



# Procedural Methods

CS 432 Interactive Computer Graphics

Prof. David E. Breen

Department of Computer Science



# Shader Applications

- Moving vertices
  - Wave motion
  - Morphing
  - Particle systems
  - Newtonian dynamics
  - Fractals
- Lighting
  - More realistic models
  - Cartoon shaders



# Wave Motion Vertex Shader

```
uniform float time;
uniform float xs, zs, // frequencies
uniform float h; // height scale
uniform mat4 ModelView, Projection;
in vec4 vPosition;

void main() {
    vec4 t = vPosition;
    t.y = vPosition.y
        + h*sin(time + xs*vPosition.x)
        + h*sin(time + zs*vPosition.z);
    gl_Position = Projection*ModelView*t;
}
```



# Modeling

- Geometric
  - Meshes
  - Hierarchical
  - Curves and Surfaces
- Procedural
  - Particle Systems
  - Fractal



# Particle Systems

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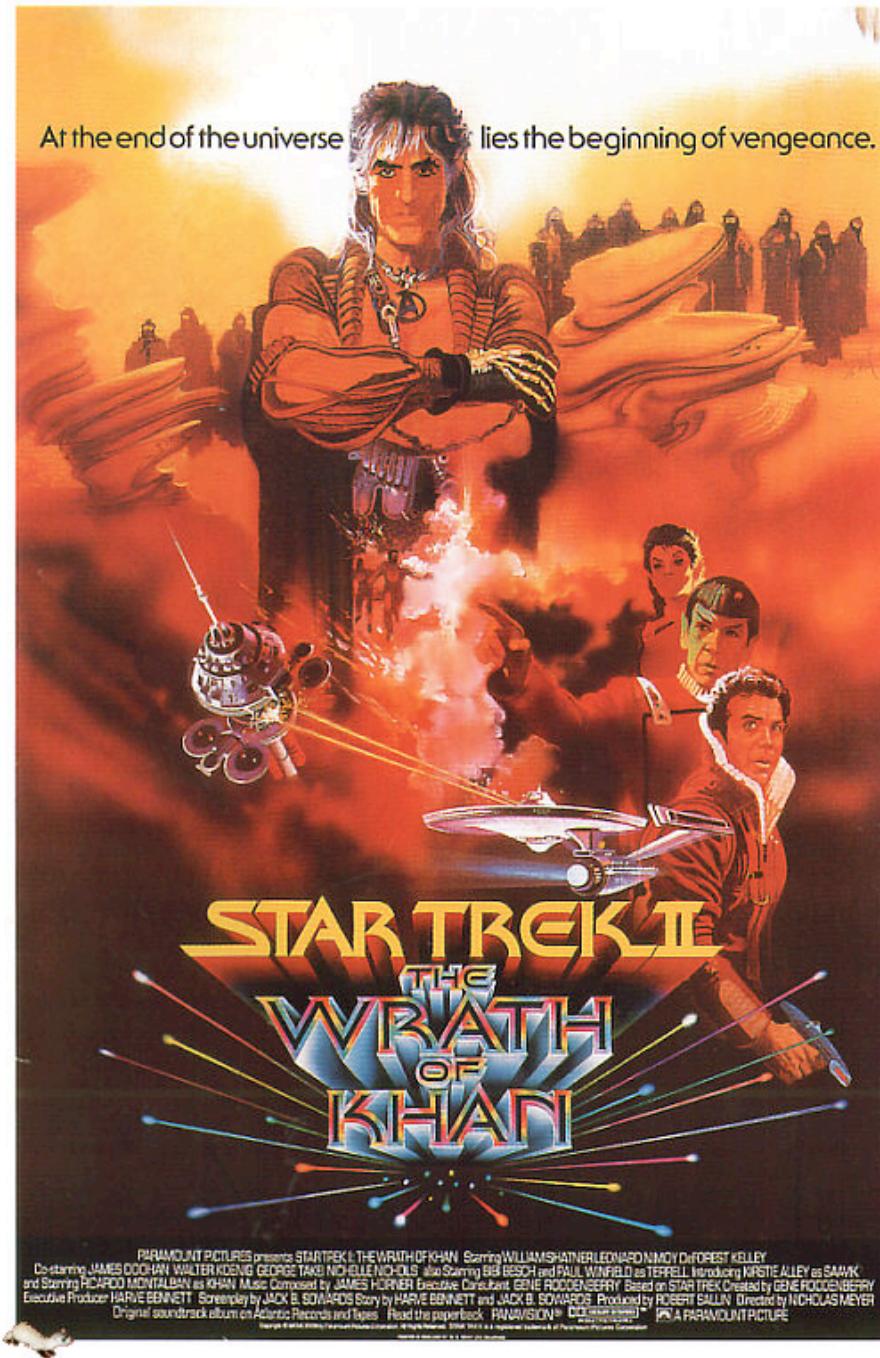
# Introduction

- Most important of procedural methods
- Used to model
  - Natural phenomena
    - Clouds
    - Terrain
    - Plants
  - Crowd Scenes
  - Real physical processes

# Particle Systems – A Technique for Modeling a Class of Fuzzy Objects

William T. Reeves, Lucasfilm  
ACM Transactions on Graphics, 1983

Presented in CS536 by Walt Mankowski  
19 October 2006





# Genesis Project Demo





# Prior to Khan

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State of the art in computer animation:

- Static geometric objects
- Primitive surface elements (e.g. polygons)
- Deterministic
- Simple affine transformations



# Prior to Khan

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State of the art in computer animation:

- Smooth surfaces
- Well-defined
- Shiny surfaces



# What about “fuzzy” objects?

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- Clouds, smoke, water, fire
- Irregular, ill-defined, complex
- Dynamic
- Fluid



# Representation of “fuzzy” objects

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- Cloud of primitive particles that define its volume
- Particles are born, move, change form, and die over time
- Stochastic processes are basis for all dynamics



# Advantages of particles

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- Simpler than polygons
- Easier and faster to compute
- Easier to motion-blur
- Model is procedural and random
- Less human modeling required
- Particle systems are “alive”
- More natural way to represent dynamic motion than polygons



## High level view

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- System is collection of many tiny particles (25,000–750,000 in sample frames)
- Over time, particles are added to the system, move and change, and then are removed from the system



## For each frame...

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- New particles are “born” into the system
- Each new particle is assigned its own individual, random attributes
- Any particles that are too old “die” and are removed from the system
- Remaining particles move and are transformed according to their attributes
- Image is rendered to frame buffer



# Particle generation

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- For entire frame
  - $N_{Parts_f} = MeanParts_f + Rand() * VarParts_f$
- For smaller screen area
  - $N_{Parts_f} = (MeanParts_{saf} + Rand() * VarParts_{saf}) * ScreenArea$
- Uniformly distributed over a range
- Dynamically change density → Vary mean over all frames
  - $MeanParts_f = InitMeanParts + DeltaMeanParts * (f - f_0)$



# Particle attributes

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For each new particle, must determine:

- initial position
- initial velocity
- initial size
- initial color
- initial transparency
- shape
- lifetime

# Initial position

- sphere
- circle
- rectangle
- etc.

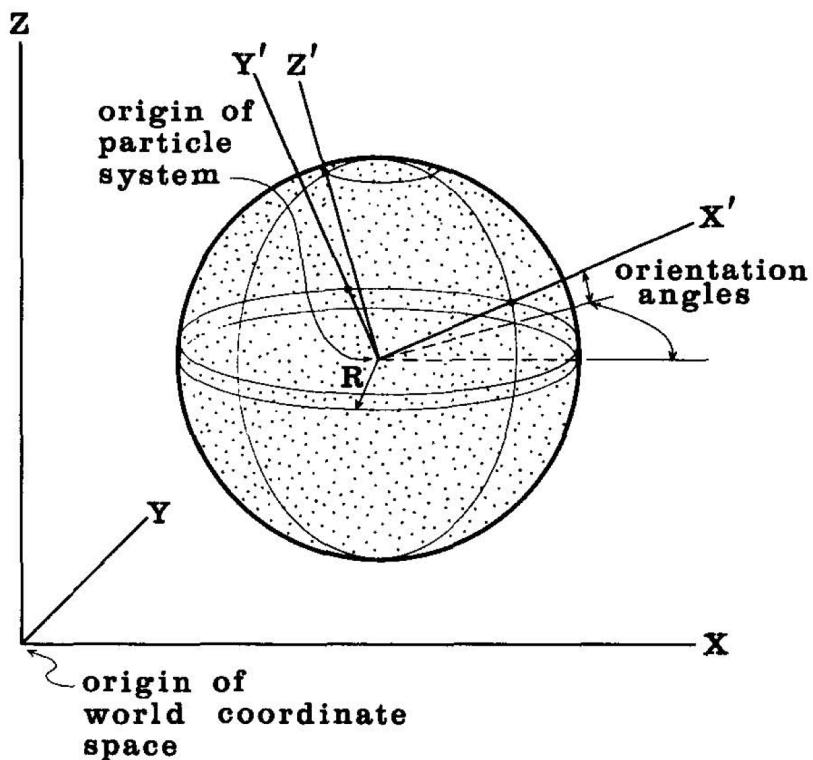


Fig. 1. Typical particle system with spherical generation shape.



# Initial settings

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- Initial speed is uniformly distributed:
  - $\text{InitialSpeed} = \text{MeanSpeed} + \text{Rand}() * \text{VarSpeed}$
- Color, size, transparency set the same way

# Particle dynamics

- To move a particle, just add its velocity vector to its position.
- Can simulate gravity by using an acceleration factor.
- Color, transparency, size controlled by similar rate-of-change parameters.
- Everything is **completely deterministic**.

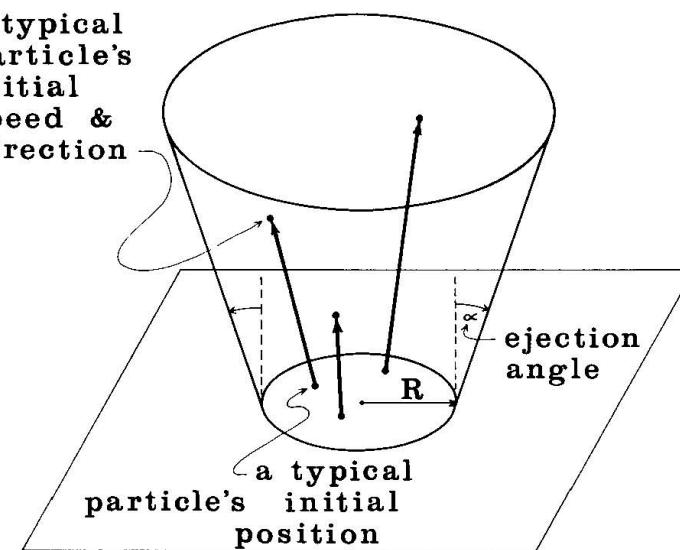


Fig. 3. Form of an explosion-like particle system.



# Particle extinction

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- Remove particles that exceed lifetime
- Can also remove particles that stray outside a window



# Particle rendering

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Two simplifying assumptions:

- Particles don't interact with other objects
  - They're composited in later
  - Added “glow” on planet from the fire with an additional light source
- Each particle is a point light source
  - No hidden surfaces
  - Each particle only contributes to the color of the pixel it covers

# Particle hierarchy

- Maintain a tree of particle systems.
- Allows more global control over system.
- In Genesis Demo:
  - Top level was point of impact
  - Particles it generates are themselves other particle systems.

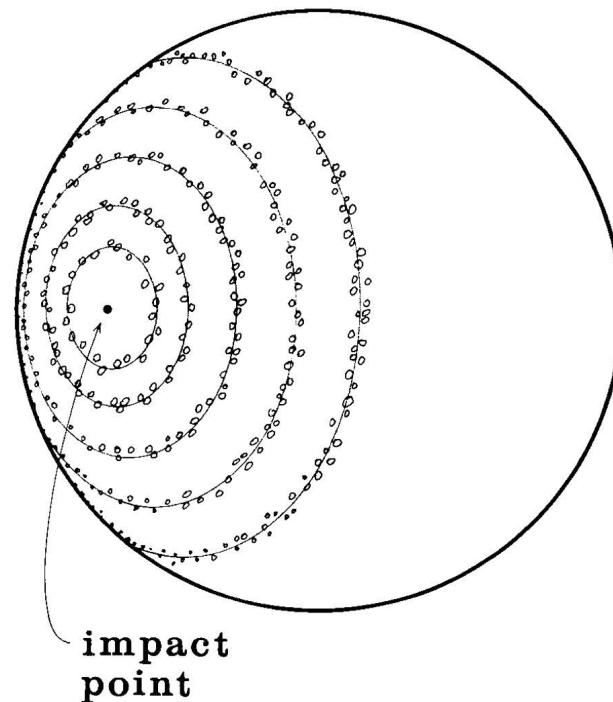


Fig. 2. Distribution of particle systems on the planet's surface.



## Motion blur

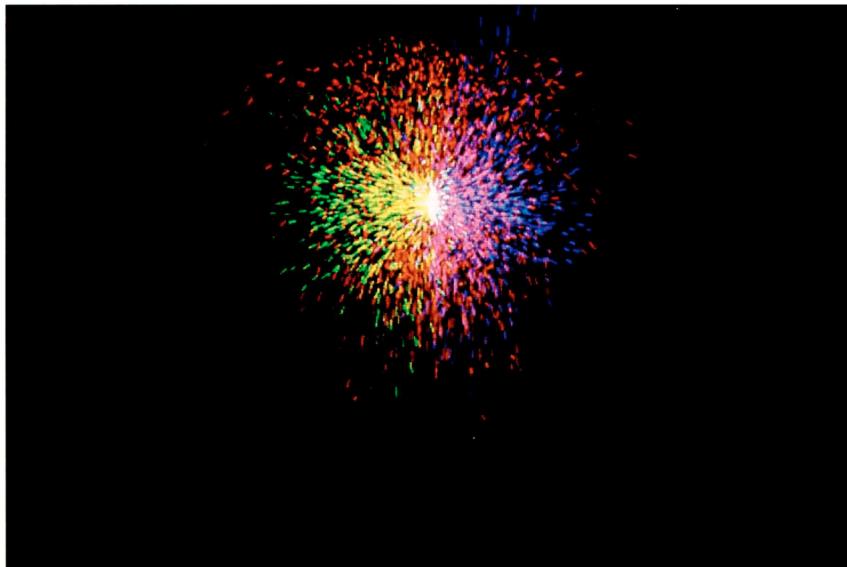
---

- Computer animation up to then produced one static image at an instant in time
- This can lead to aliasing and strobing
- They motion-blurred the particles:
  - Calculate position at start of frame and half way through
  - Draw an antialiased line between points
- Stills look blurry but video looks better



- Go to videos
  - Making of the Genesis Sequence from Star Trek II
  - Particle Dreams
    - Karl Sims

# Other applications



Fireworks



Grass



# Future directions (circa 1982)

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- Clouds
  - difficult to model
  - can throw shadows on themselves
  - very large number of particles
- Water
- More sophisticated motion-blur



# Newtonian Particle

- Particle system is a set of particles
- Each particle is an ideal point mass
- Six degrees of freedom
  - Position
  - Velocity
- Each particle obeys Newtons' law

$$\mathbf{f} = \mathbf{ma}$$



# Particle Equations

$$\mathbf{p}_i = (x_i, y_i, z_i)$$

$$\mathbf{v}_i = \mathbf{dp}_i / dt = \dot{\mathbf{p}}_i = (dx_i / dt, dy_i / dt, dz_i / dt)$$

$$m \dot{\mathbf{v}}_i = \mathbf{f}_i$$

Hard part is defining force vector



# Force Vector

- Independent Particles
  - Gravity
  - Wind forces
  - $O(n)$  calculation
- Coupled Particles  $O(n)$ 
  - Meshes
  - Spring-Mass Systems
- Coupled Particles  $O(n^2)$ 
  - Attractive and repulsive forces



# Solution of Particle Systems

```
float time, delta state[6n], force[3n];
state = initial_state();
for(time = t0; time<final_time;
                time+=delta) {
    force = force_function(state, time);
    state = ode(force, state, time,
                delta);
    render(state, time)
}
```

# Simple Forces

- Consider force on particle i

$$\mathbf{f}_i = \mathbf{f}_i(\mathbf{p}_i, \mathbf{v}_i)$$

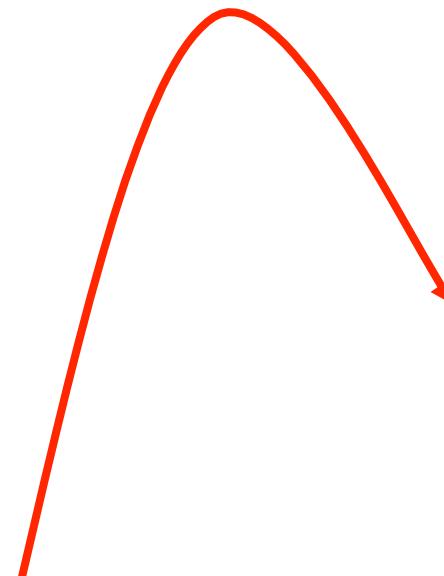
- Gravity  $\mathbf{f}_i = \mathbf{g}$

$$\mathbf{g}_i = (0, -g, 0)$$

- Wind forces

- Drag

- $\mathbf{f}(-\mathbf{v}_i)$



$$\mathbf{p}_i(t_0), \mathbf{v}_i(t_0)$$

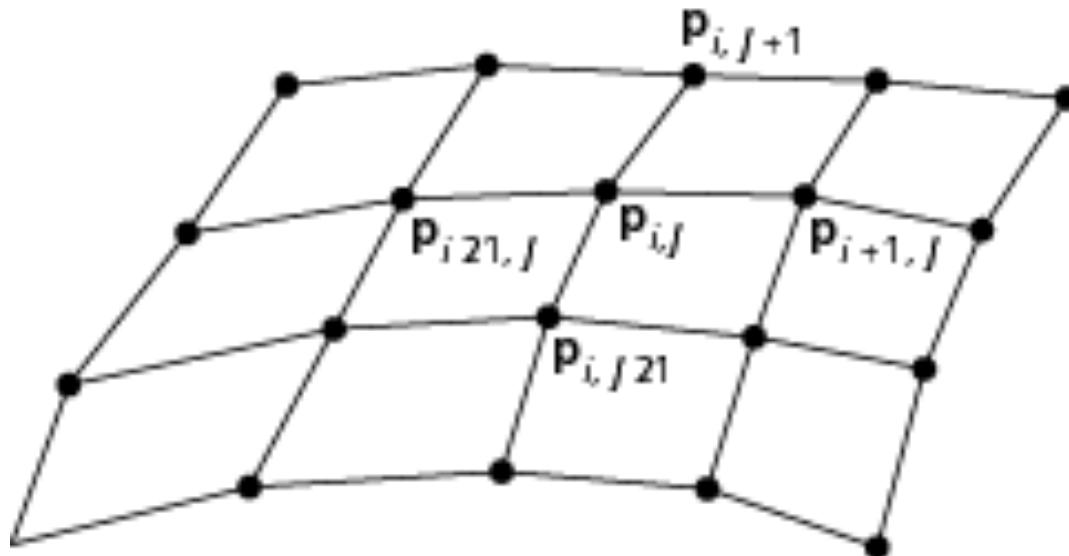


# Particle System

```
uniform vec3 init_vel;  
uniform float g, m, t;  
uniform mat4 Projection, ModelView;  
in vPosition;  
void main(){  
    vec3 object_pos;  
    object_pos.x = vPosition.x + vel.x*t;  
    object_pos.y = vPosition.y + vel.y*t  
        - g/(2.0*m)*t*t;  
    object_pos.z = vPosition.z + vel.z*t;  
    gl_Position = Projection*  
        ModelView*vec4(object_pos,1);  
}
```

# Meshes

- Connect each particle to its closest neighbors
  - $O(n)$  force calculation
- Use spring-mass system



# Spring Forces

- Assume each particle has unit mass and is connected to its neighbor(s) by a spring
- Hooke's law: force proportional to distance ( $d = \|p - q\|$ ) between the points





# Hooke's Law

- Let  $s$  be the distance when there is no force

$$\mathbf{f} = -k_s(|\mathbf{d}| - s) \frac{\mathbf{d}}{|\mathbf{d}|}$$

$k_s$  is the spring constant

$\mathbf{d}/|\mathbf{d}|$  is a unit vector pointed from  $p$  to  $q$

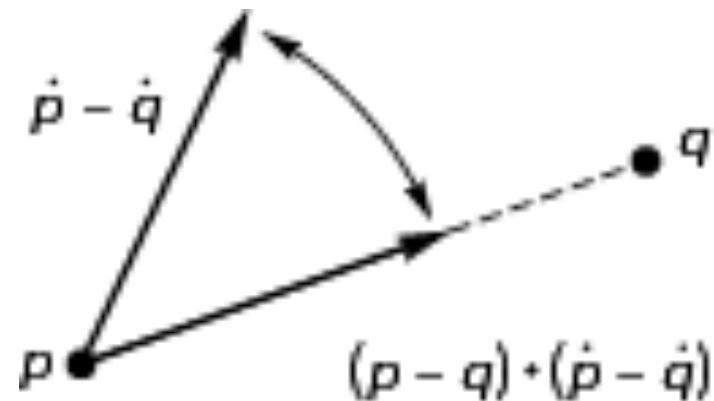
- Each interior point in mesh has four forces applied to it

# Spring Damping

- A pure spring-mass will oscillate forever
- Must add a damping term

$$\mathbf{f} = -(k_s(|\mathbf{d}| - s) + k_d \dot{\mathbf{d}} \cdot \mathbf{d} / |\mathbf{d}|) \mathbf{d} / |\mathbf{d}|$$

- Must project velocity





# Repulsion

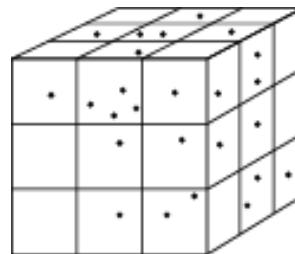
- Inverse square law

$$\mathbf{f} = k_r \mathbf{d} / |\mathbf{d}|^2$$

- General case requires  $O(n^2)$  calculation
- In most problems, the drop off is such that not many particles contribute to the forces on any given particle
- Sorting problem: is it  $O(n \log n)$ ?

# Boxes

- Spatial subdivision technique
- Divide space into boxes
- Particle can only interact with particles in its box or the neighboring boxes
- Must update which box a particle belongs to after each time step



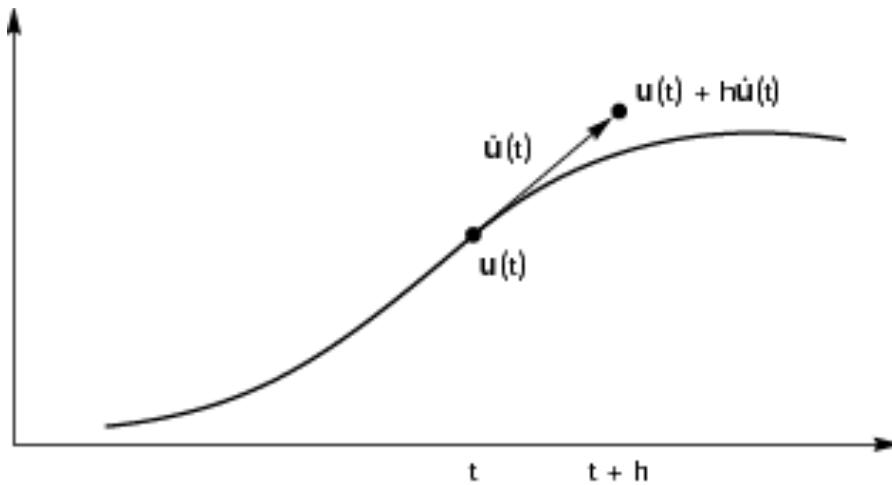


# Linked Lists

- Each particle maintains a linked list of its neighbors
- Update data structure at each time step
- Must amortize cost of building the data structures initially

# Solution of ODEs

- Particle system has  $6n$  ordinary differential equations
- Write set as  $\mathbf{du}/dt = \mathbf{g}(\mathbf{u}, t)$
- Solve by approximations using Taylor's Thm





# Euler's Method

$$\mathbf{u}(t + h) \approx \mathbf{u}(t) + h \frac{d\mathbf{u}}{dt} = \mathbf{u}(t) + hg(\mathbf{u}, t)$$

Per step error is  $O(h^2)$

Require one force evaluation per time step

Problem is numerical instability

Depends on step size



# Improved Euler

$$\mathbf{u}(t + h) \approx \mathbf{u}(t) + h/2(\mathbf{g}(\mathbf{u}, t) + \mathbf{g}(\mathbf{u}, t+h))$$

Per step error is  $O(h^3)$

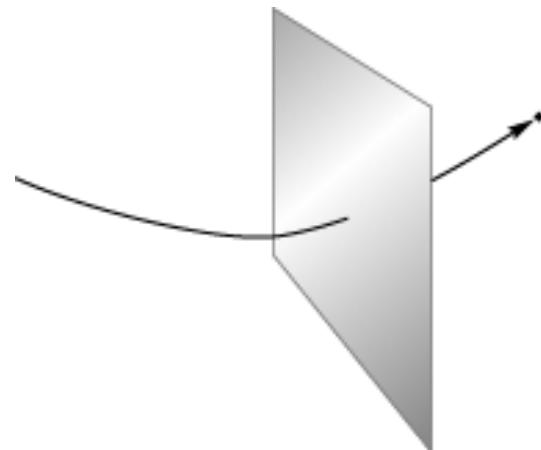
Also allows for larger step sizes

But requires two function evaluations per step

Also known as Runge-Kutta method of order 2

# Constraints

- Easy in computer graphics to ignore physical reality
- Surfaces are virtual
- Must detect collisions separately if we want exact solution
- Can approximate with repulsive forces



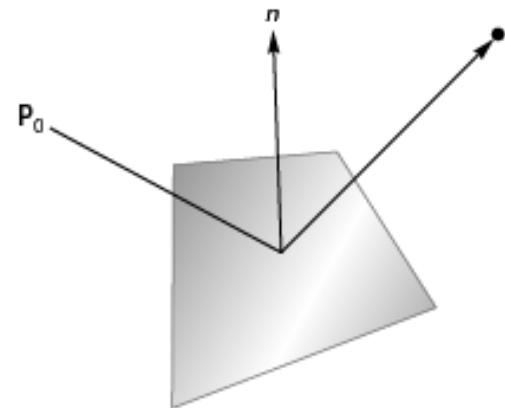
# Collisions

Once we detect a collision, we can calculate new path

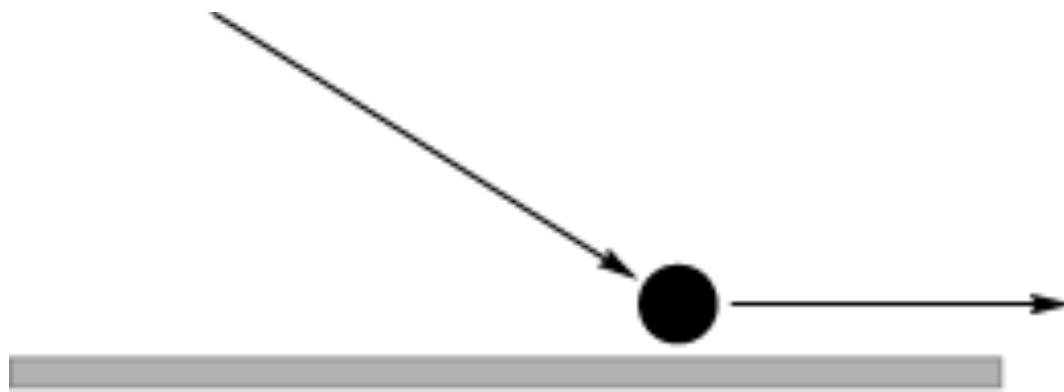
Use coefficient of restitution

Reflect vertical component

May have to use partial time step



# Contact Interactions



- Sliding contact
- Normal force that prevents particle from penetrating surface
- Friction force in the tangential direction



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# Flocks, Herds, and Schools: A Distributed Behavioral Model

Craig W. Reynolds

SIGGRAPH 1987

Presented by Duc Nguyen

November 15, 2007



# Simulated Flocks of “Boids”

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- Simulate motion of flocks of birds or other animals following individual behaviors
- Extends particle systems
- More realistic (and easier!) than scripting the paths of the individual birds

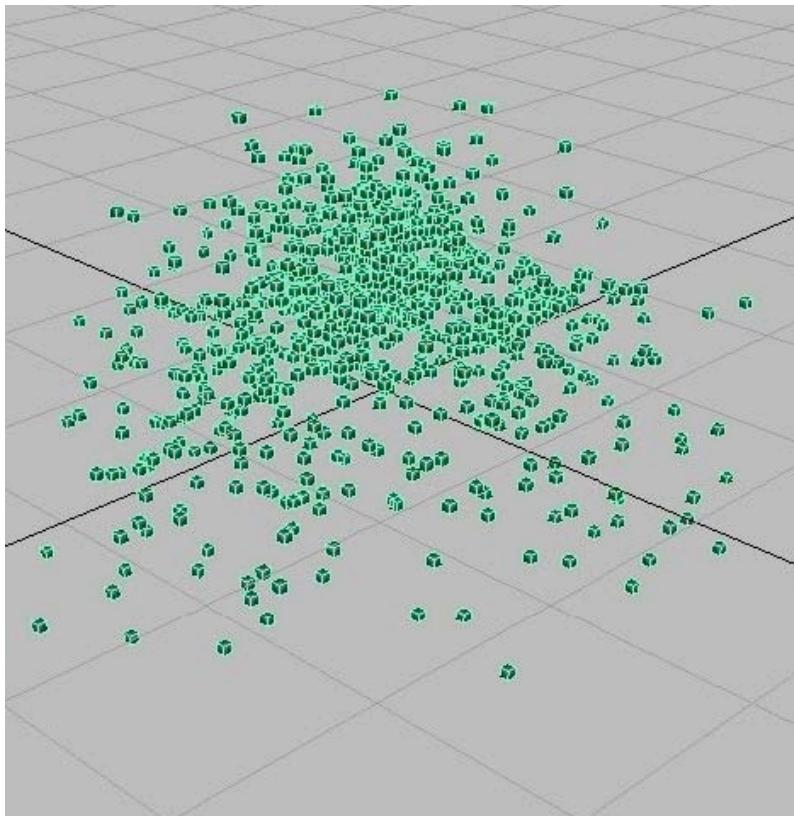


## Prior work

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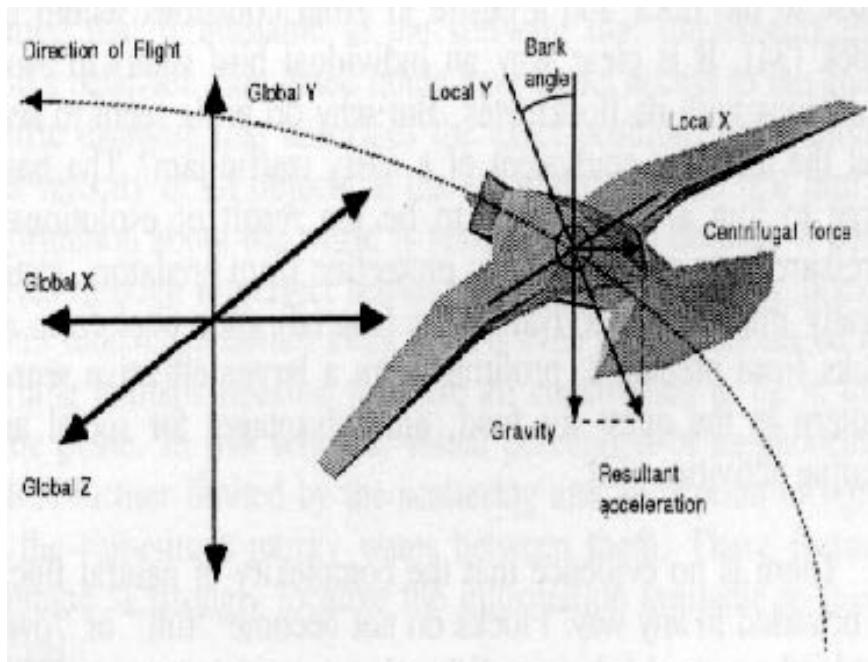
- *Eurythmy* (1985)
  - Flocking simulations used force-fields around each bird and around each object.
  - The animator sets the initial positions, headings, and velocities.
- Other behavioral control work by Karl Sims was based around groups of single objects, not flocks.

# Particle Systems



- Particle System is a collection of large number of particles each with their own behaviors
  - At the time of the paper, they were used to model fire, smoke, clouds and ocean waves.
- A Boid is a generalization of a particle
  - Each boid follows a flight model

# Boid Model



- Local coordinate system
- Direction of flight
- Bank angle
- Affected by
  - Gravity
  - Centrifugal force

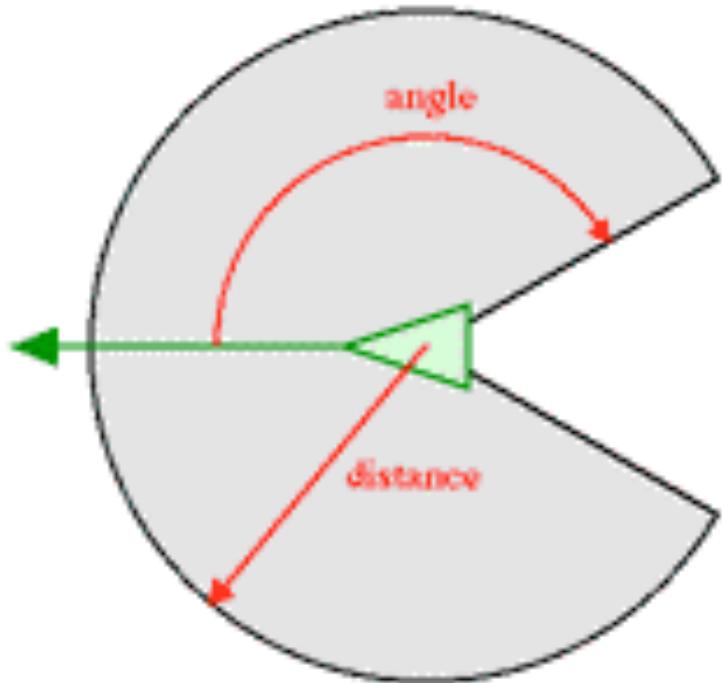


# Boid Simulation

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- Create a boid model that supports flight
- Add individual behaviors that interact with each other:
  - Separation
  - Alignment
  - Cohesion
  - Obstacle Avoidance
- Boids must be able to arbitrate conflicting behaviors as well

# Boid Neighborhood

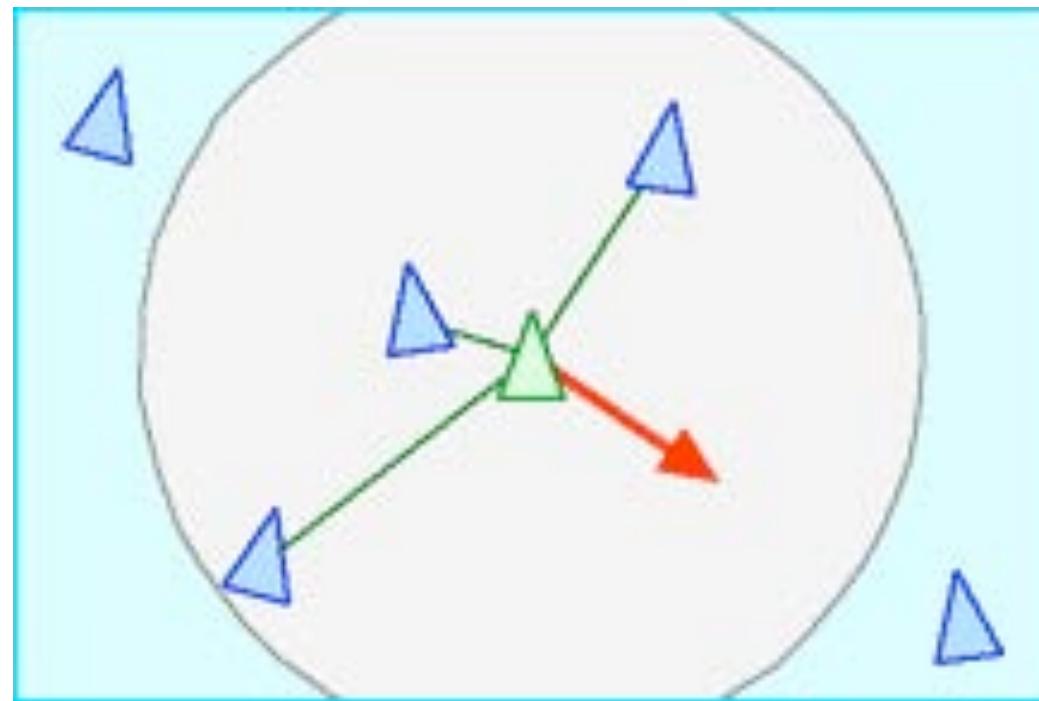


Only sense boids

- within a certain distance
- that are in “front” of you

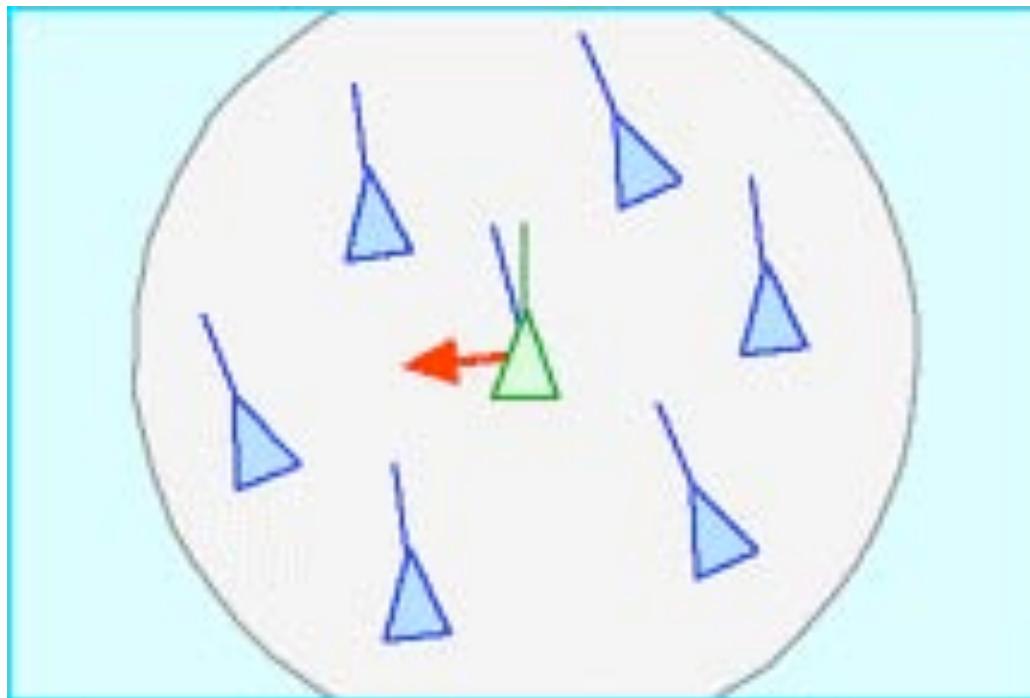
# Boid Behavior: Separation

- Keep a certain distance from neighboring boids



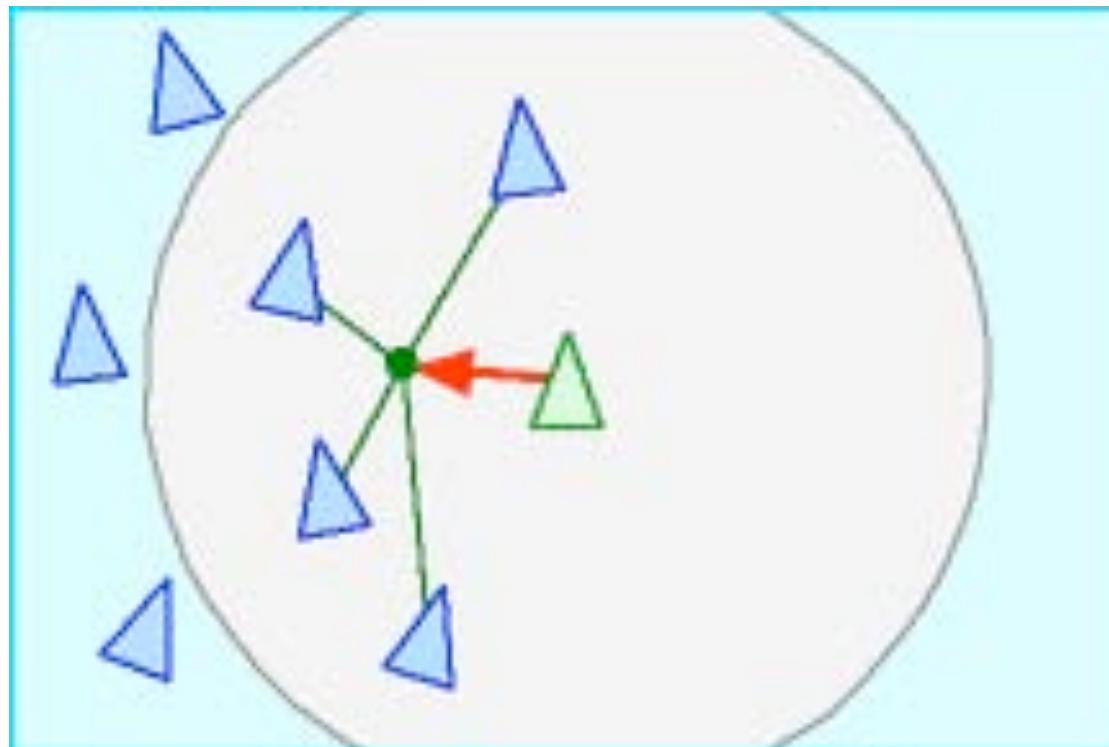
# Boid Behavior: Alignment

- Steer toward the general heading of neighboring boids



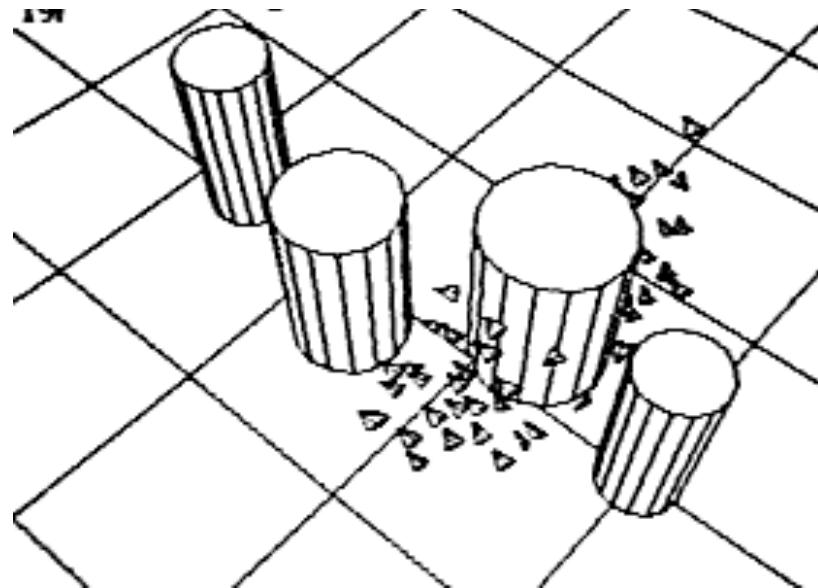
# Boid Behavior: Cohesion

- Move toward the average position of neighboring boids



# Avoiding Obstacles

- Independently model shape for rendering and collision avoidance
- Boids model uses a *steer-to-avoid* as opposed to force-field approach



## Putting it all together

- Simulated flocking behavior that mimics real life flocks, schools and herds
- Combined with a low priority goal seeking results in a scripted path of the flock





- Go to videos
  - Boids demo
  - Stanley & Stella in Breaking the Ice



# Summary

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- Boids is a model of group motion of flocks based on actions of individual boids
- Boid simulation is an example of emergent behavior
  - Simple local rules lead to complex global behavior
- This paper (from 1987!) has spawned the field of collective behavior modeling/analysis in physics, biology, artificial life and computer science



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# Fractals

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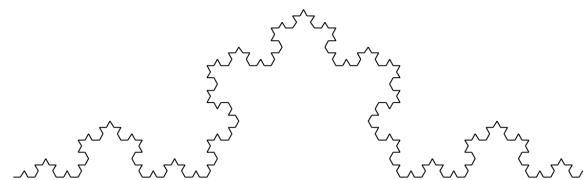
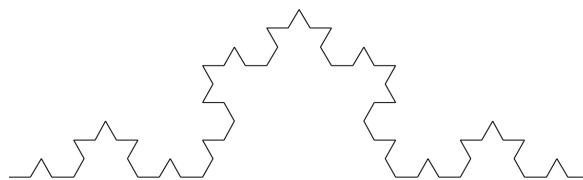
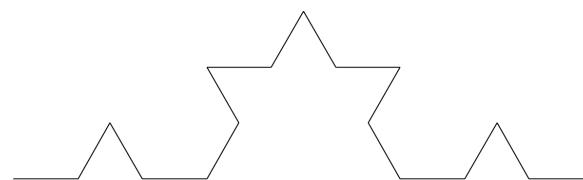
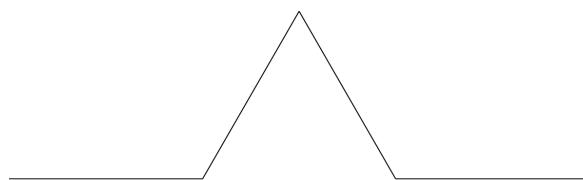
# Overview

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- Fractal representations
- Algorithms for drawing fractals
- Mandelbrot Set
- Brownian Motion

# Introduction to Fractals

- Term Fractal coined by Benoit Mandelbrot
- Properties of fractal:
  - Self-similarity (small portion looks like the whole object )
  - Have fractional dimensions
  - Non-differentiable
  - Infinite length

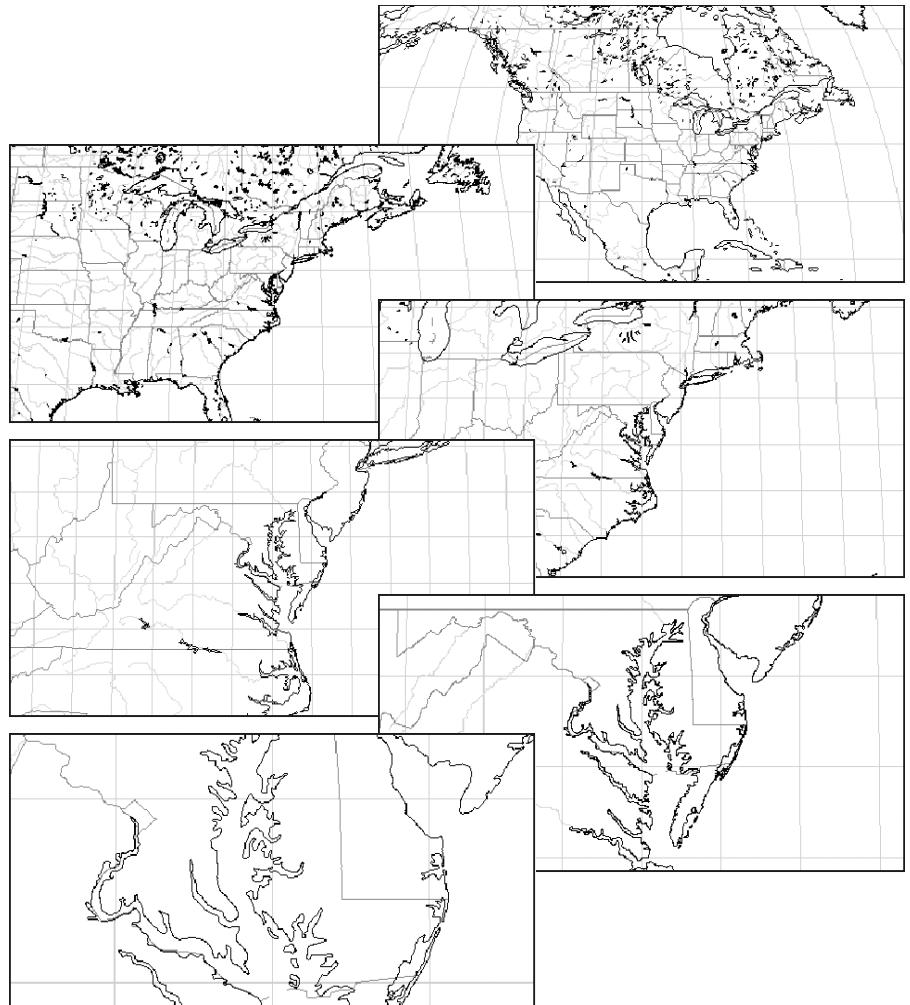


Construction of Koch Curve

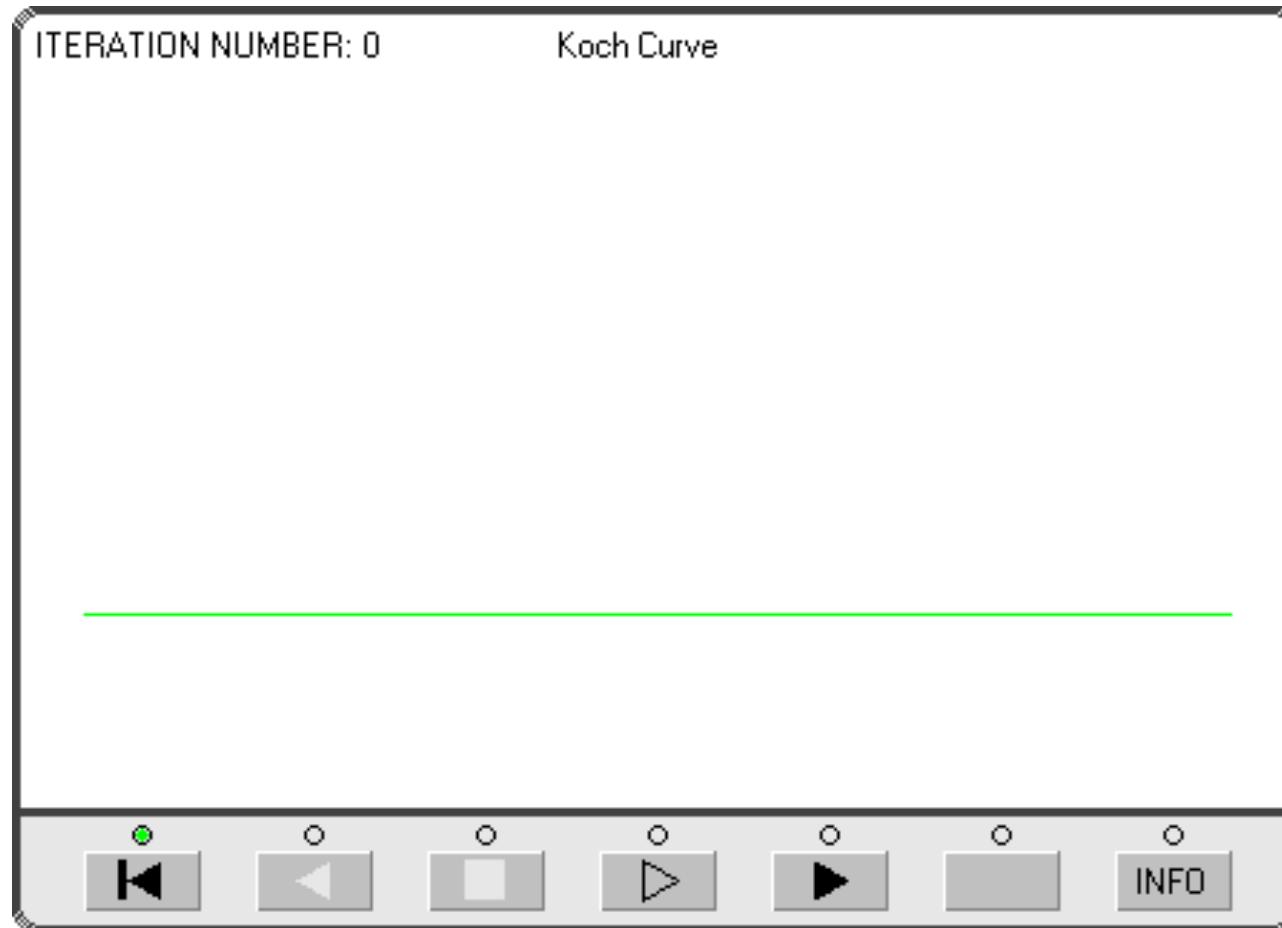
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# Length of the Fractals

- Lewis Richardson (1961) measured length of coastlines
- Total length increase as measurement stick reduced
- Does this mean coastlines are infinite in length?



# Koch Curve

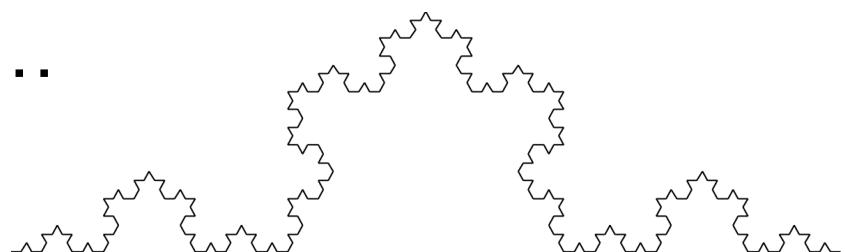


# Properties of Koch Curve

- Has no tangent at any point
- Length of the curve at iteration  $n$  is  $(4/3)^n$

Step	Num of segments	Length of segment	Total length
0	1	1	1
1	4	0.33333333	1.33333333
2	16	0.11111111	1.7777778
100	$1.04858 \times 10^{60}$	$1.94033 \times 10^{-48}$	$3.11798 \times 10^{12}$

- Koch curve is  $1.26186 \dots$  dimensional object





# Fractal Dimensions

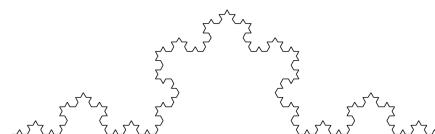
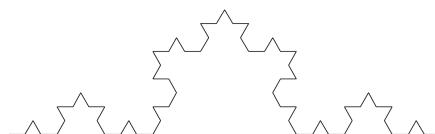
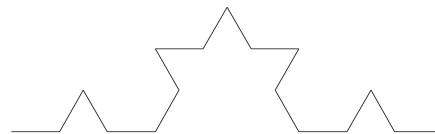
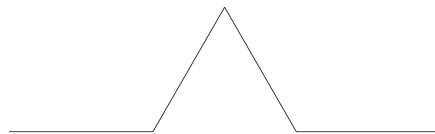
- 1D line of unit length divided into  $n$  segments looks like the whole line scaled by  $1/n$
- 2D square of unit area divided into  $n$  segments looks like the whole square scaled by  $1/n^{1/2}$ 
  - i.e. 4 segments, each one 1/2 the size of the original
- Divide an object into  $n$  segments where each segment is scaled by  $1/s$
- $s = n^{1/d}$      $d = \log(n)/\log(s)$      $2 = \log(4)/\log(2)$
- The square is divided into 4 parts and each part is 1/2 the size of the original
- $d = \log(4)/\log(2) = 2$

# Fractal Dimensions

- $s = n^{1/d}$        $d = \log(n)/\log(s)$
- Koch curve divides line into 4 parts, each part is 1/3 the size of the original
- Therefore the dimension of the Koch curve is:

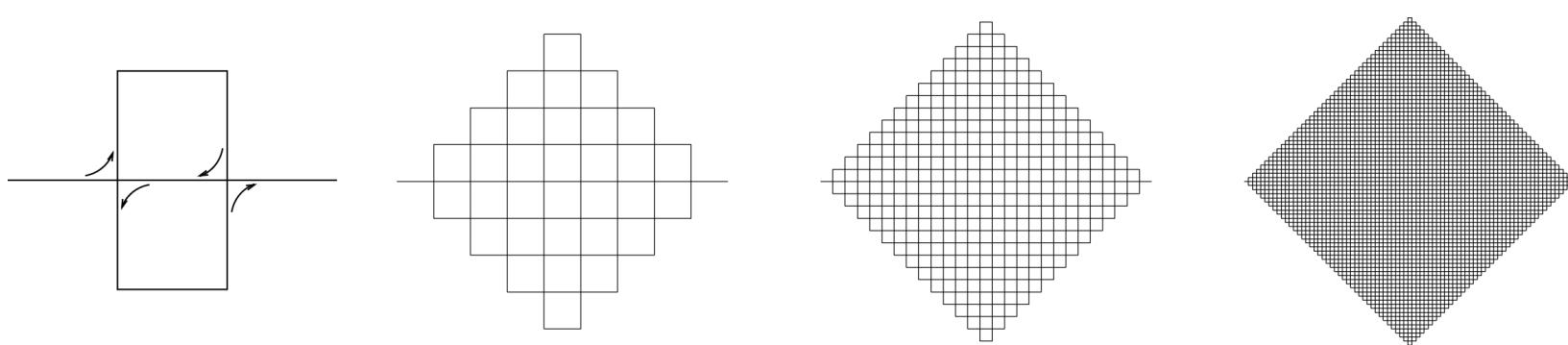
$$4^{\frac{1}{d}} = 3, \quad n^{1/d} = s$$

$$d = \frac{\log(4)}{\log(3)} = \frac{\log(n)}{\log(s)} = 1.26186 \dots$$



# Space Filling Fractals

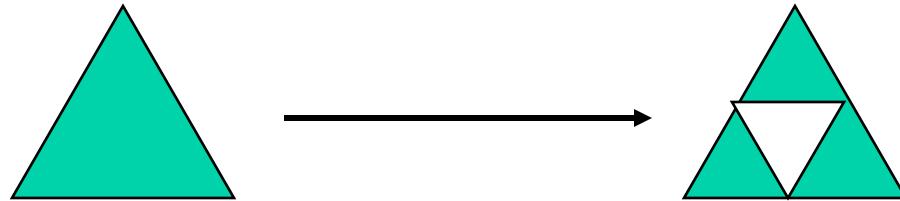
- Peano curve (1890)
- Fills a 2D region
- Fractal dimension - 2
- $s = n^{1/d}$    9 segments   1/3 original size  
 $d = \log(9)/\log(3) = 2$



Construction of Peano Curve

# Sierpinski Gasket

Rule based:



Repeat n times. As  $n \rightarrow \infty$

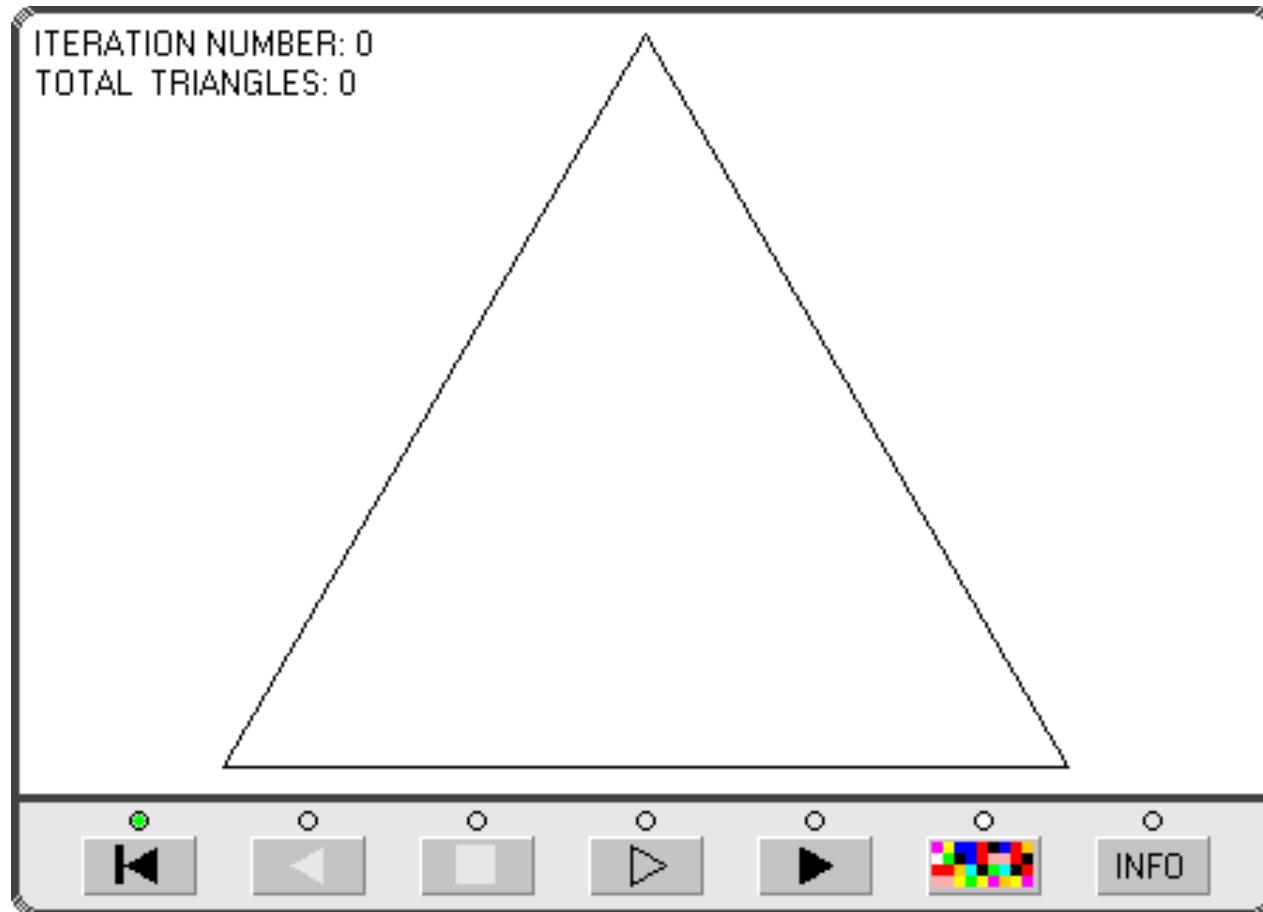
Area  $\rightarrow 0$

Perimeter  $\rightarrow \infty$

Not a normal geometric object



# Sierpinski Gasket





# Examples

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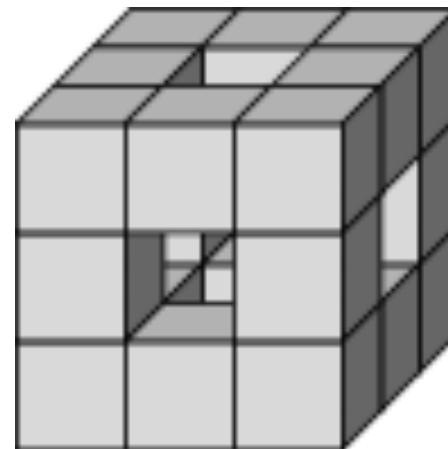
- Koch Curve
  - Scale by 3 each time
  - Create 4 new objects
  - $d = \ln 4 / \ln 3 = 1.26186$
- Sierpinski gasket
  - Scale by
  - Create 3 new objects
  - $d = \ln 3 / \ln 4 = 1.58496$

# Volumetric Examples

$$d = \ln 4 / \ln 2 = 2$$

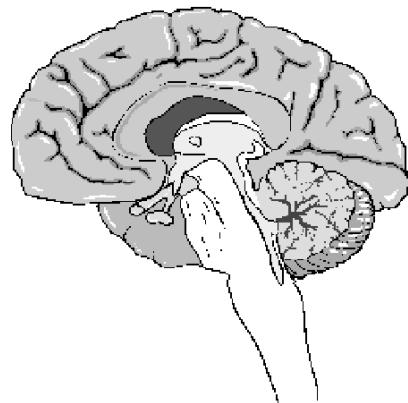


$$D = \ln 20 / \ln 3 = 2.72683$$

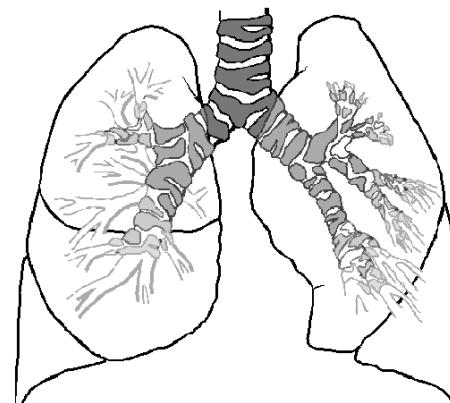


# Naturally Occurring Fractals

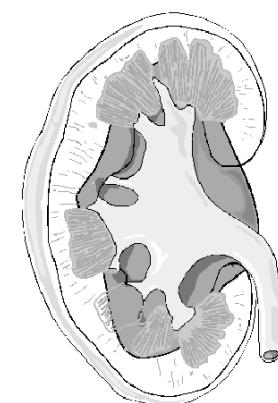
- Fractals often occur in nature
- All natural fractals are *grown*
- We can model natural objects with fractals



Brain



Lungs



Kidney

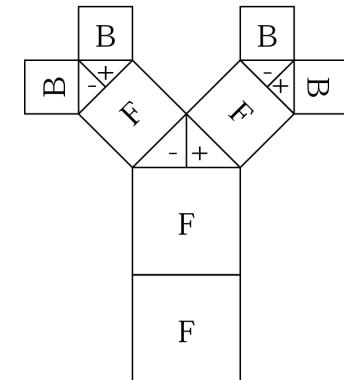
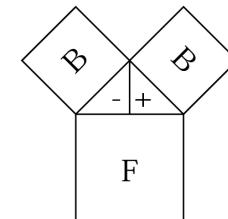
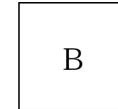
# Production Systems

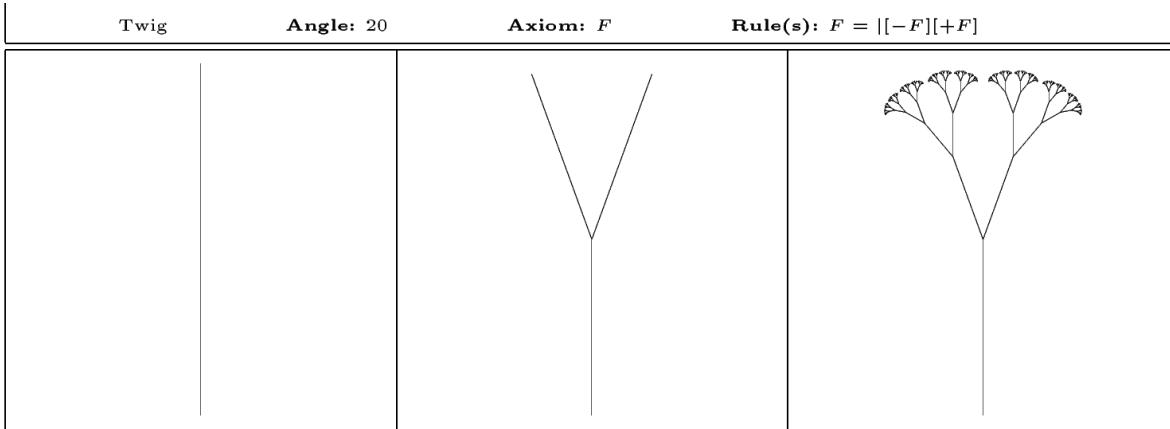
- In 1968 A. Lindenmayer developed a formalism describing plant growth
- Called L-system
- L-system consists of:
  - Seed cell (*axiom*)
  - Production rules

**Axiom:**  $B$

**Rules:**  $B \Rightarrow F[-B][+B]$

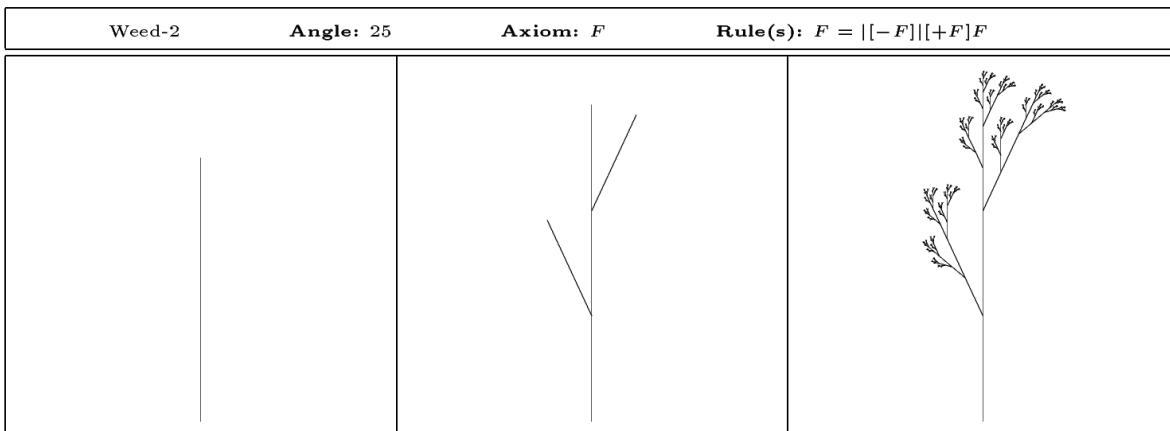
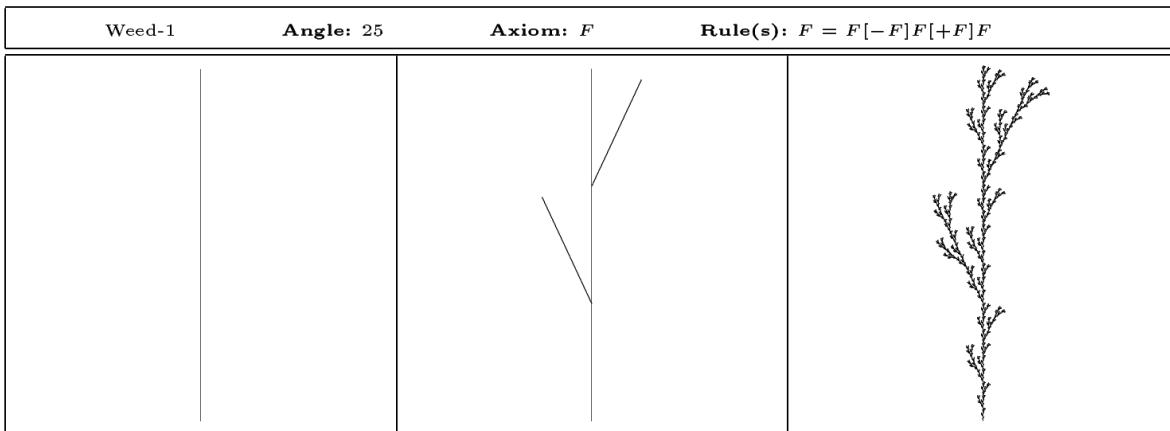
$F \Rightarrow FF$





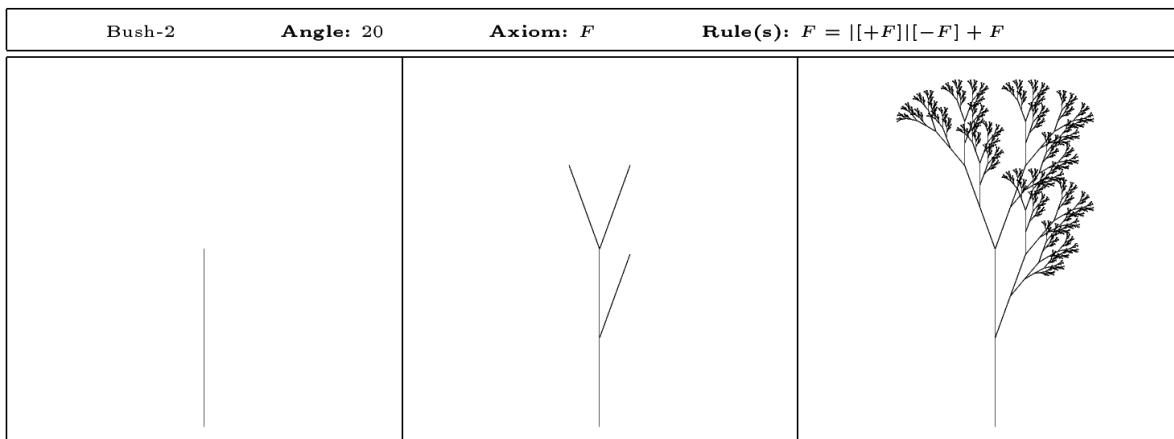
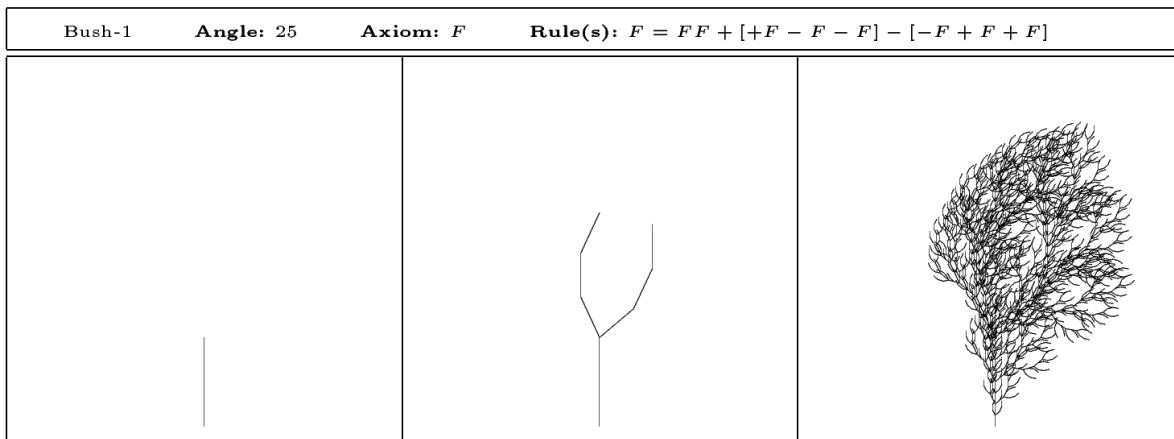
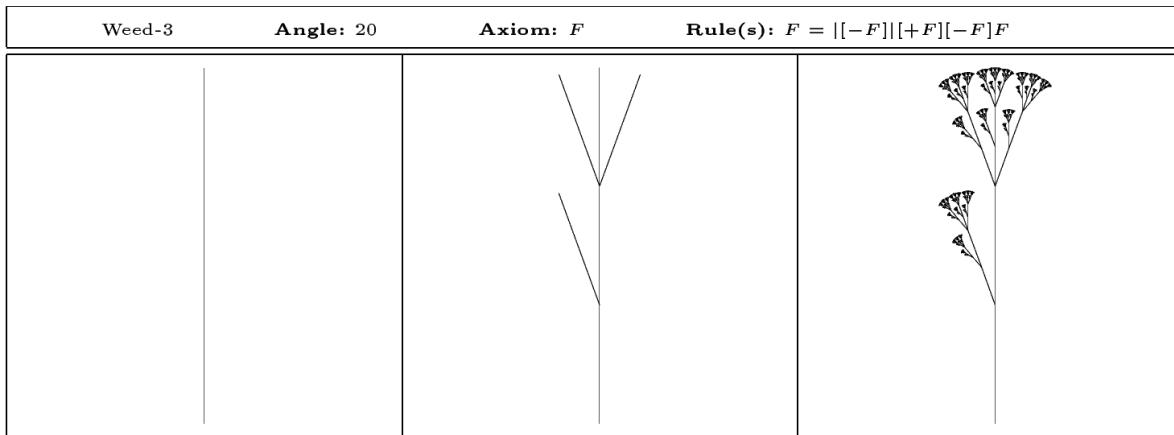
# Plantlike Fractals 1

---



# Plantlike Fractals 2

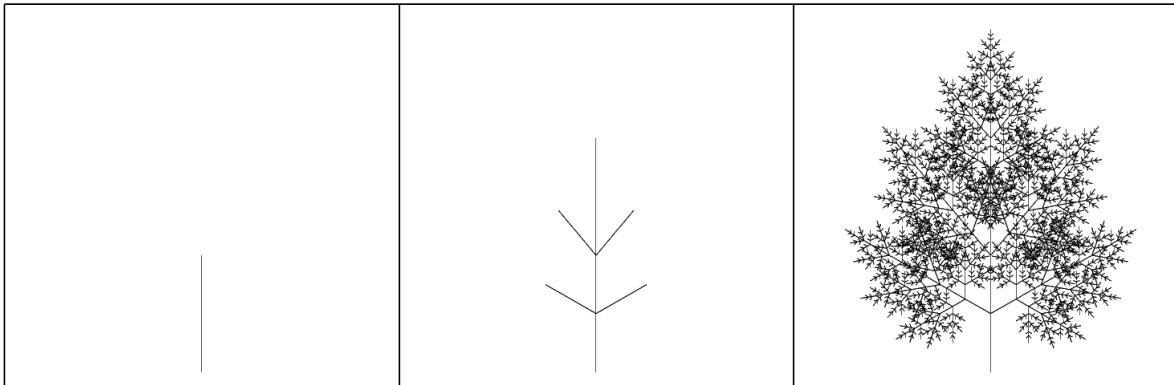
---



Tree-1

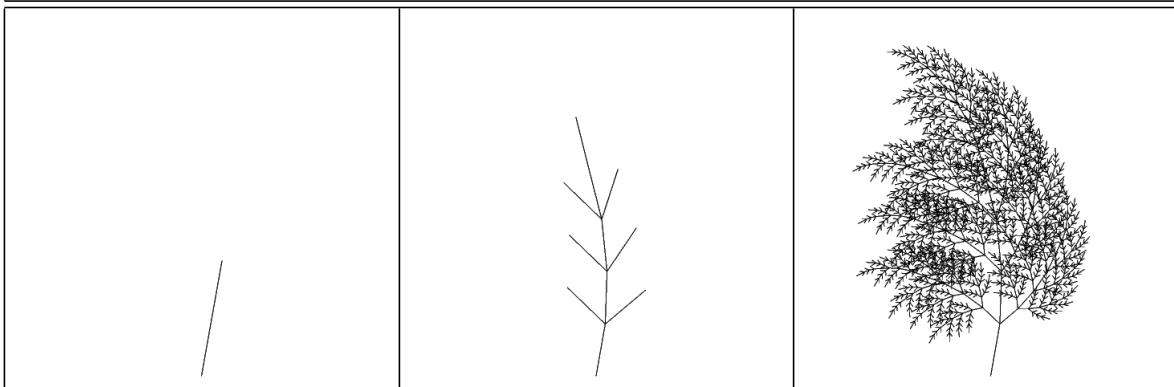
Angle: 20

Axiom: F

Rule(s):  $F = |[3 - F][3 + F]|[-F][++F]|F$ 

# Plantlike Fractals 3

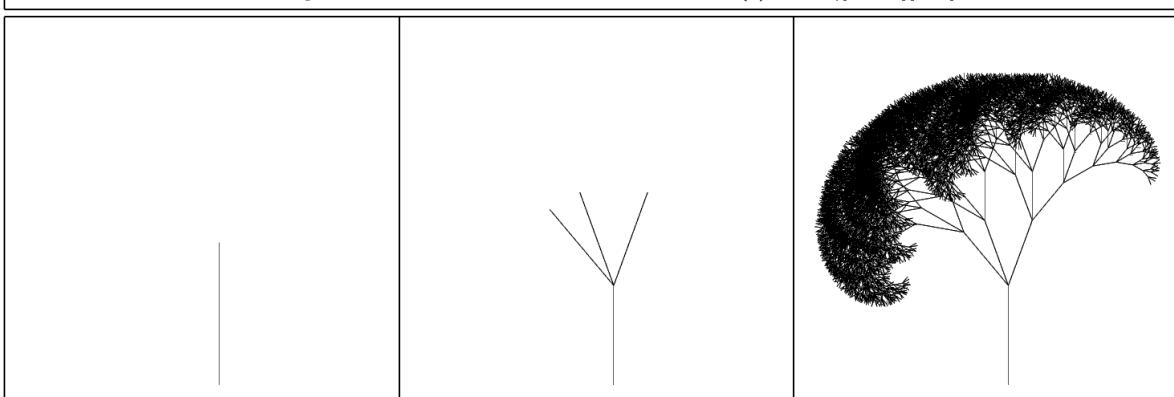
---

Tree-2 Angle: 8 Axiom: F Rule(s):  $F = |[5 + F][7 - F] - |[4 + F][6 - F] - |[3 + F][5 - F] - |F$ 

Tree-3

Angle: 20

Axiom: F

Rule(s):  $F = |[-F][+F] - F$ 

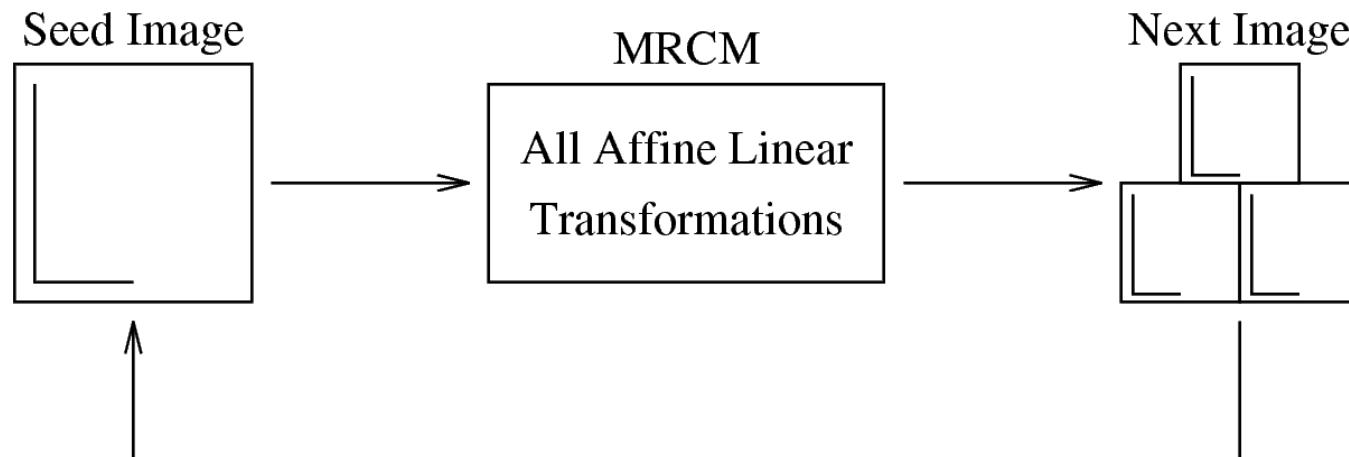


# Affine Transformation Fractals

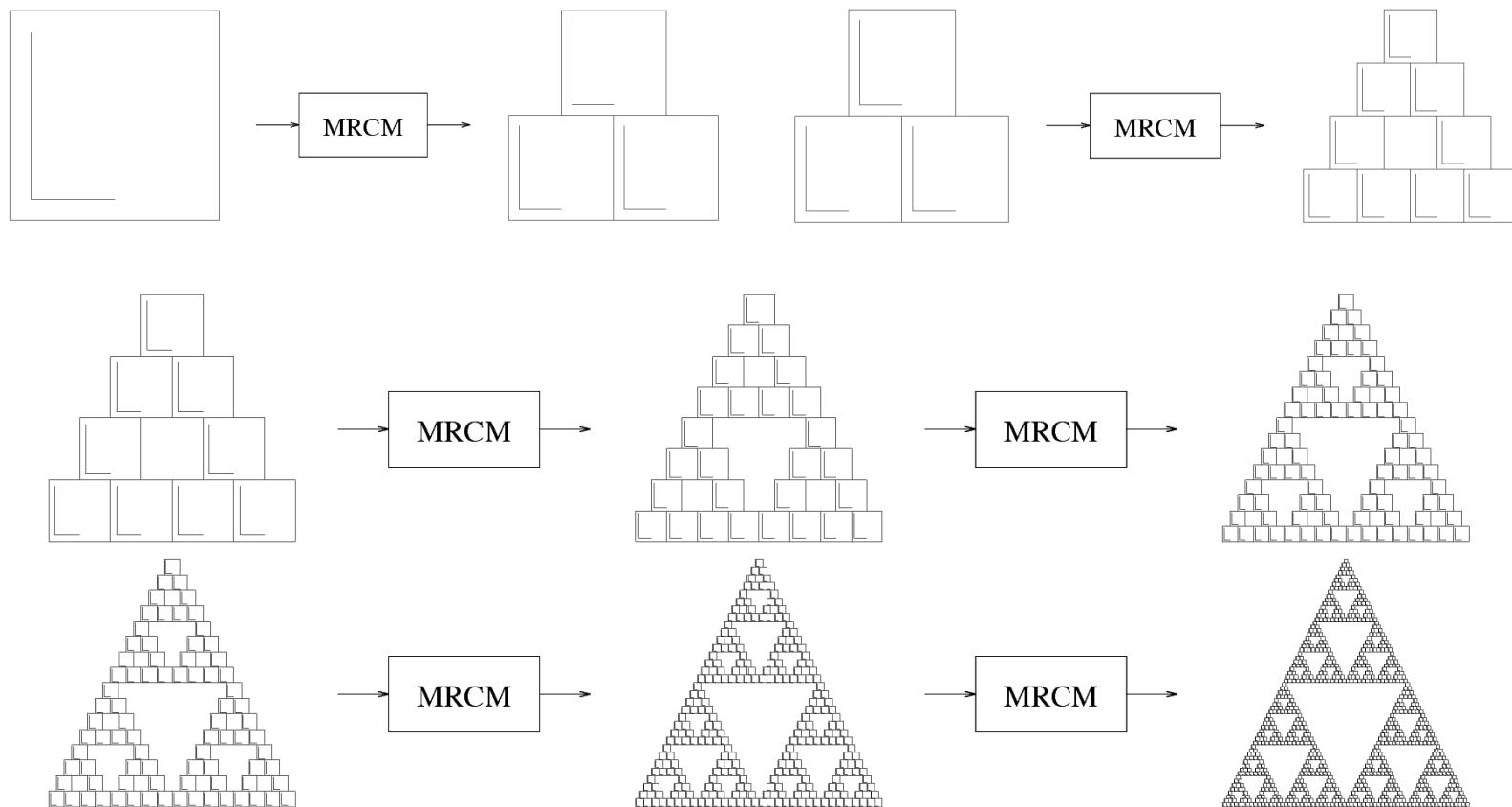
- Fractal often described to contain miniature versions of itself.
- We can use affine transformations to describe where these miniatures should be placed
  - Translation
  - Rotation
  - Scaling
- Self-affine fractals may have different scaling factors in different dimensions

# Multiple Reduction Copy Machine Algorithm

- Can be simulated with real copy machine
- Copy machine takes a seed image
- Creates several transformed copies of it as an output.
- Procedure is recursive

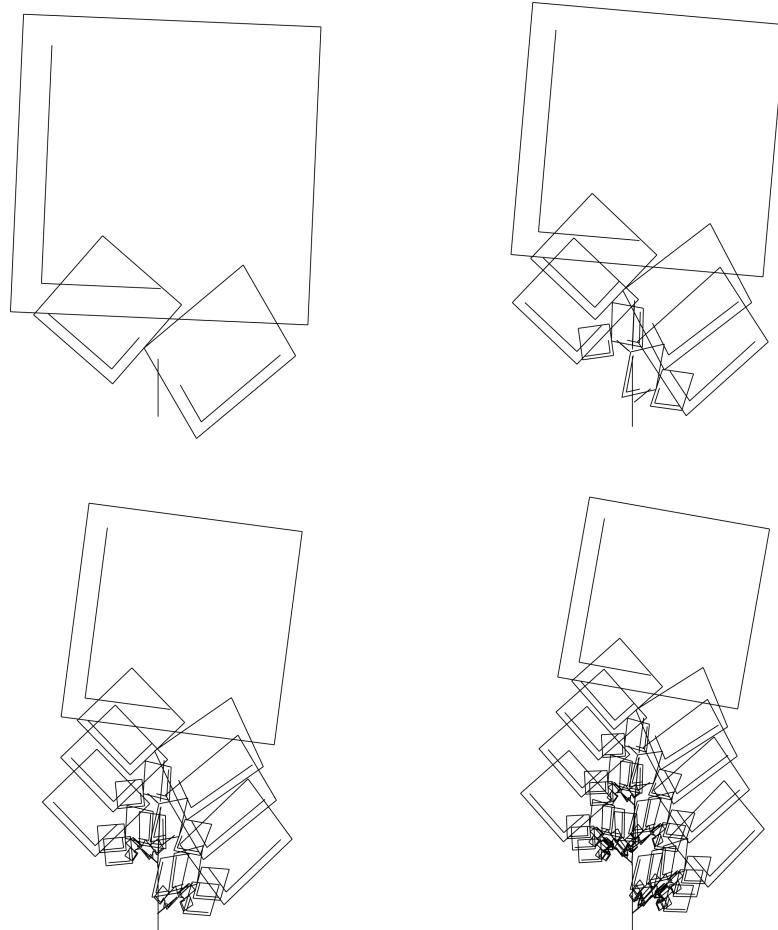


# MRCM Examples



# Problems with MRCM

- To get good image we must compute MRCM to large depth
- Computing time grows exponentially with depth
- Problem amplified when the reduction in size during one iteration is small

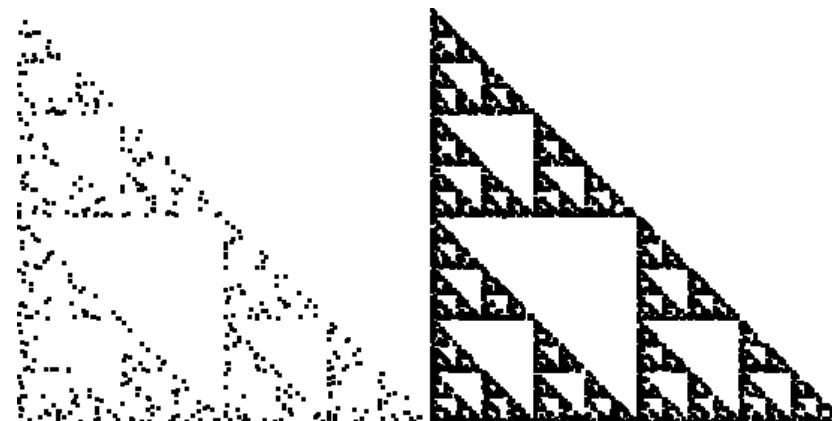


Fern Leaf  
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# Iterated Functional System

- Observations:

- Fractal consist entirely of points
- Randomly and recursively apply affine transformation  $L_i(p)$  to point  $p$
- Converges to a fractal

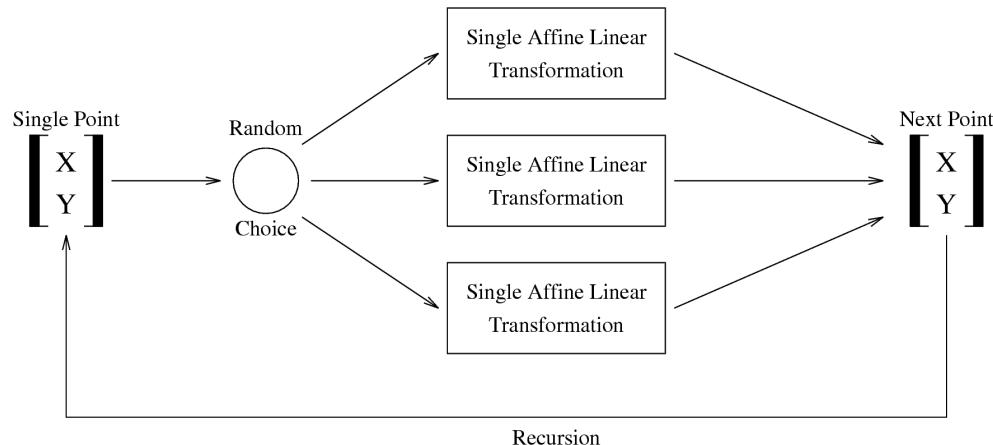


500 points

5000 points 85

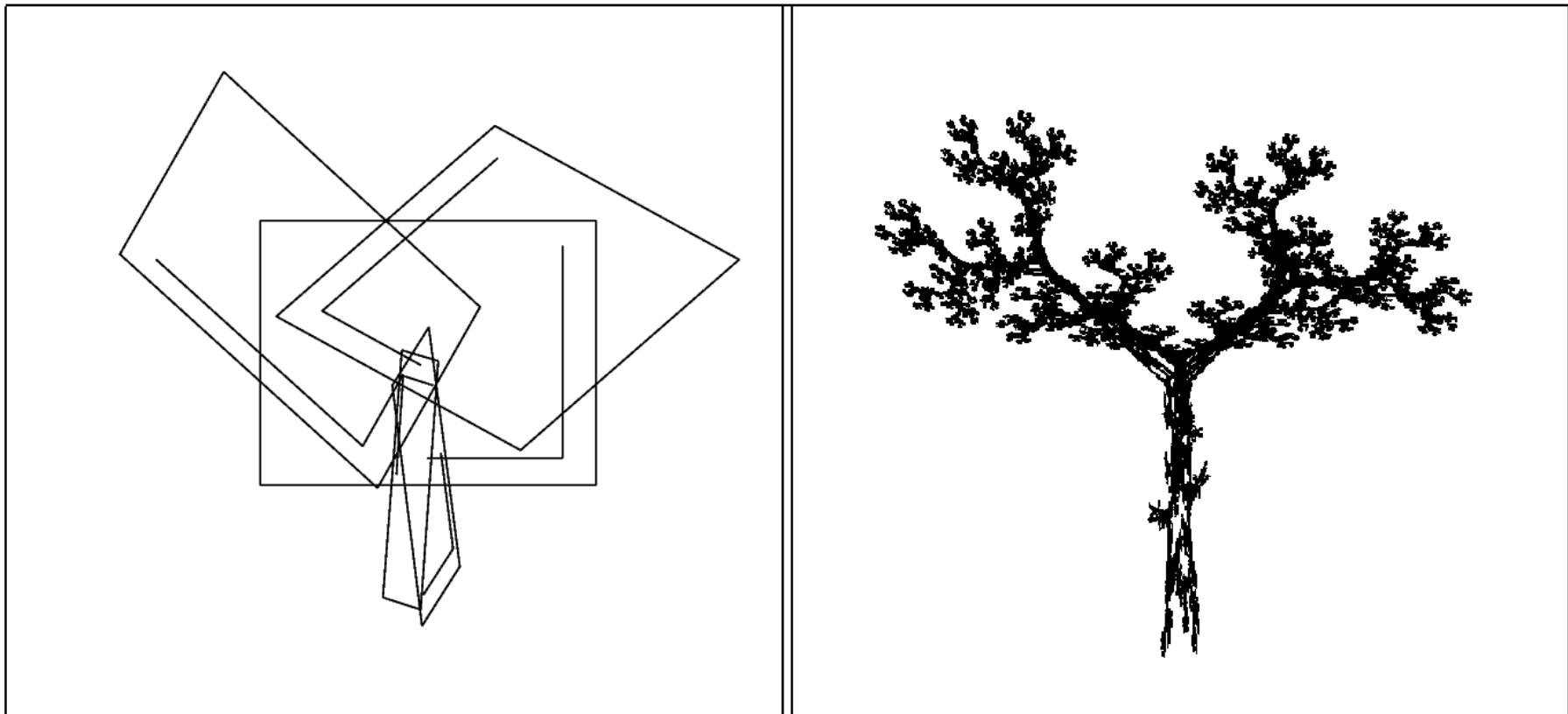
# IFS Algorithm

- Pick random point of the seed image
- Randomly pick one of the affine transformations
- Transform the point
- Continue recursively

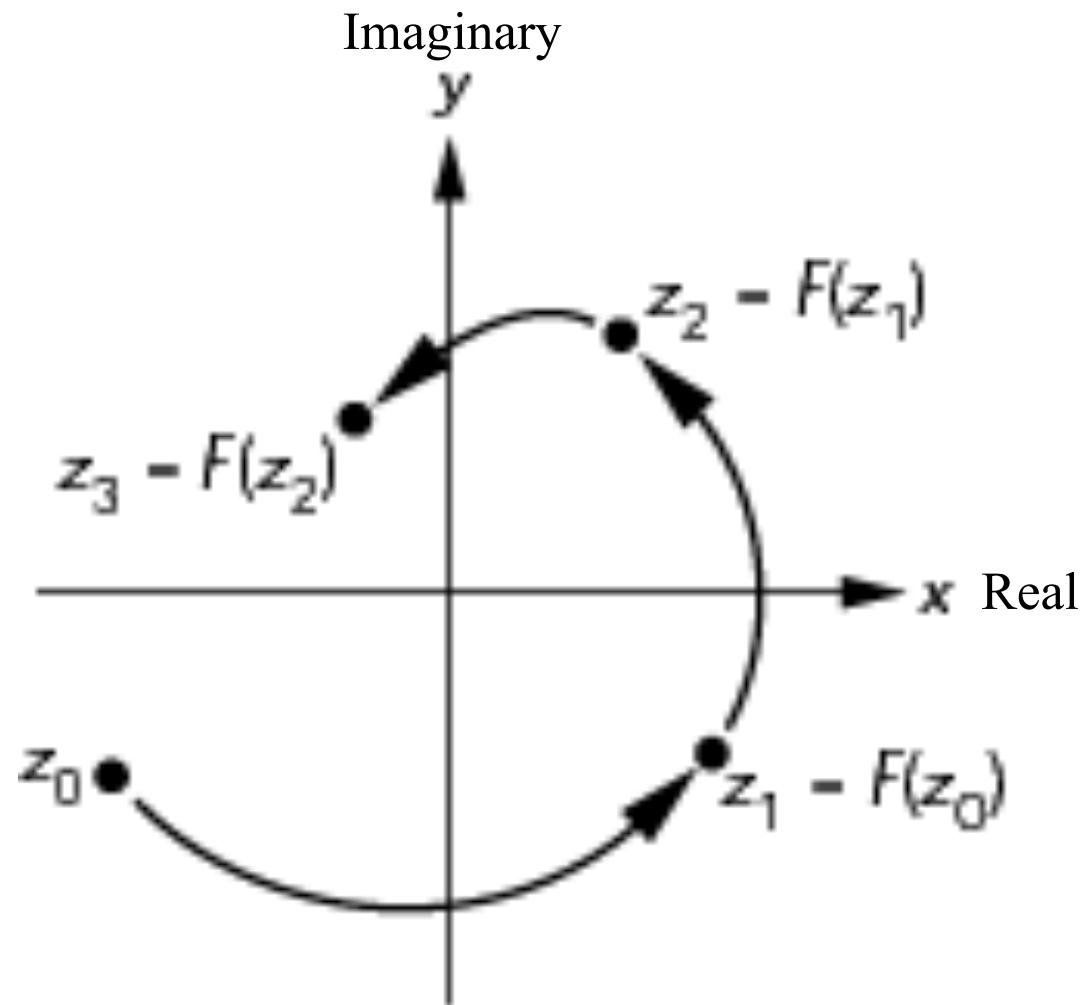


Fern Leaf

# IFS Generated Tree



# Iteration in the Complex Plane



# Mandelbrot Set

- $x_n = x_{n-1}^2 + c$  for some complex number  $c$ 
  - For some  $c$ ,  $x \rightarrow 0$  as  $n \rightarrow \infty$   
 $\in$  Mandelbrot Set
  - For some  $c$ ,  $x \rightarrow \infty$  as  $n \rightarrow \infty$
  - For others *neither*

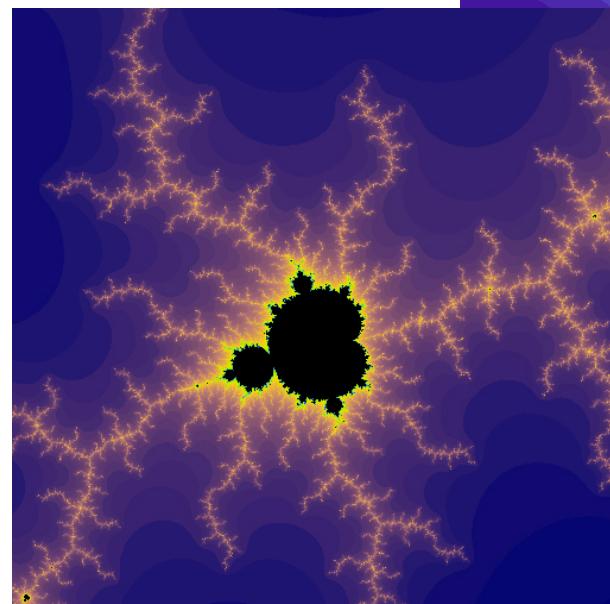
For each  $c$  in the complex plane

```

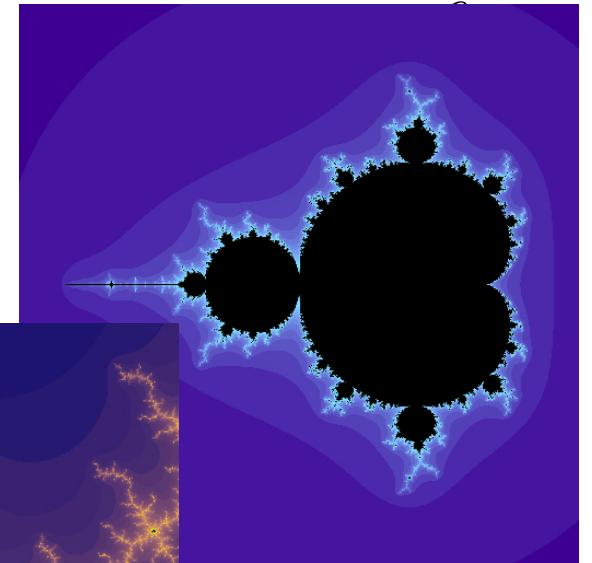
 $x_0 = 0$ 
for ( $n = 1$  to  $n_{max}$ ) {
     $x_n = x_{n-1}^2 + c$ 
    if ( $|x_n| > 2$ ) break
}

```

If ( $n < n_{max}$ ) color  $c$  = white  
else color  $c$  = black



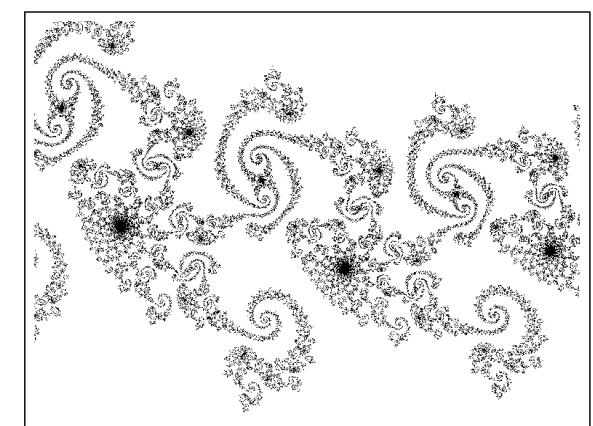
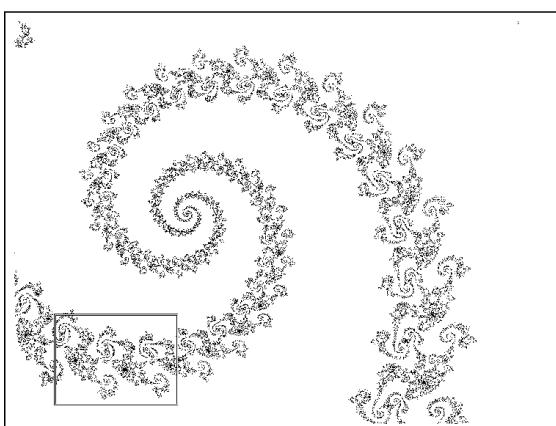
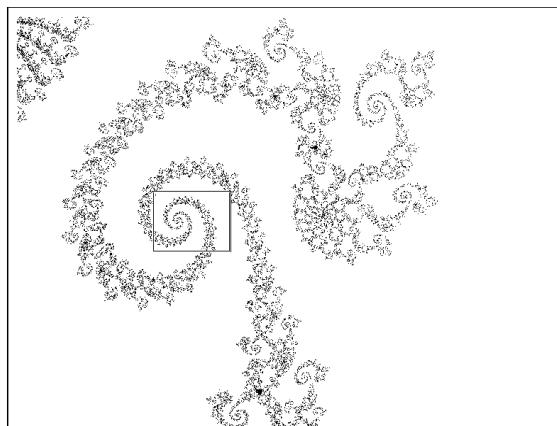
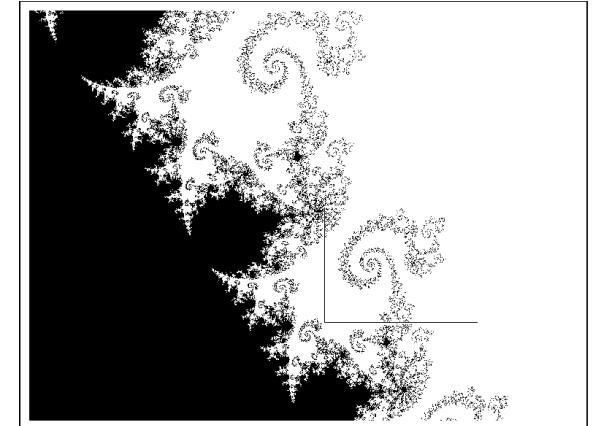
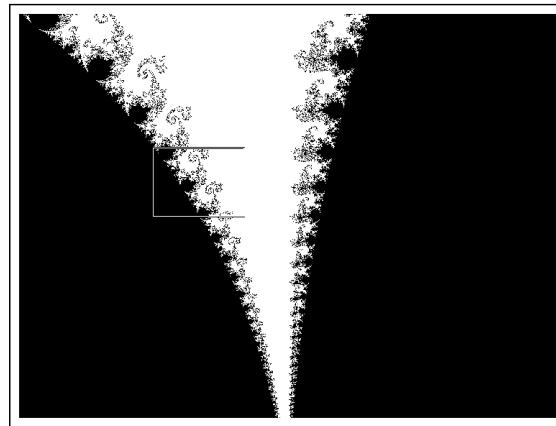
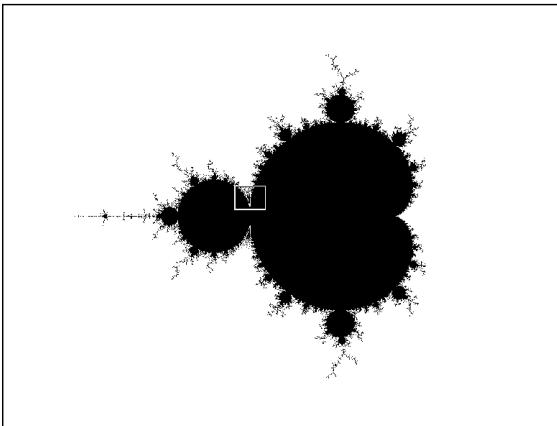
Magnified region



Mandelbrot Set

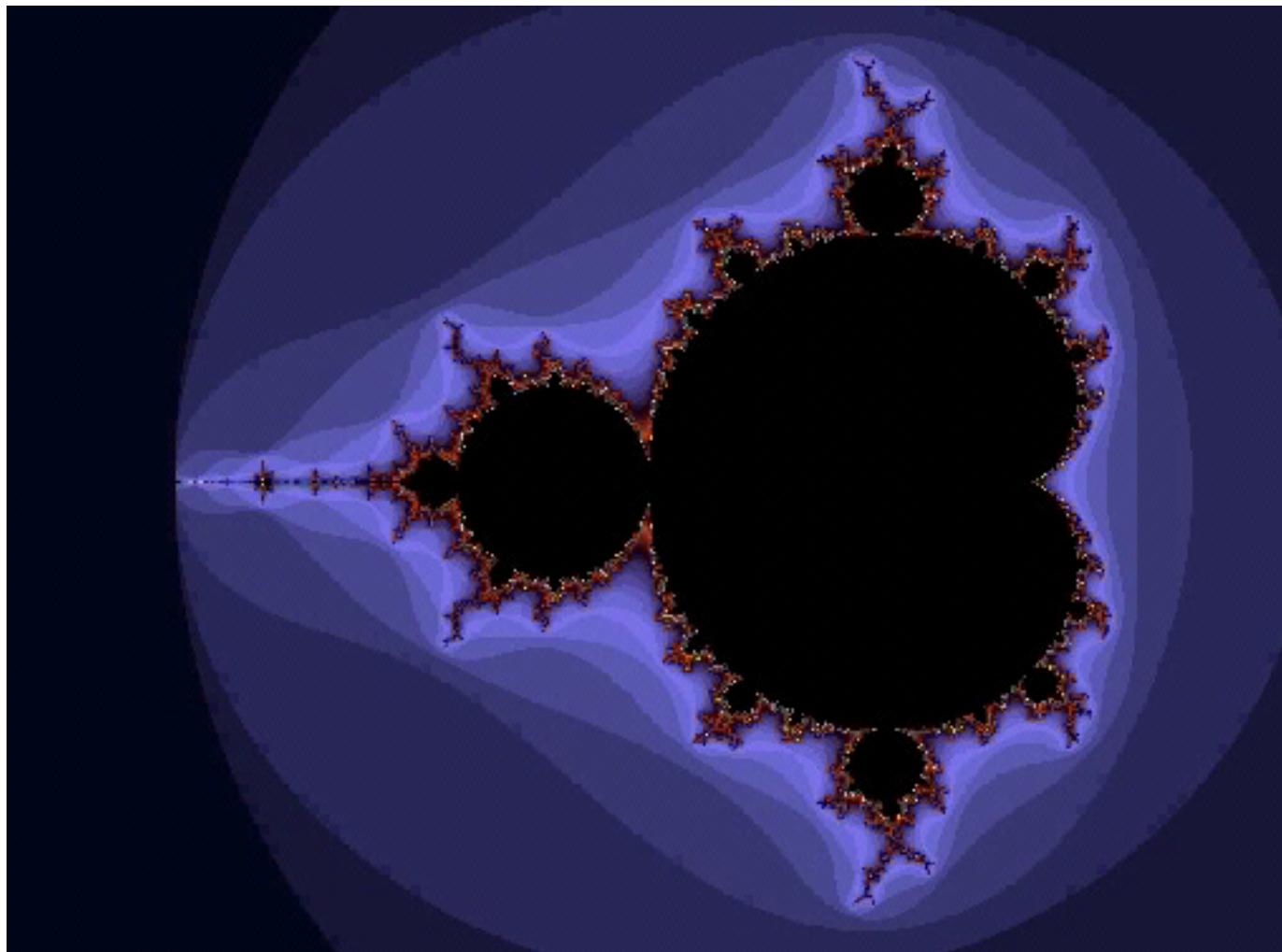
from <http://www.astro.su.se/~alexis/fractals/>

# Mandelbrot Set



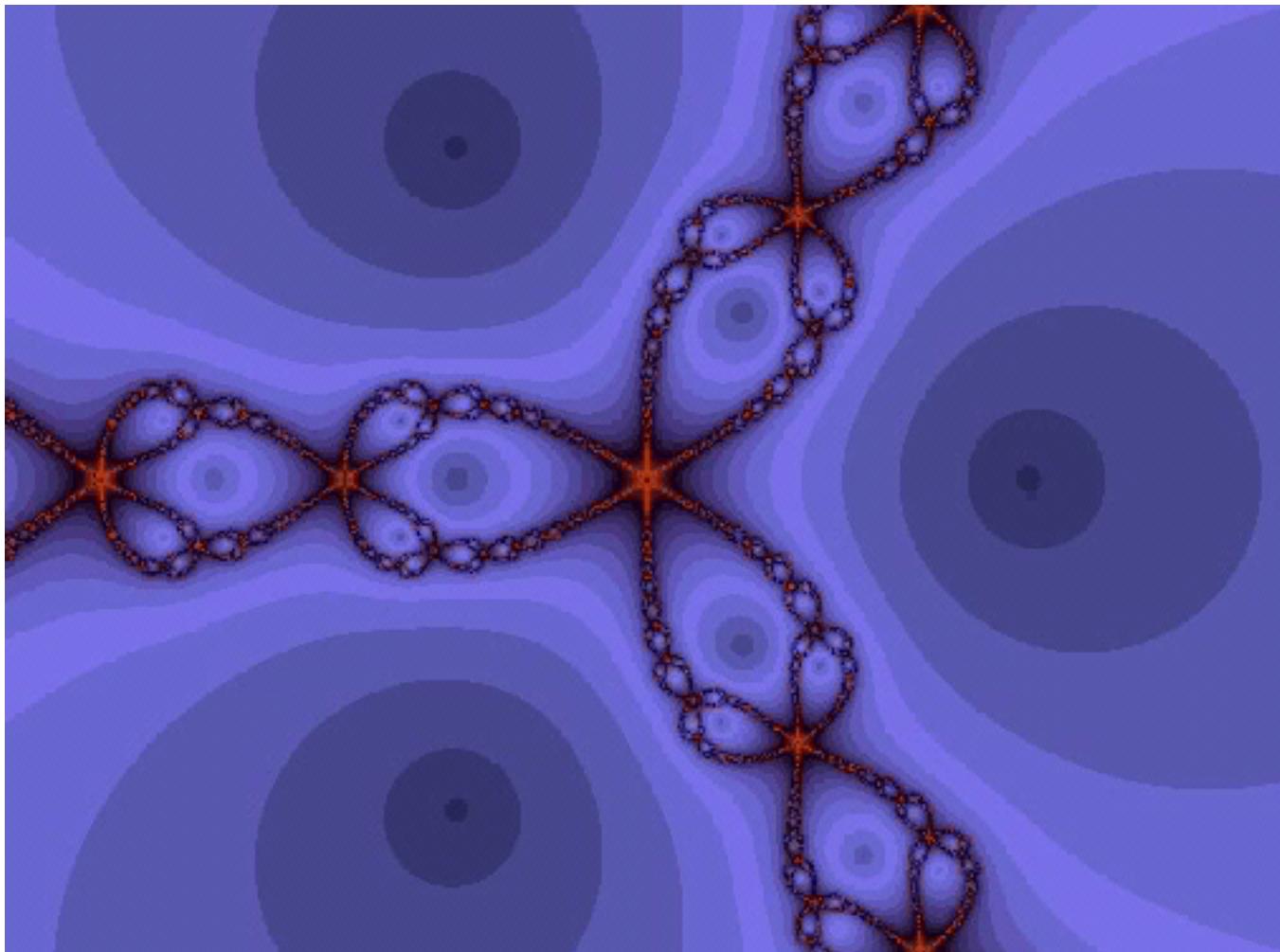


# Mandelbrot Set



# Newton Set

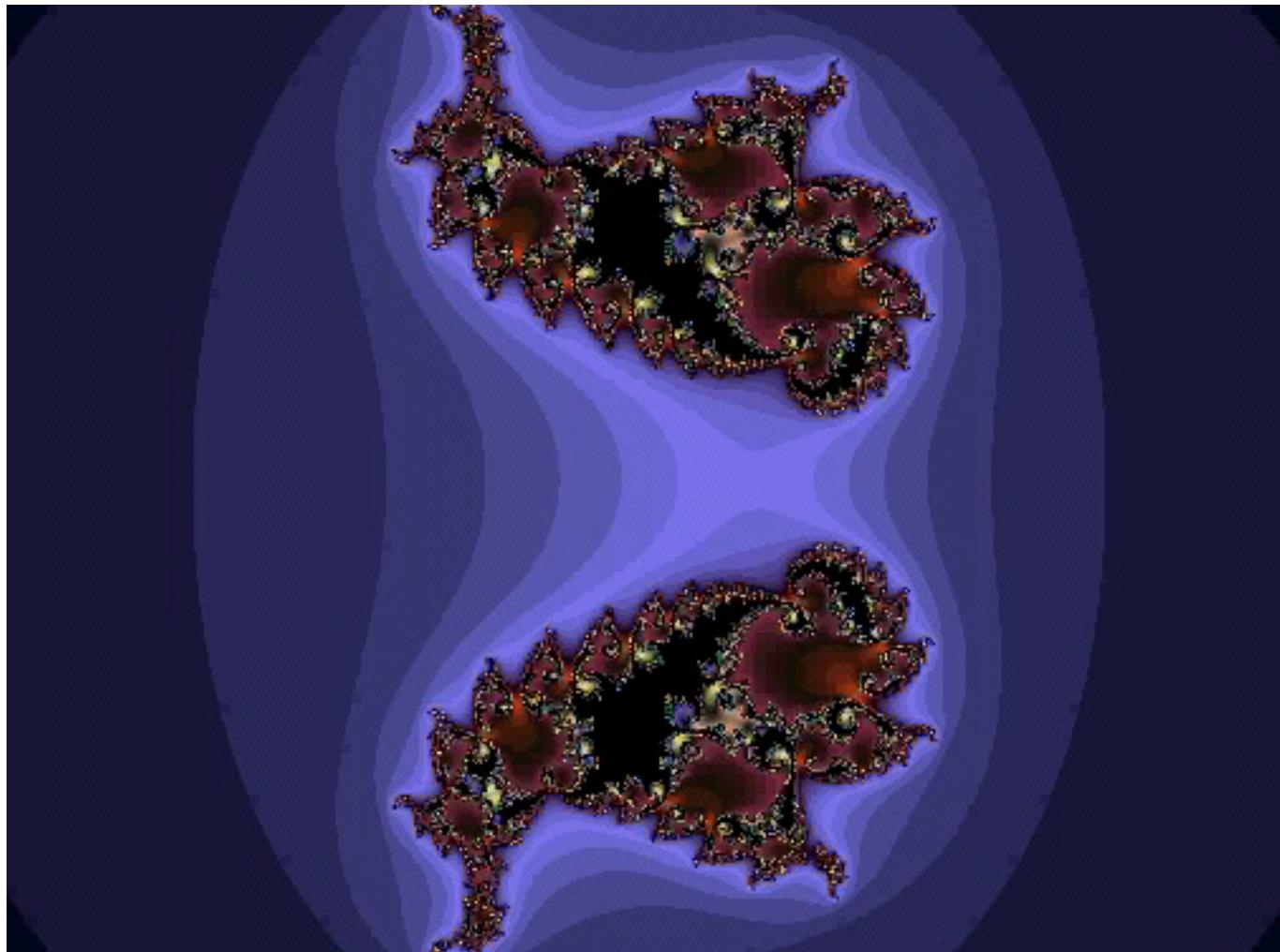
$$f(x) = x^3 - 1 \quad x_{n+1} = x_n - f(x) / f'(x)$$





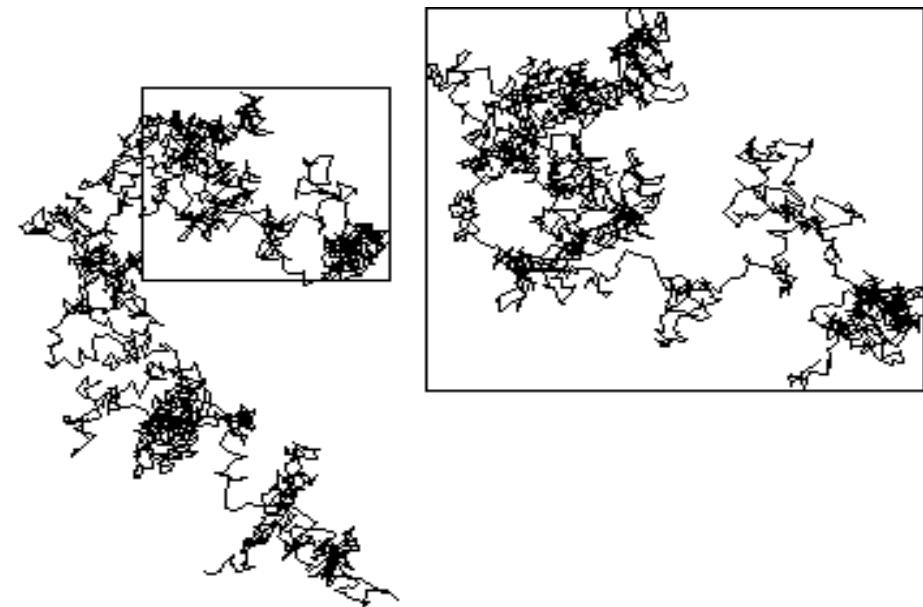
# Phoenix Set

$$z_{n+1} = z_n^2 + \operatorname{Re}(c) + \operatorname{Im}(c) * z_{n-1}$$



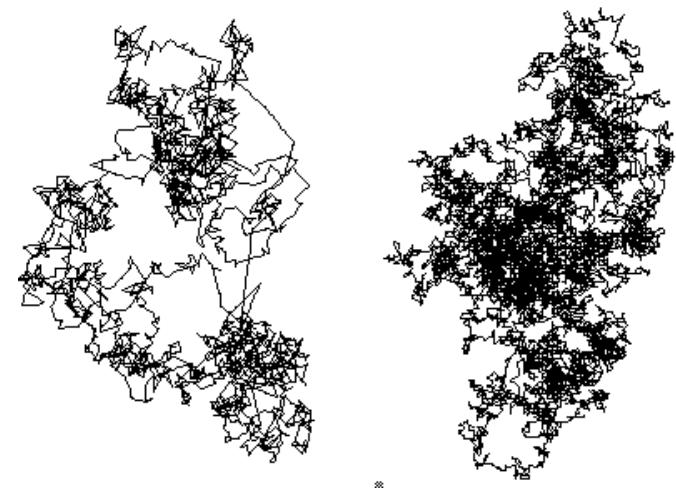
# Brownian Motion

- The dance of pollen grains in a water drop (Robert Brown in 1827)
- Explained by Albert Einstein in 1905
- Self-similar motion
- Infinite length
- Used to simulate rivers mountains and other random natural phenomena

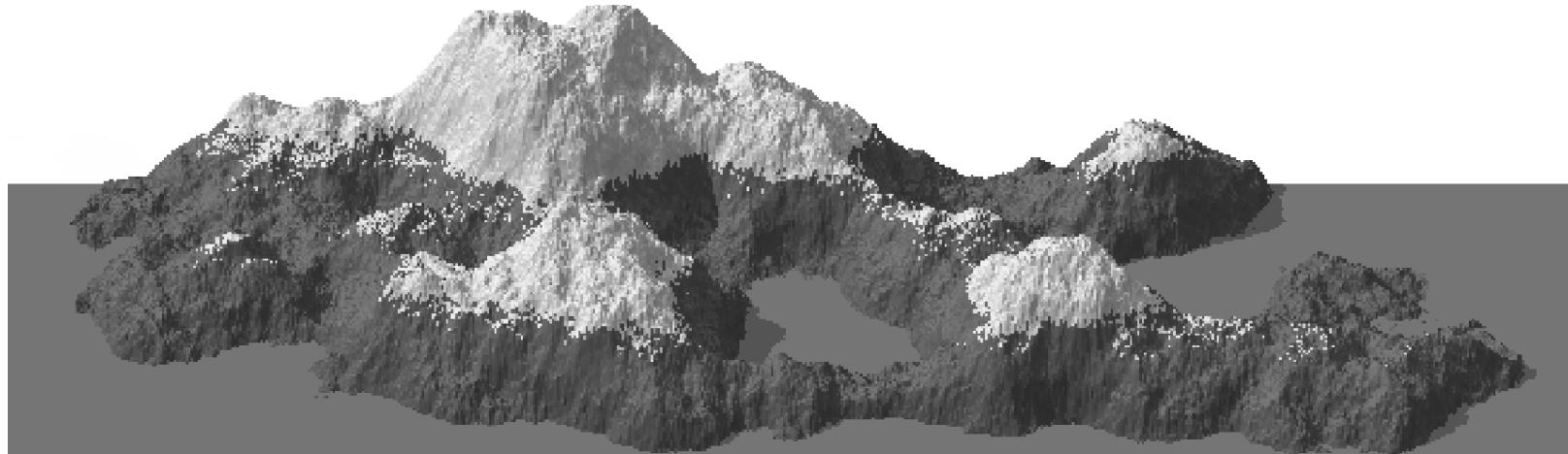


# Fractional Brownian Motion

- Fractional BM (fBM) is a generalization of BM to include memory
  - Integral on progress of random walk
- fBM characterized by it's power spectrum
  - BM has  $1/f^2$  power spectrum
  - fBM had  $1/f^\beta$  power spectrum with  $1.0 \leq \beta \leq 3.0$
- Think of  $\beta$  as controlling terrain roughness



# XMOUNTAINS



- Landscape generated by the XMOUNTAINS program by Steven Booth
- Realistic, self-similar image

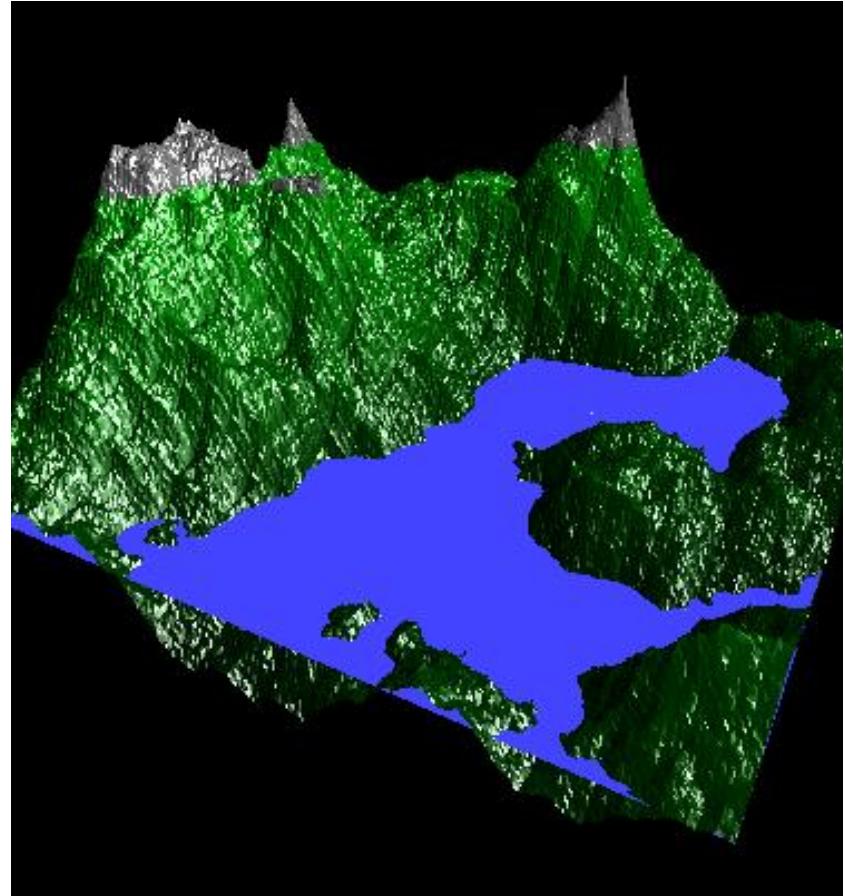


# XMOUNTAINS : Changing Fractal Dimension



# Random Midpoint Displacement

- fBM computations are time consuming
- RMD are faster to compute but less realistic
- Basic idea:
  - Start with 2 (2D) 4 (3D) random points.
  - Compute the midpoint for each interval
  - Displace the midpoint at random but based on the difference between end points



# RMD Algorithm

- Generate points  $a$  and  $b$  at random

$$y_{mid} = (1/2)(y(a)+y(b))+r$$

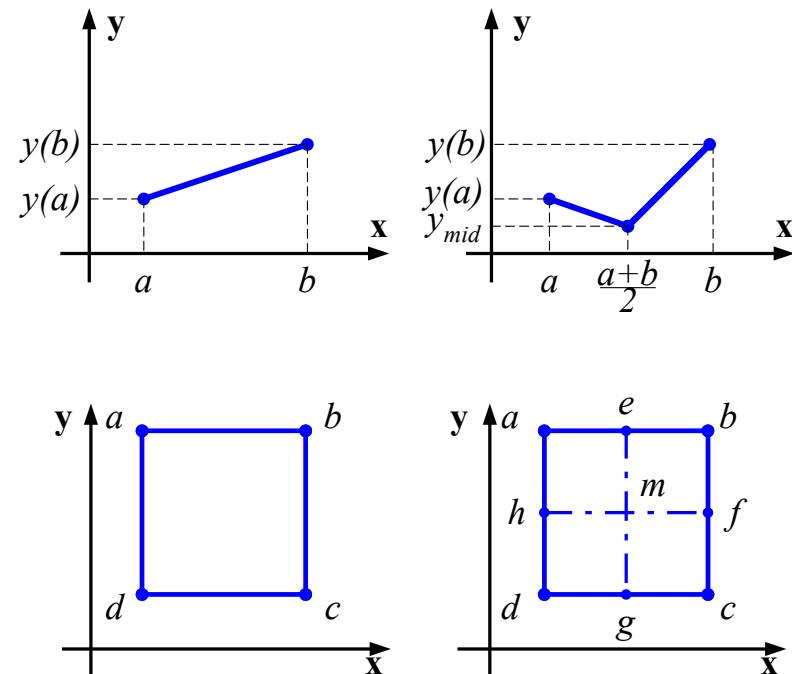
$$r = s \cdot (|b-a|) \cdot r_g()$$

$s$  - is a surface roughness parameter

$r_g()$ - returns a Gaussian random value (mean = 0, variance = 1)

In 3D version:

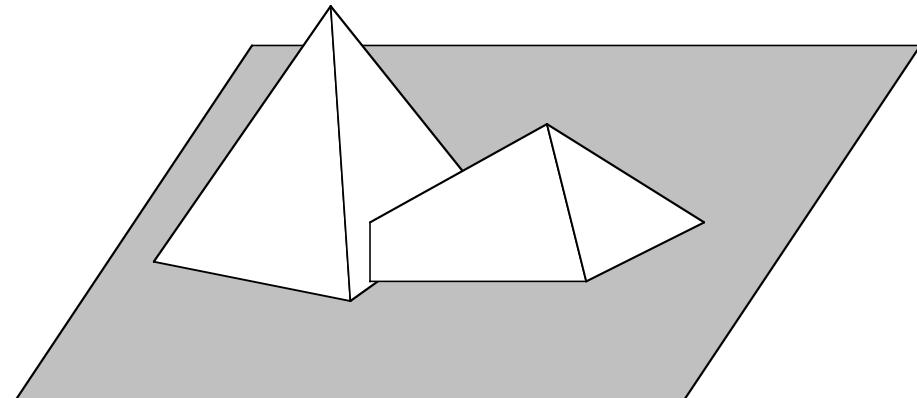
$$y_m = (1/4)(y(a)+y(b)+y(c)+y(d))+r$$



# Controlling the Topography

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- To model real environments we want to control the placement of peaks and valleys
- We can do it by setting up *Control Surfaces*.
- Calculate random elevations based on:
  - Elevation of control surface
  - Average elevation of the midpoint





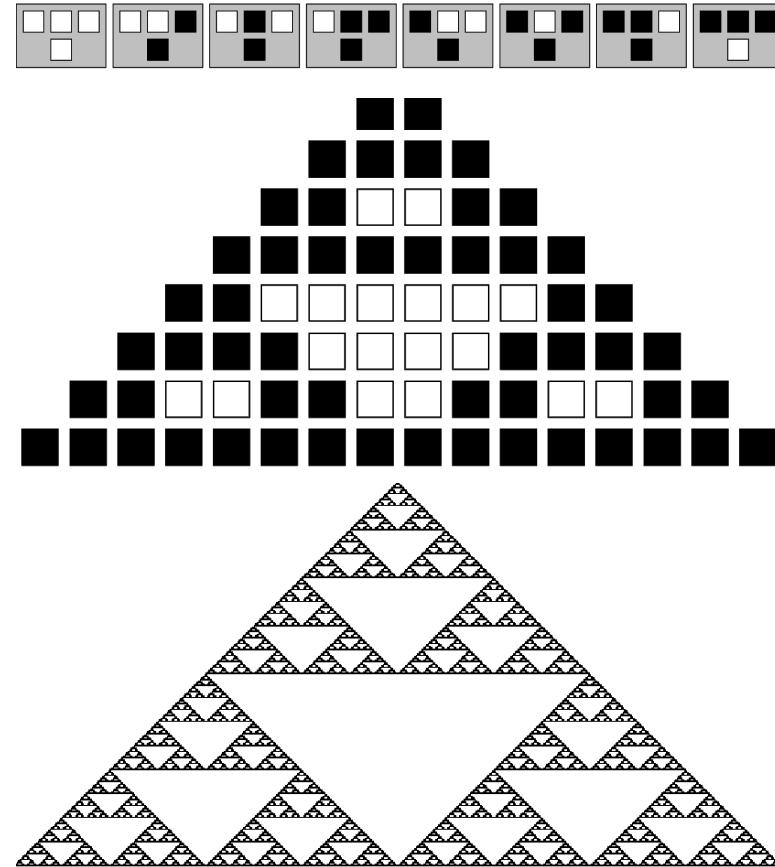
# Fractal Mountains

by Ken Musgrave

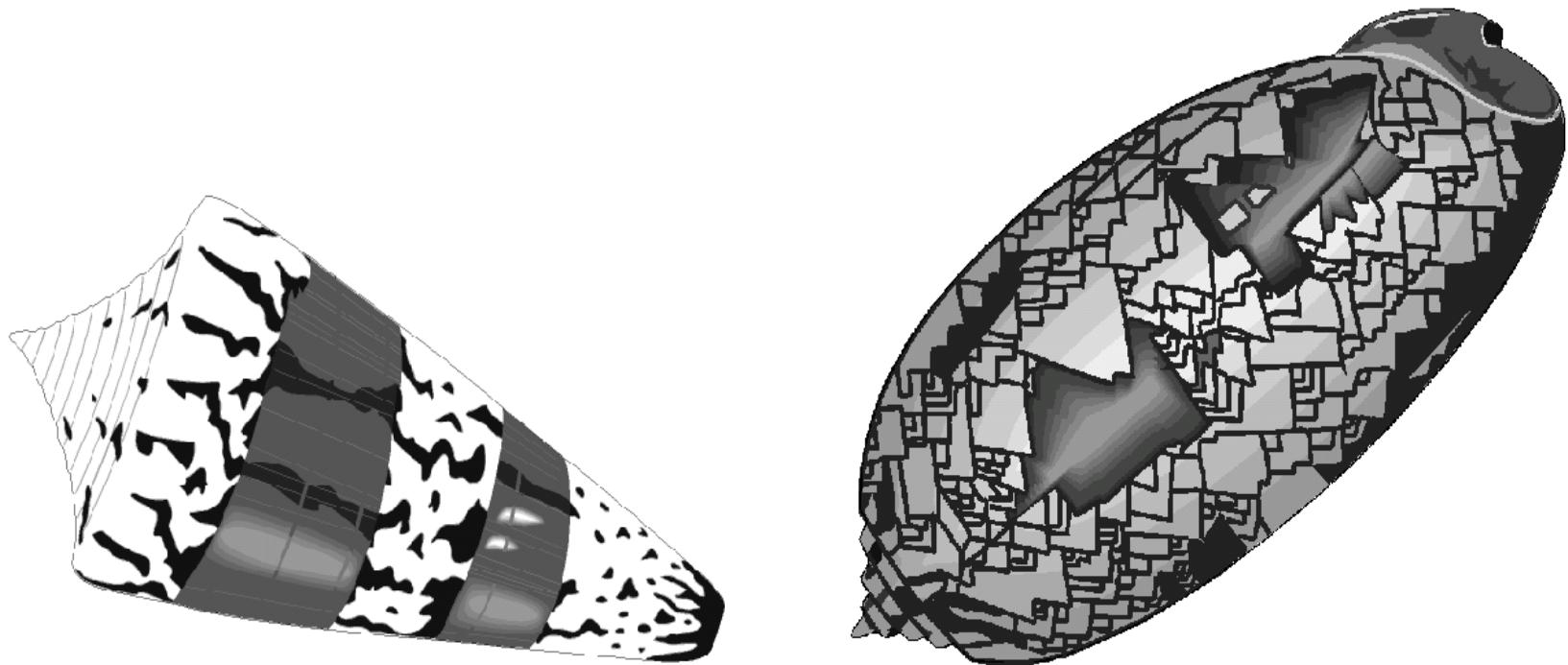


# Cellular Automata

- Invented by John von Neumann in 1940s
- Thoroughly studied by Wolfram
- Mechanism to study reproduction
- Dynamic system
  - Discrete in space
  - Discrete in time



# Cellular Automata in Nature



- Process which creates seashells has been linked to a one-dimensional CA

# Conus Textile Seashell



Source: wikipedia.org

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