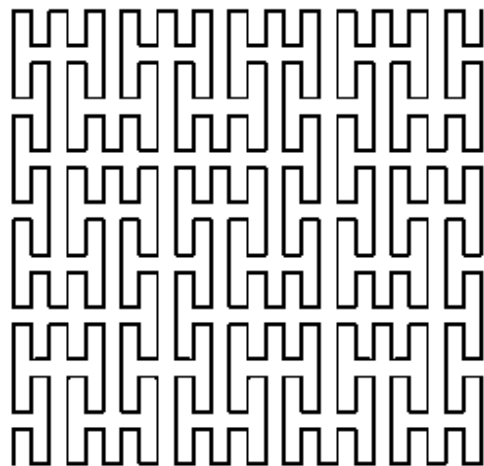
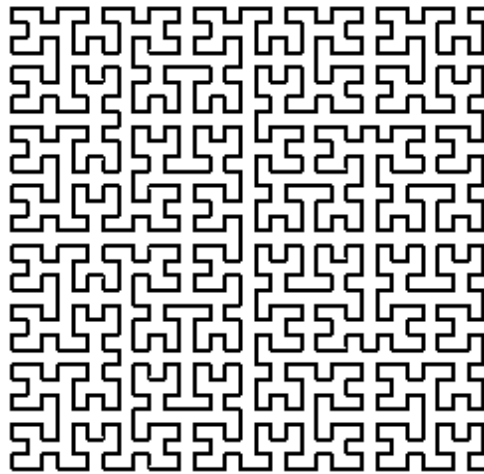
## Hilbert Curve: Iteration 2

- Each of the 16 squares from iteration 1 divided into 4 squares
- Shape from iteration 1 shrunk and copied.
- 3 connecting segments (shown in red) are added to complete the curve.
- Implementation? Recursion is your friend!!



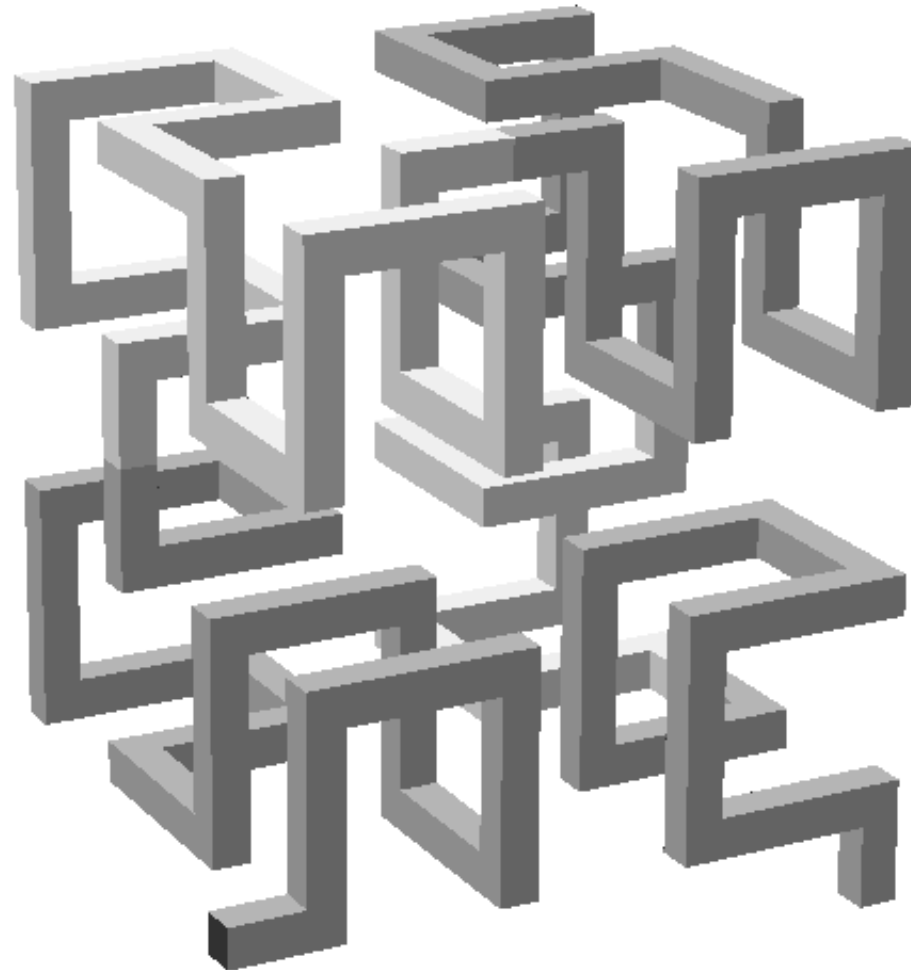
## Space-Filling Curves

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## Space-Filling Curves in 3D

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## Generating Fractals

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- Iterative/recursive subdivision techniques
  
- Grammar based systems (L-Systems)
  - Suitable for turtle graphics/vector devices
  
- Iterated Functions Systems (IFS)
  - Suitable for raster devices

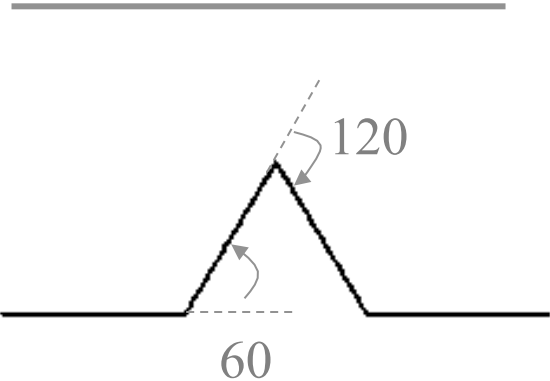

# L-Systems

(“Lindenmayer Systems”)

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- A grammar-based model for generating simple fractal curves
  - Devised by biologist Aristid Lindenmayer for modeling cell growth
  - Particularly suited for rendering line drawings of fractal curves using turtle graphics
- Consists of a start string (*axiom*) and a set of *replacement rules*
  - At each iteration all replacement rules are applied to the string in parallel
- Common symbols:
  - F     Move forward one unit in the current direction.
  - +     Turn right through an angle  $A$ .
  - -     Turn left through an angle  $A$ .

# The Koch Curve

	Order	
Axiom: F (the zeroth order Koch curve)		
Rule: $F \rightarrow F-F++F-F$		
Angle: $60^\circ$		
First order: F-F++F-F	0	
		1
Second order: F-F++F-F-F-F-F++F-F++F-F++F-F-F-F++F-F		2

## The Dragon Curve

Axiom: FX

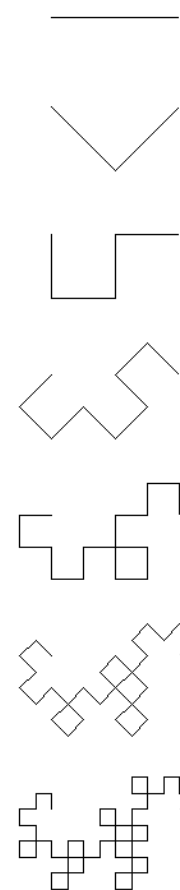
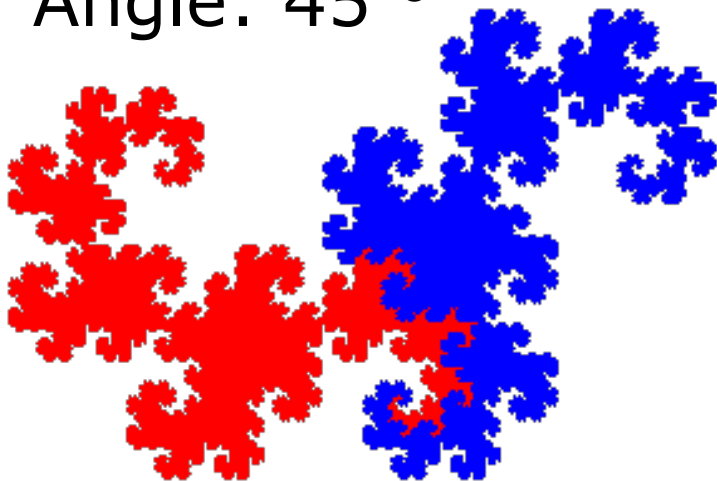
Rules:

$F \rightarrow \emptyset$

$X \rightarrow +FX--FY+$

$Y \rightarrow -FX++FY-$

Angle:  $45^\circ$



At each step, replace a straight segment with a right angled elbow.

Alternate right and left elbows.

FX and FY are “embryonic” right and left elbows respectively.

# L-System code

---

```
import turtle
turtle.speed(0) # Max speed (still horribly slow)

def draw(start, rules, angle, step, maxDepth):
    for char in start:
        if maxDepth == 0:
            if char == 'F': turtle.forward(step)
            elif char == '-': turtle.left(angle)
            elif char == '+': turtle.right(angle)
        else:
            if char in rules: # rules is a dictionary
                char = rules[char]
            draw(char, rules, angle, step, maxDepth-1)

# Dragon example:
draw("FX", {'F': "", 'X': "+FX--FY+", 'Y': "-FX++FY-"}, 45, 5, 10)
```



# Generalized Grammars

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- The grammar rules in L-systems can be further generalized to provide the capability of drawing branchlike figures, rather than just continuous curves.
- The symbol `[` is used to store the current state of the turtle (position and direction) in a stack for later use.
- The symbol `]` is used to perform a pop operation on the stack to restore the turtle's state to a previously stored value.

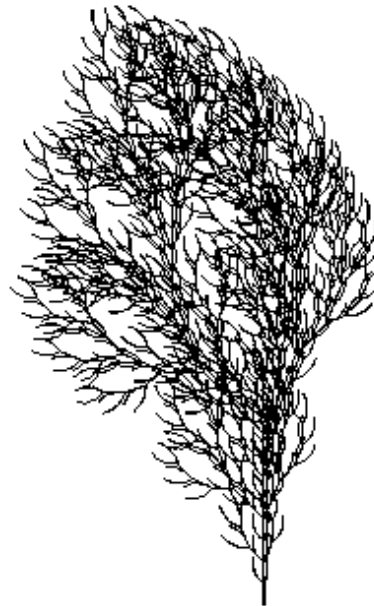
# Generalized Grammars

Fractal bush:

$$S \rightarrow F$$

$$F \rightarrow FF-[-F+F+F]+[+F-F-F]$$

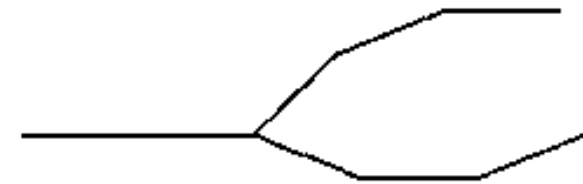
(A = 22 degs.)



Fourth order bush  
(with 90 deg. rotation)

Zero order bush

F



First order bush

# Random Fractals

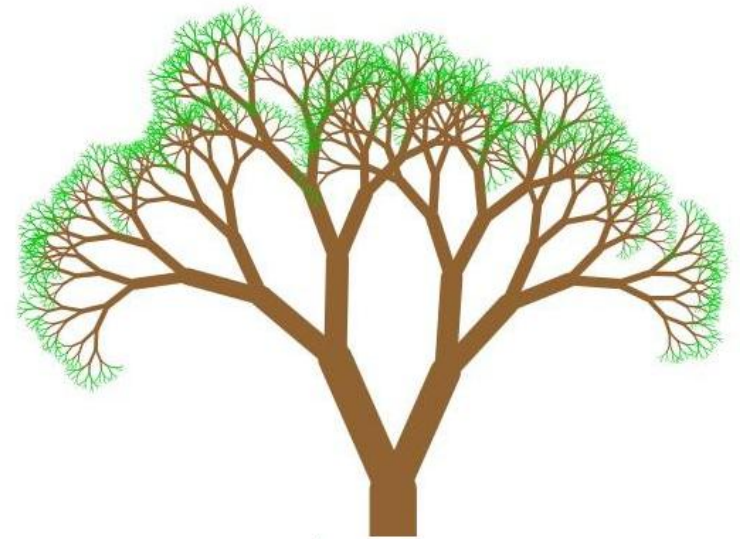
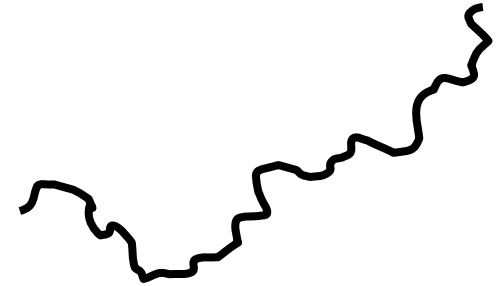
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- Natural objects do not contain identical scaled down copies within themselves and so are not exact fractals.
- Practically every example observed involves what appears to be some element of randomness, perhaps due to the interactions of very many small parts of the process.
- Almost all algorithms for generating fractal landscapes effectively add random irregularities to the surface at smaller and smaller scales.

# Random Fractals

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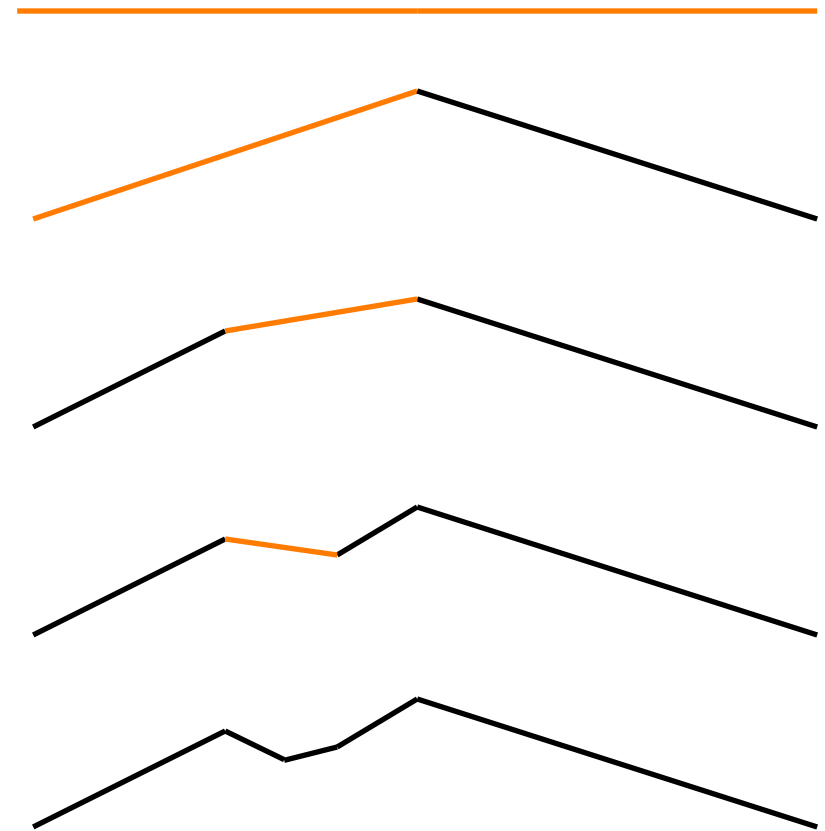
- Random fractals are
  - randomly generated curves that exhibit self-similarity, or
  - deterministic fractals modified using random variables
  
- Random fractals are used to model many natural shapes such as trees, clouds, and mountains.



# IFS Example: Generating Fractal Terrain (2D)

---

1. Choose a random-number range
2. Start with a line
3. Find the midpoint
4. Displace it in  $y$  by a random amount
5. Reduce the range of your random numbers
  - Controls roughness
6. Recurse on both new segments

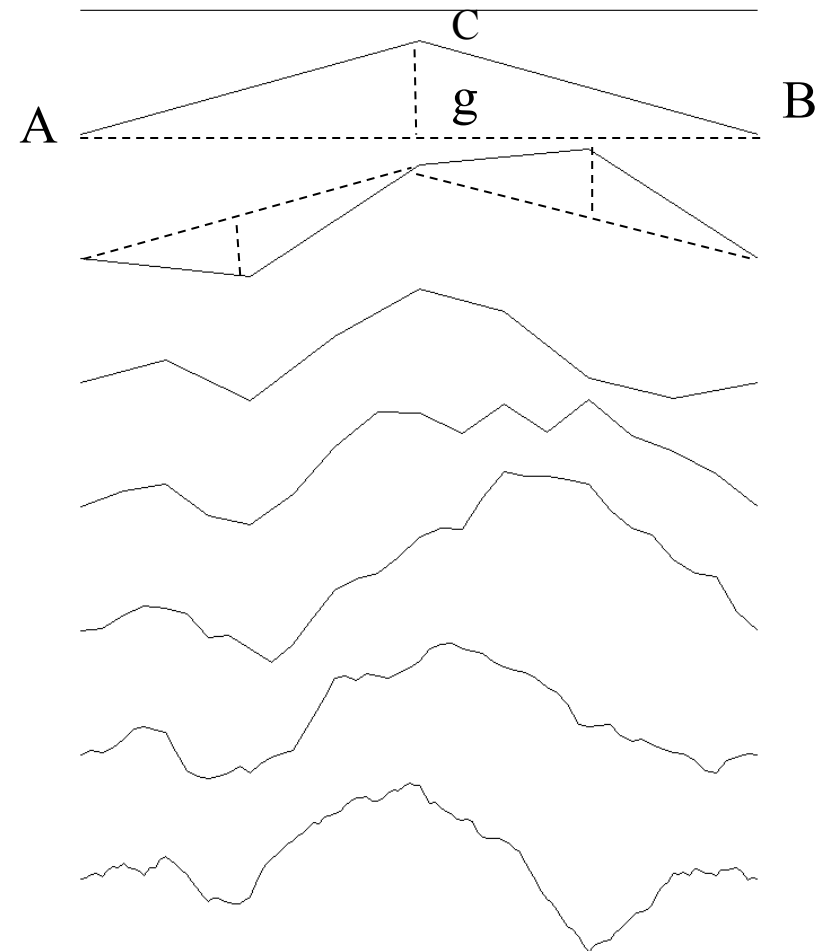


## Random Midpoint Displacement Algorithm (2D)

- Subdivide a line segment into two parts, by displacing the midpoint by a random amount “g”. *i.e.*, y-coordinate of C is

$$y_C = (y_A + y_B)/2 + g$$

- Generate  $g$  using a Gaussian random variable with zero mean (allowing negative values) and standard deviation  $s$ .
- Recurse on each new part
  - At each level of recursion, the standard deviation is scaled by a factor  $(1/2)^H$ 
    - $H$  is a constant between 0 and 1
    - $H = 1$  in the example on the right



## Midpoint Displacement Algorithm (3D)

### Square-Step:

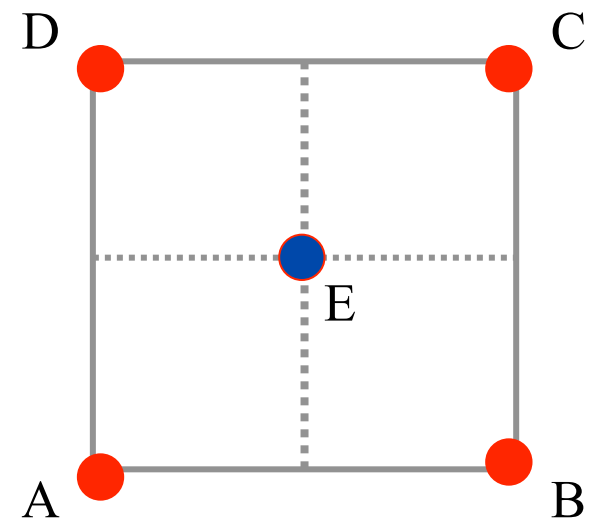
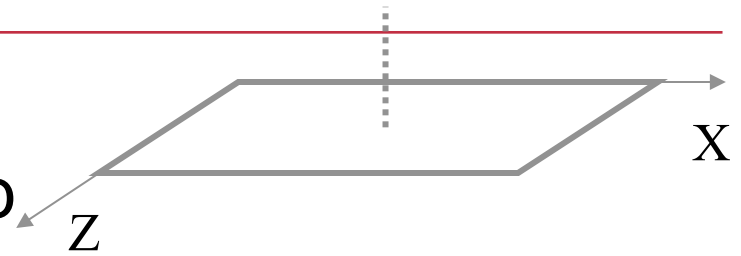
Subdivide a ground square into four parts, by displacing the midpoint by a Gaussian random variable  $g$  with mean 0, std dev  $s$ .

*i.e.*, Compute  $y$ -coordinate of  $E$  as

$$y_E = (y_A + y_B + y_C + y_D) / 4 + g$$

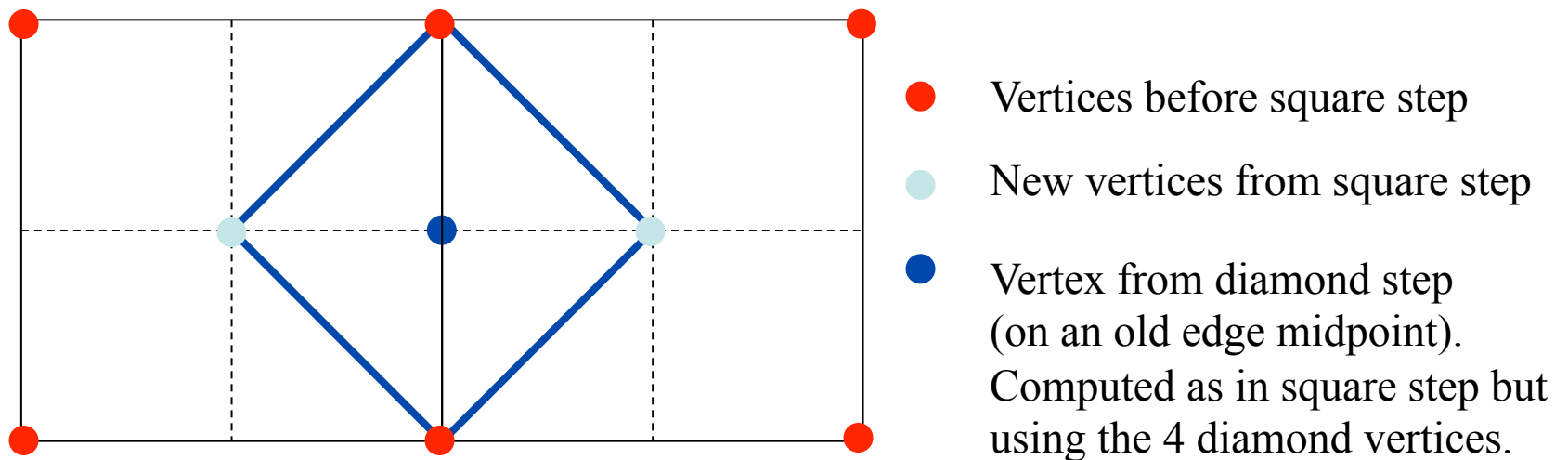
Do that for all squares in the grid (only 1 square for the first iteration).

Then ...



# Diamond step

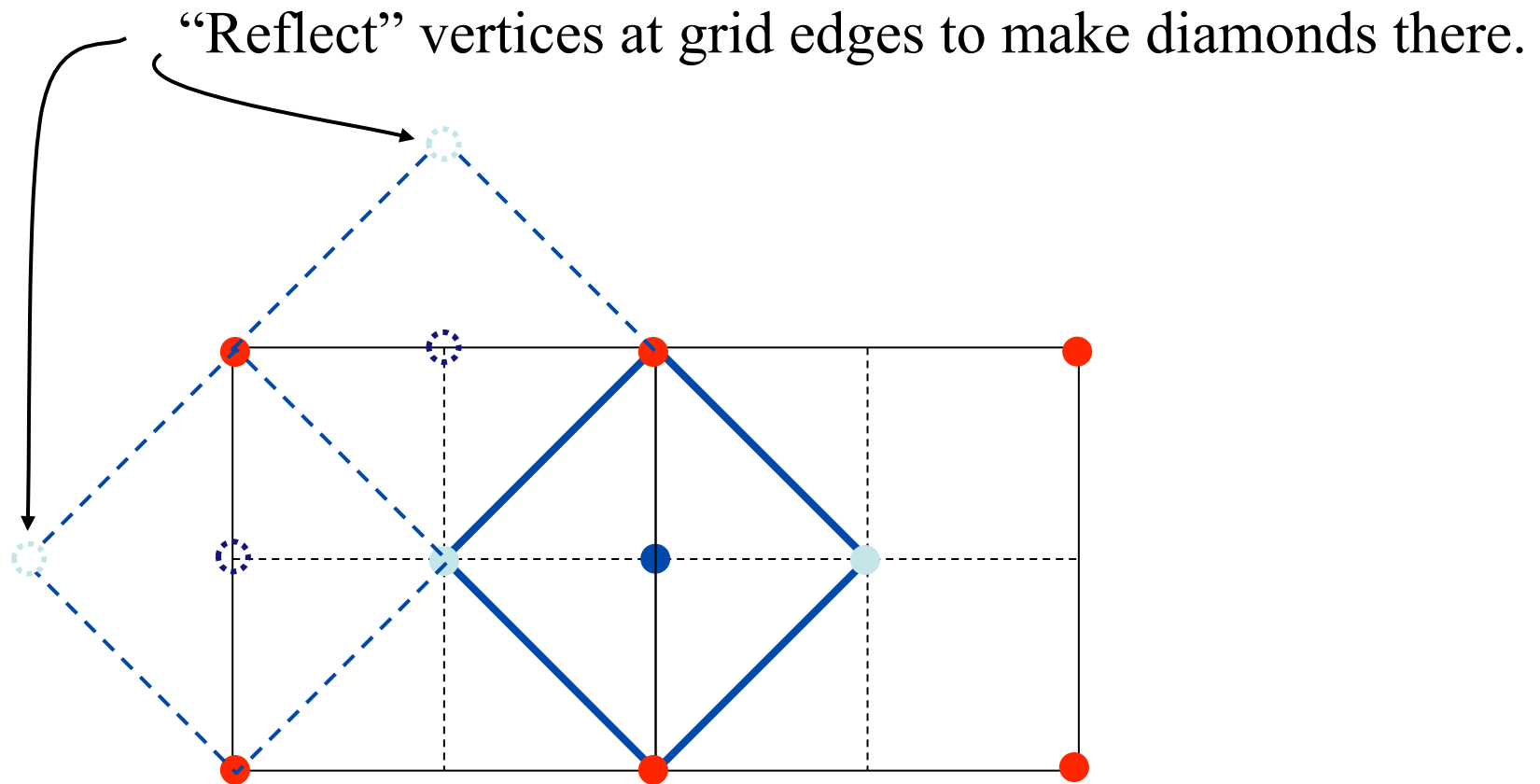
- To get back to a regular grid, we now need new vertices at all the edge mid-points too.
- For this we use a *diamond step*:



Do this for all edges (i.e., all possible diamonds).



## Diamond step (cont' d)

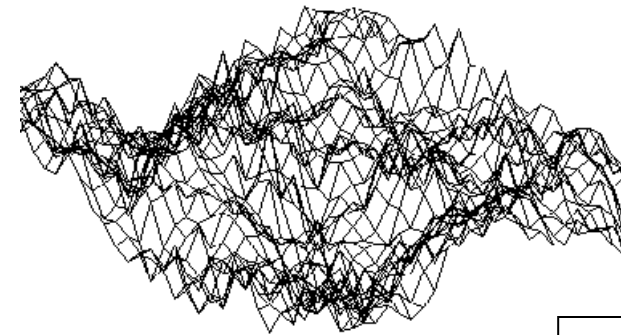


# Diamond-Square Algorithm

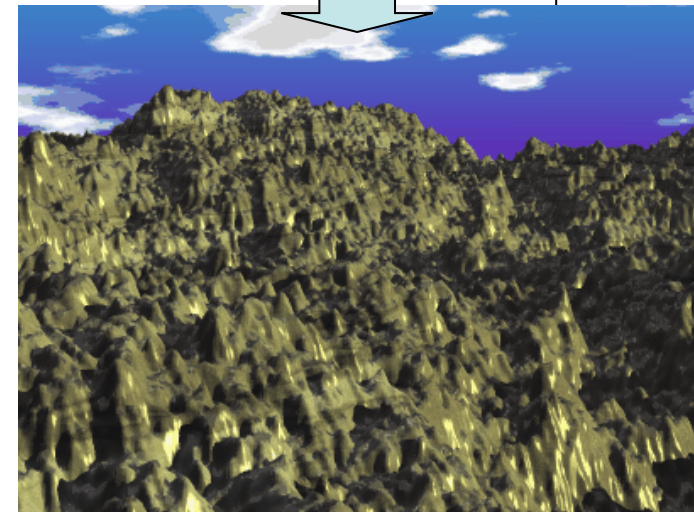
The above two steps are repeated for the new mesh, after scaling the standard deviation of  $g$  by  $(1/2)^H$ . And so on ...



H=0.8

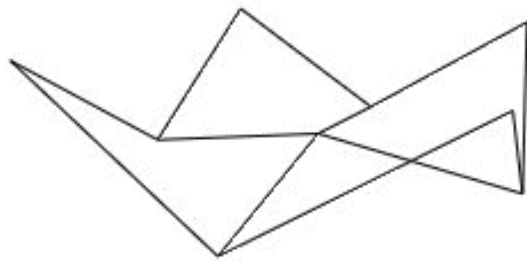


H=0.4

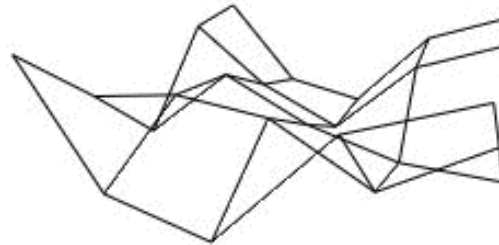


## Diamond Step Process

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1<sup>st</sup> pass



2<sup>nd</sup> pass

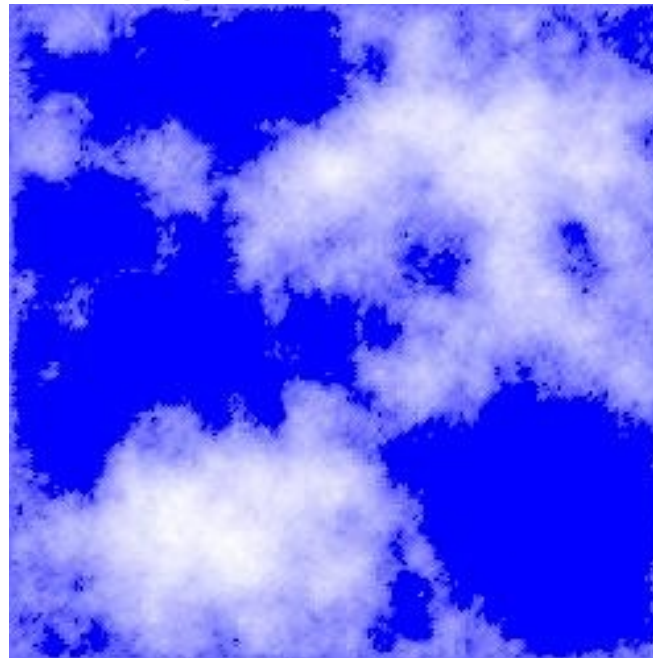


5<sup>th</sup> pass

# Height Maps

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- The 2D height map obtained using the diamond-square algorithm can be used to generate fractal clouds.
- Use the y value to generate opacity.



# Useful Links

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- Terragen – terrain generator
  - <http://www.planetside.co.uk/terrigen/>
  
- Generating Random Fractal Terrain
  - <http://www.gameprogrammer.com/fractal.html>
  
- Lighthouse 3D OpenGL Terrain Tutorial
  - <http://www.lighthouse3d.com/opengl/terrain/>
  
- Book about Procedural Content Generation
  - Noor Shaker, Julian Togelius, Mark J. Nelson, ***Procedural Content Generation in Games: A Textbook and an Overview of Current Research*** (Springer), 2014.
  
- Book about Procedural Generation
  - David S. Ebert, F. Kenton Musgrave, Darwyn Peachey, Ken Perlin, Steve Worley. ***Texturing and Modeling: A Procedural Approach*** (The Morgan Kaufmann Series in Computer Graphics)

## References

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- Angel and Shreiner, Interactive Computer Graphics, 6<sup>th</sup> edition, Chapter 9
- Hill and Kelley, Computer Graphics using OpenGL, 3<sup>rd</sup> edition, Appendix 4