

科学・技術の世界  
数式処理システムによる新時代の数学  
--- 反復関数系とフラクタル ---

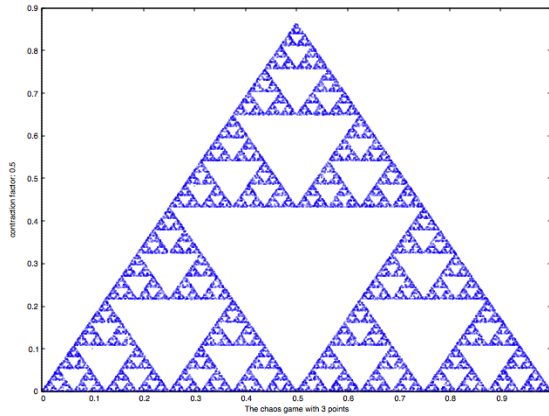
佐藤譲 (Yuzuru Sato)

RIES / Department of Mathematics

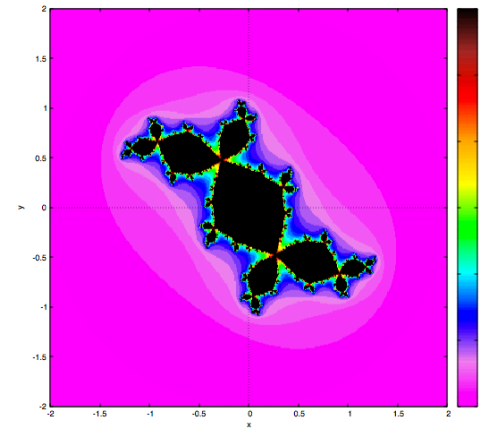
Hokkaido University

第15回 29 January, 2018

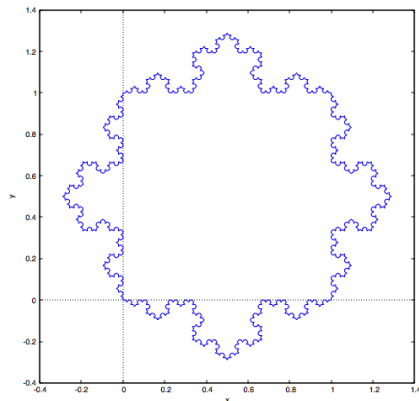
# Fractals



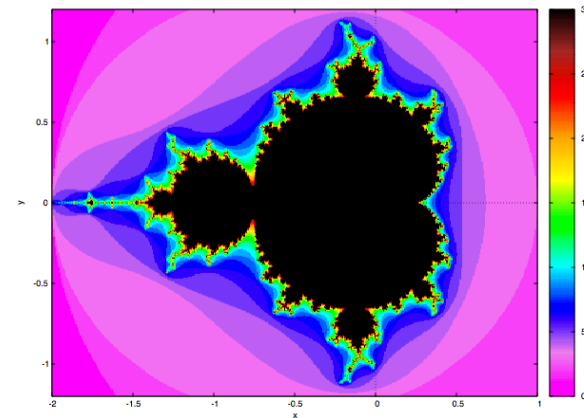
Sierpinski gasket



Druzy rabbit



Koch snowflakes



Mandelbrot set

[generated by Maxima sample codes]

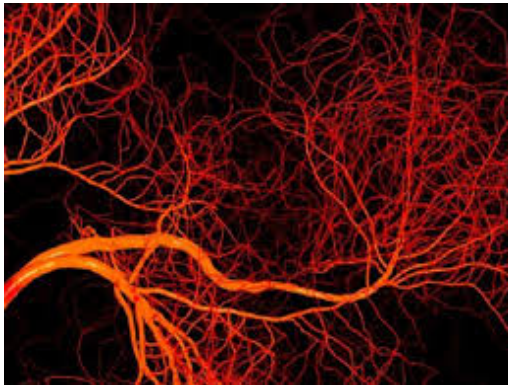
# Fractals



墨流し



イモガイの外殻



ヒトの血管



ロマネスコの蕾

[from wikipedia]

# Fractals



Benoit B. Mandelbrot  
(1924 –2010)

Applied mathematician at  
IBM Thomas J. Watson  
Research Center, USA

# Scaling

## **How Long Is the Coast of Britain?**

### **Statistical Self-Similarity and Fractional Dimension**

*Abstract. Geographical curves are so involved in their detail that their lengths are often infinite or, rather, undefinable. However, many are statistically “self-similar,” meaning that each portion can be considered a reduced-scale image of the whole. In that case, the degree of complication can be described by a quantity  $D$  that has many properties of a “dimension,” though it is fractional; that is, it exceeds the value unity associated with the ordinary, rectifiable, curves.*

BENOIT MANDELBROT

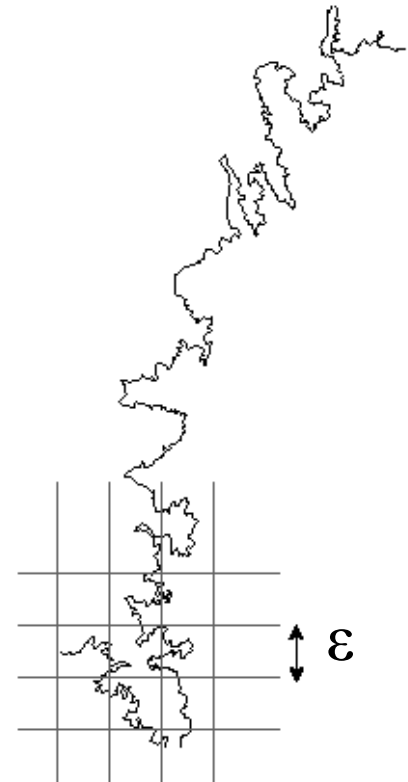
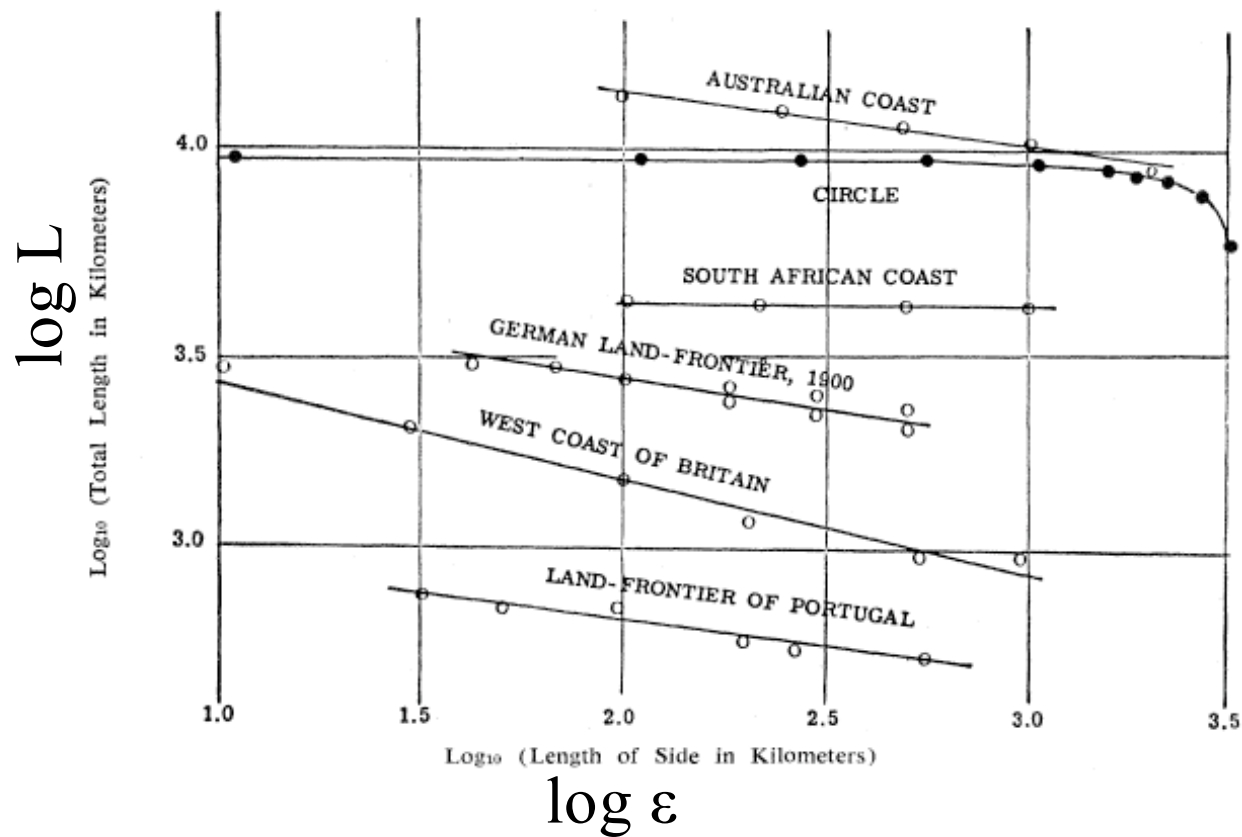
*International Business Machines,  
Thomas J. Watson Research Center,  
Yorktown Heights, New York 10598*

14 November 1966; 27 March 1967

SCIENCE, VOL. 156

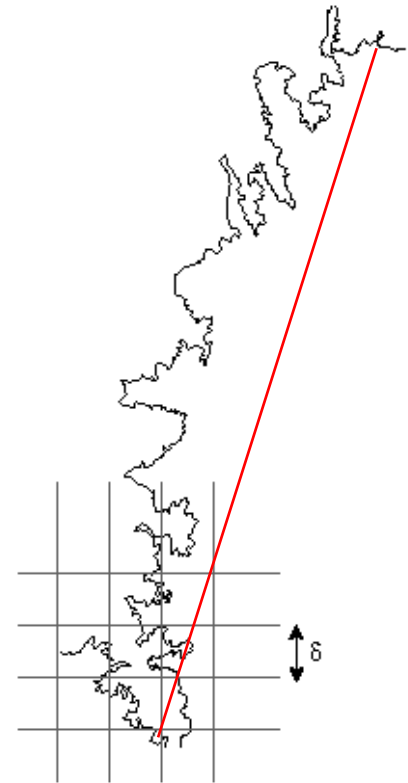
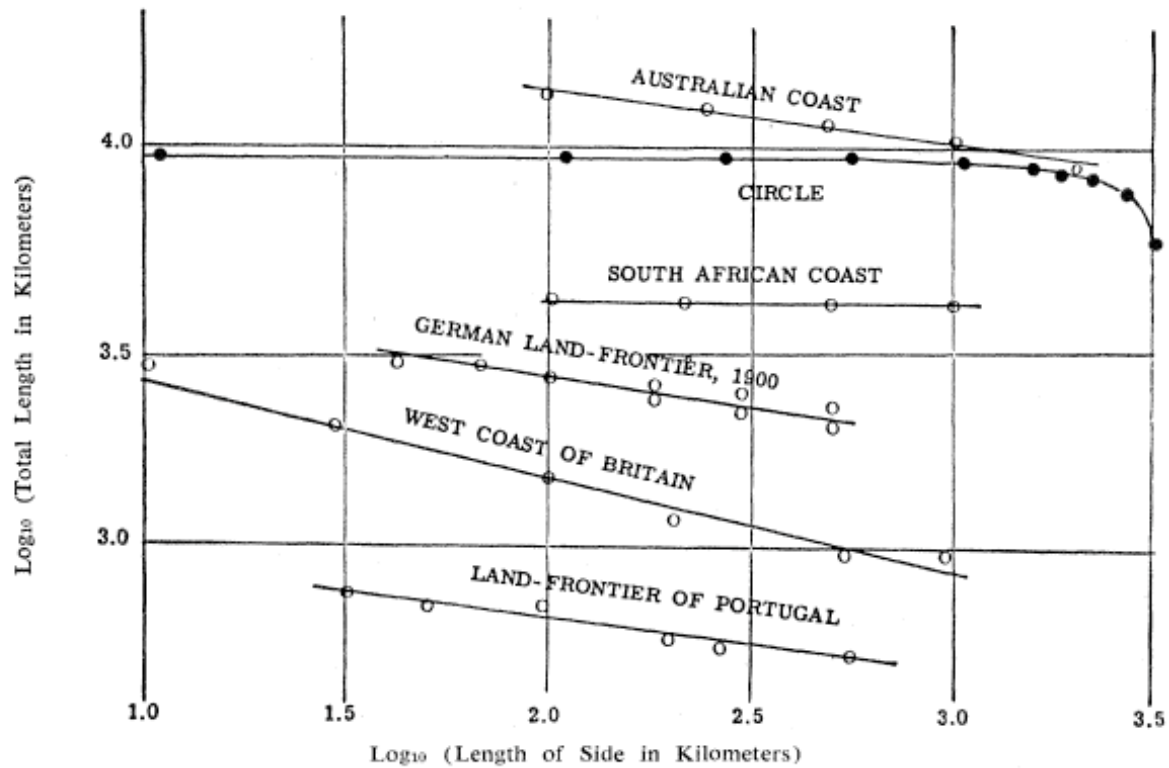
# Scaling

- 海岸線の長さの計測 (Richardson, 1961)



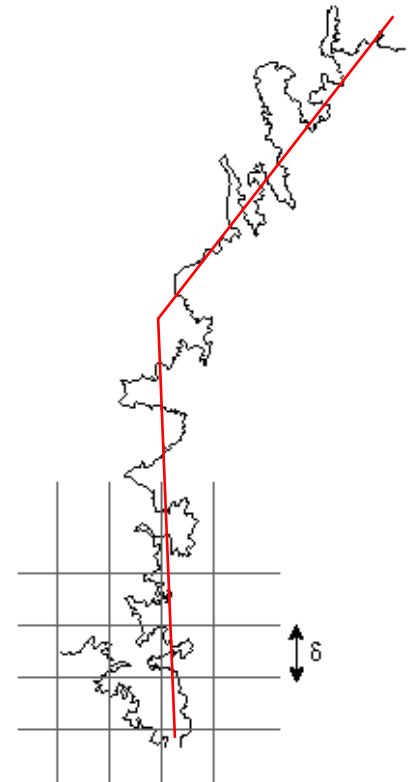
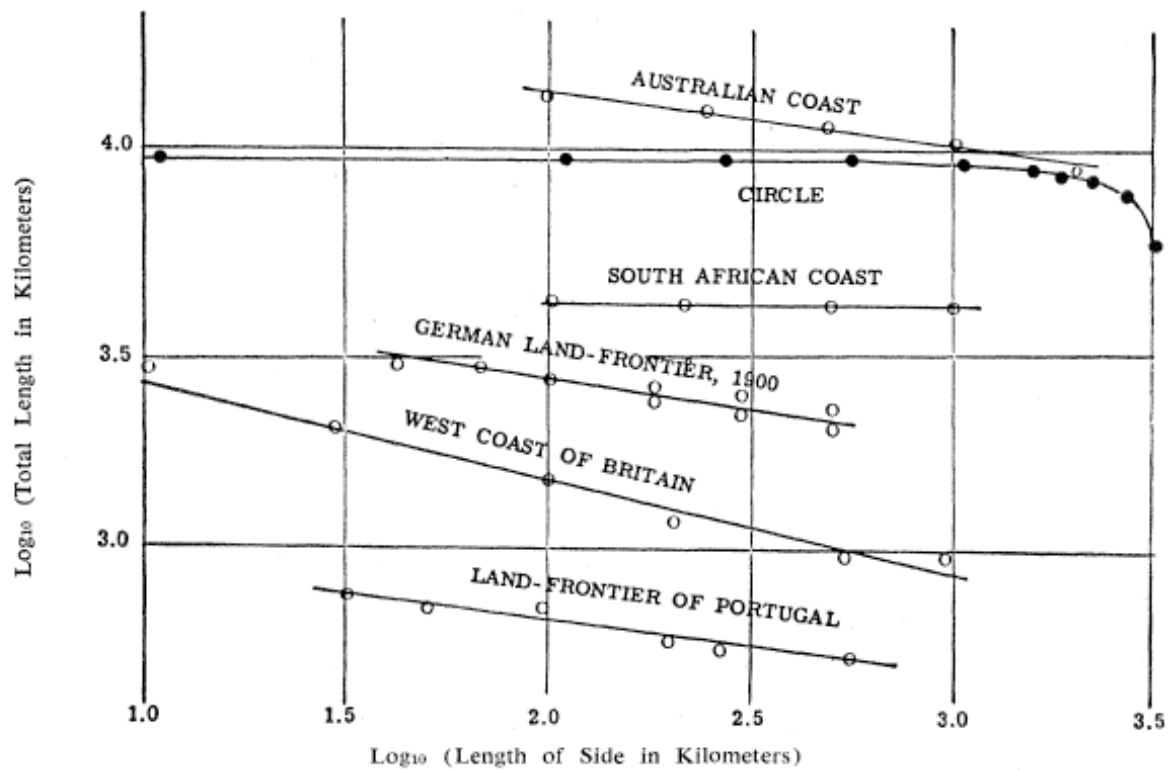
# Scaling

- 海岸線の長さの計測 (Richardson, 1961)



# Scaling

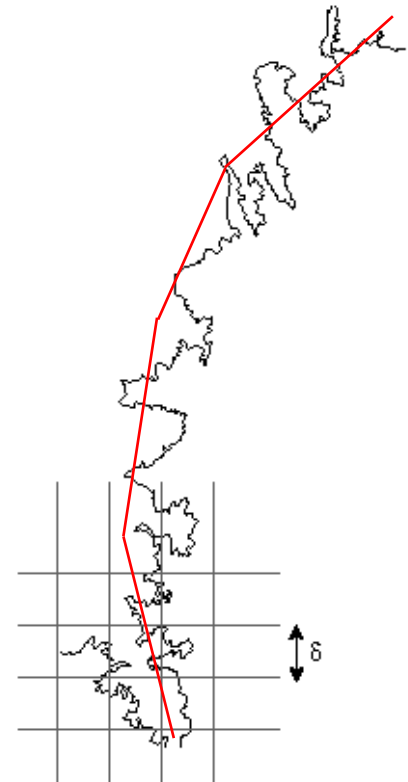
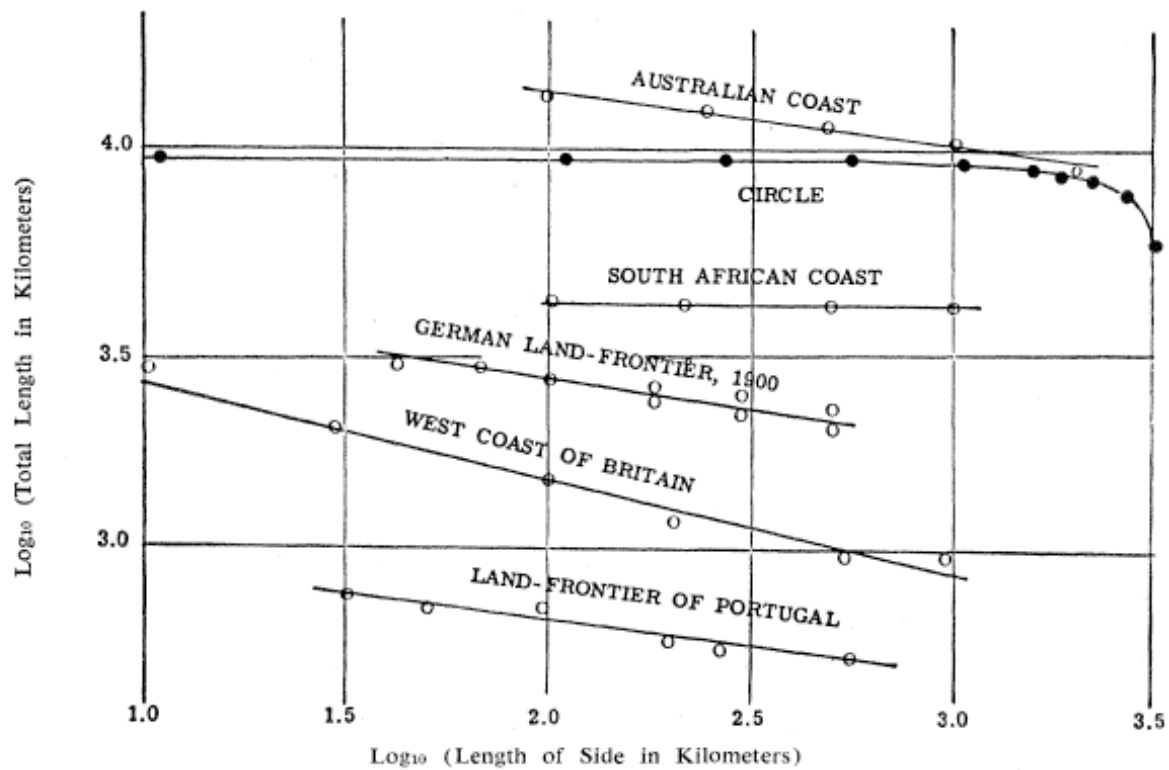
- 海岸線の長さの計測 (Richardson, 1961)





# Scaling

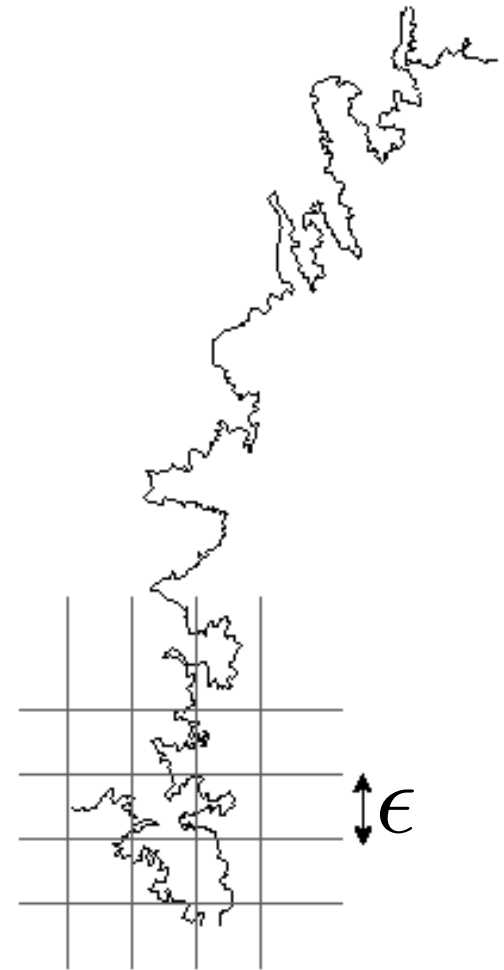
- 海岸線の長さの計測 (Richardson, 1961)



# Scaling

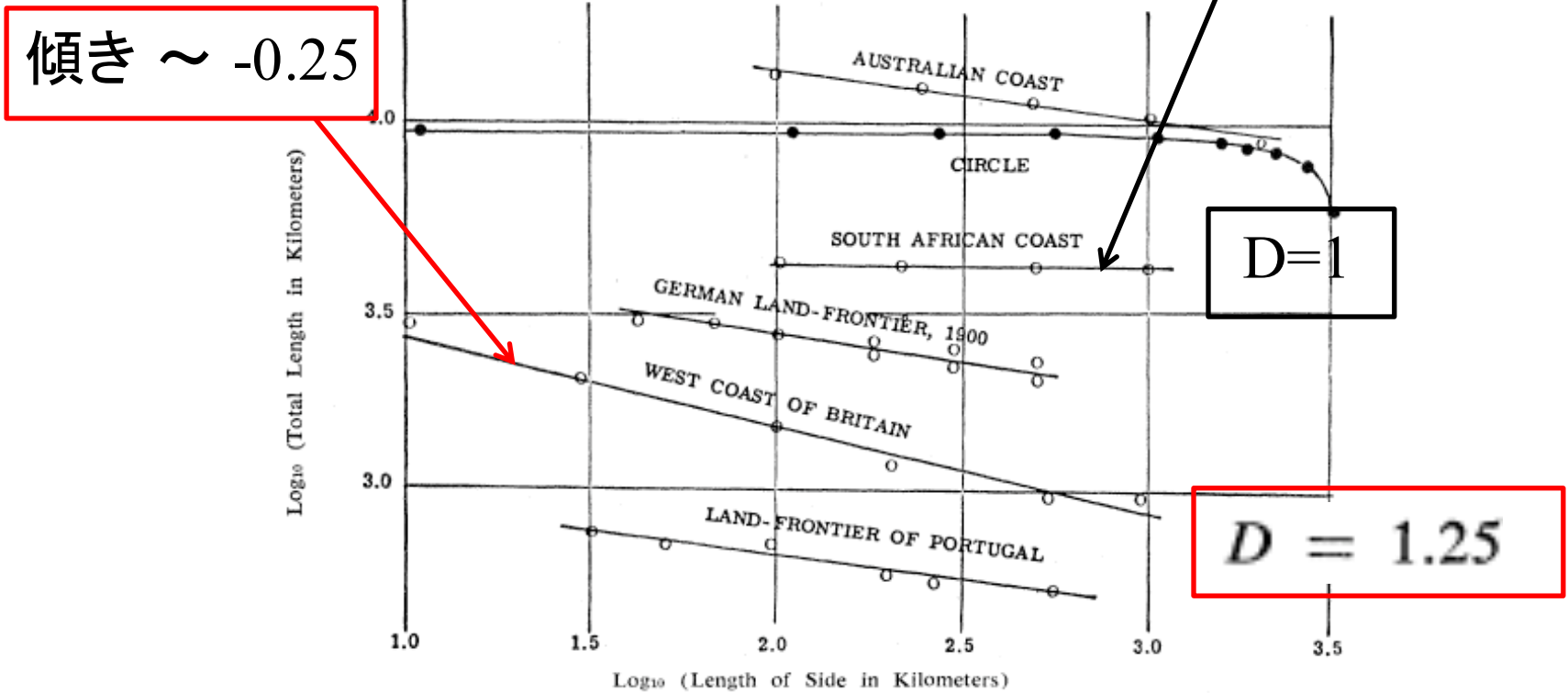
- 境界線を折れ線で近似するとき、長さ  $\epsilon$  の区間が約  $C\epsilon^{-D}$  個必要となる場合。
- 総計で長さは以下。

$$L(\epsilon) \sim C\epsilon^{-D} \cdot \epsilon = C\epsilon^{1-D}$$



# Scaling

- 海岸線のスケーリング指数



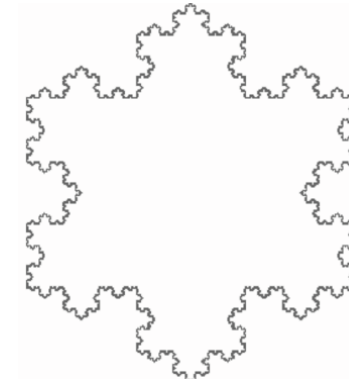
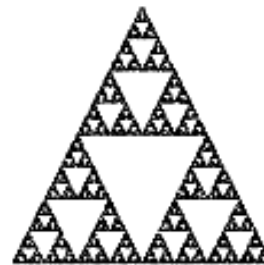
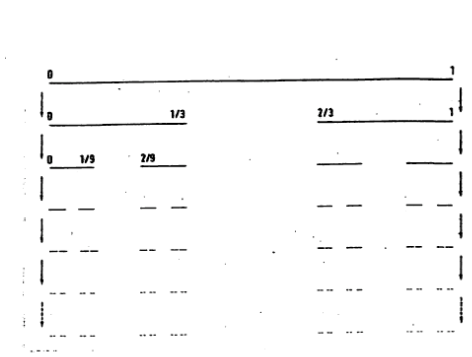
# Scaling

- スケーリング指数の普遍性
  - スペインとポルトガルによって主張されている両国間の国境の長さ(987kmと1214km)、オランダとベルギーによって主張されている両国間の国境の長さ(380kmと449km)の違いは、隣り合う国同士で異なる  $\epsilon$  を使っていることで説明される。

[B. Mandelbrot, 1977]

# Concept of fractals

- 観測スケールに対して不変な幾何構造をフラクタルとよぶ。(Mandelbrot, 1977)
  - 特徴的スケールをもたない幾何構造
  - 自己相似性をもつ幾何構造
  - **非整数の次元をもつ幾何構造**



# Iterated function systems

$\mathbf{R}^n$  上の反復関数系とは、確率  $p_1, p_2, \dots, p_m$  を伴う  $v \in \mathbf{R}^n$  に作用する  $m$  個の写像の組

$$f_1, f_2, \dots, f_m$$

$$f_i(v) = L_i v + c_i$$

$L_i$  : 固有値が全て1より小さい  $n \times n$  行列

$c_i$  :  $n$ 次元ベクトル

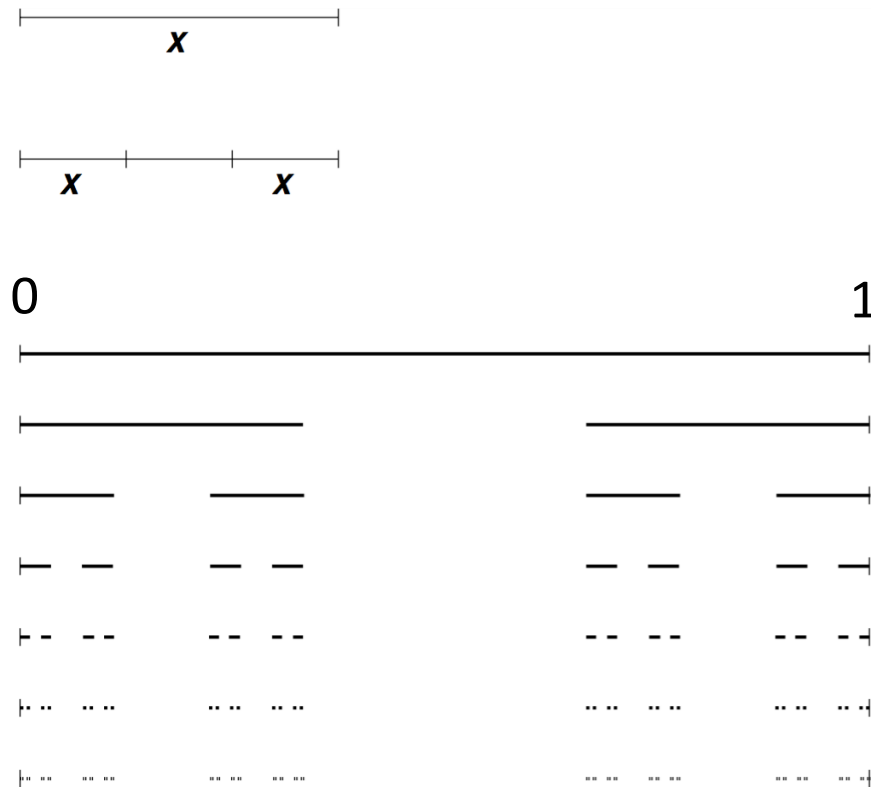
のことをいう。それぞれの(縮小)写像  $f_i$  は確率  $p_i$  で選ばれ、初期値に反復適用される。

# Example: Cantor set

$$f_1(x) = x/3$$

$$f_2(x) = x/3 + 2/3$$

$$p_1 = p_2 = 1/2$$



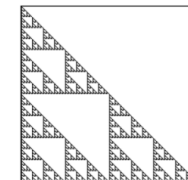
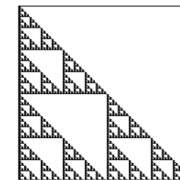
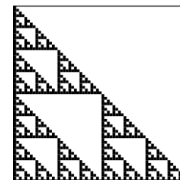
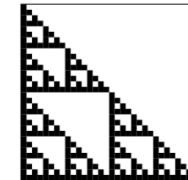
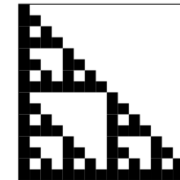
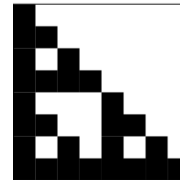
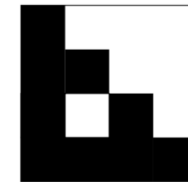
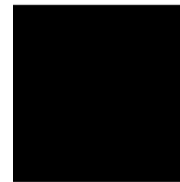
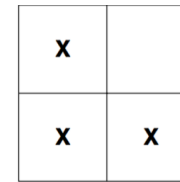
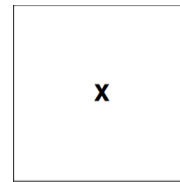
# Example: Sierpinski gasket

$$f_1(x, y) = (x/2, y/2)$$

$$f_2(x, y) = ((1 + x)/2, (y/2))$$

$$f_3(x, y) = (x/2, (1 + y)/2)$$

$$p_1 = p_2 = p_3 = 1/3$$





# Collage theorem

[IFSの不動点定理, Barnsley (1985)]

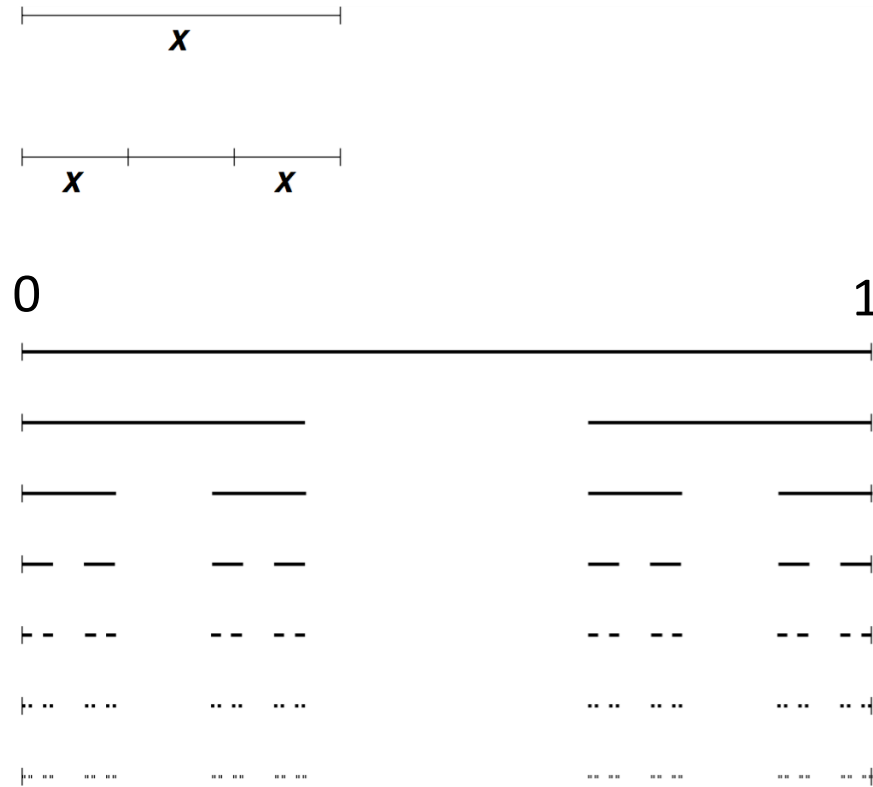
$f_1, f_2, \dots, f_m$  が全て縮小写像であるIFSにはただ一つの極限集合が存在する。

# Cantor set

$$f_1(x) = x/3$$

$$f_2(x) = x/3 + 2/3$$

$$p_1 = p_2 = 1/2$$

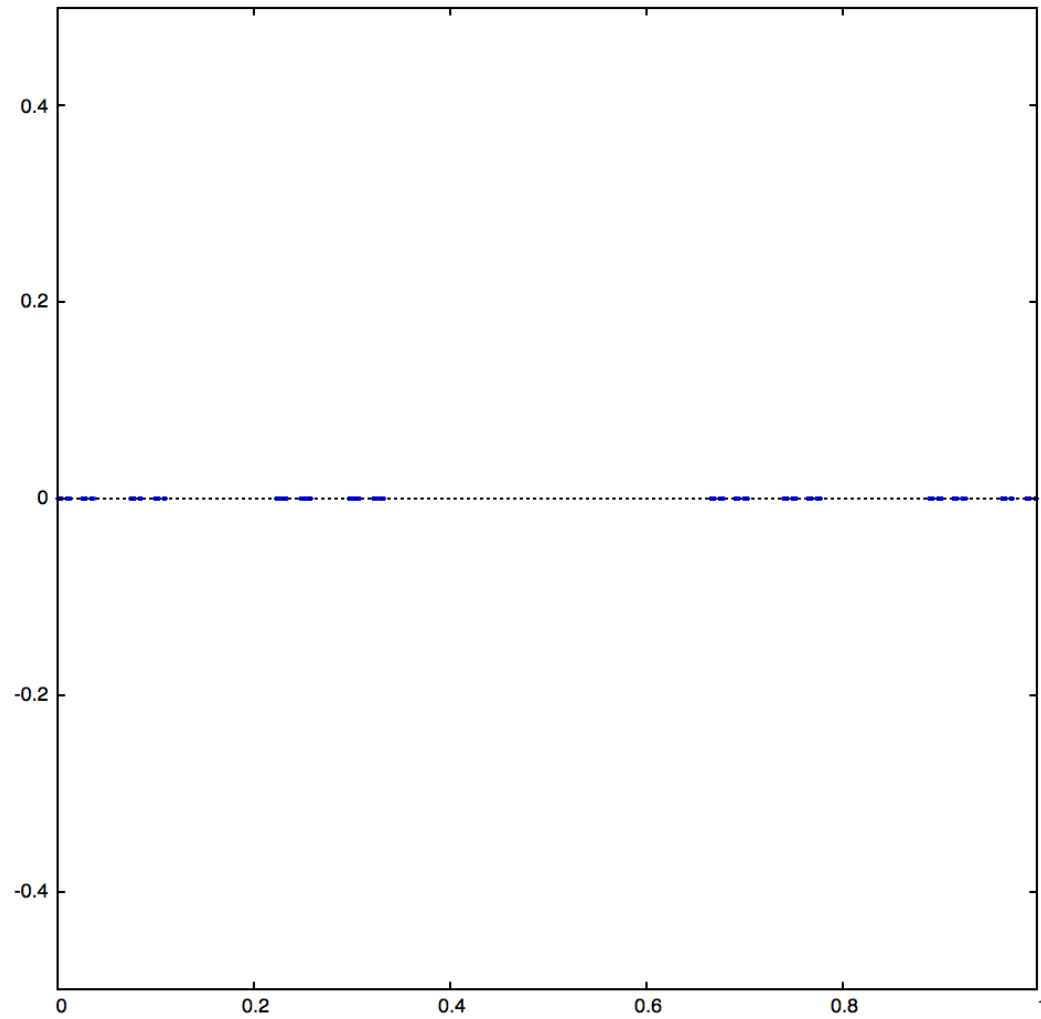


# Cantor set

## Maxima code

```
n:10000;  
array(x,n); array(rnd,n);  
x[1]:random(1.0);  
for i:1 thru n do rnd[i]:random(2);  
a1:1/3; a2:1/3; p1:0; p2:2/3;  
  
cs(x,r):=block(if(r=0) then return(a1*x+p1) else return(a2*x+p2));  
for i:1 thru n-1 do(x[i+1]:bfloat(cs(x[i],rnd[i])));  
  
data:makelist([x[i],0],i,n/2,n)$  
plot2d([discrete,data],[x,0,1],[y,-0.5,0.5],[style,[points,0.1]],same_xy)$
```

# Cantor set



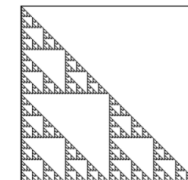
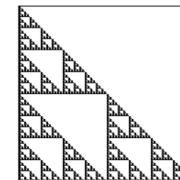
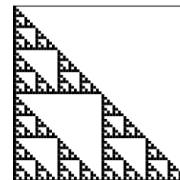
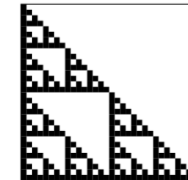
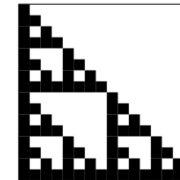
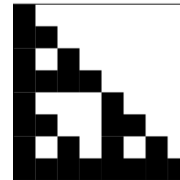
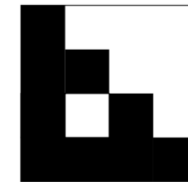
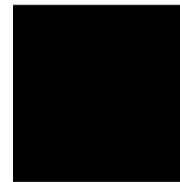
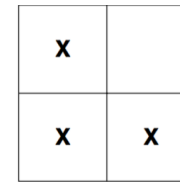
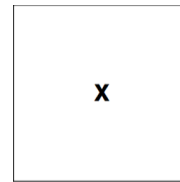
# Sierpinski gasket

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# Sierpinski gasket

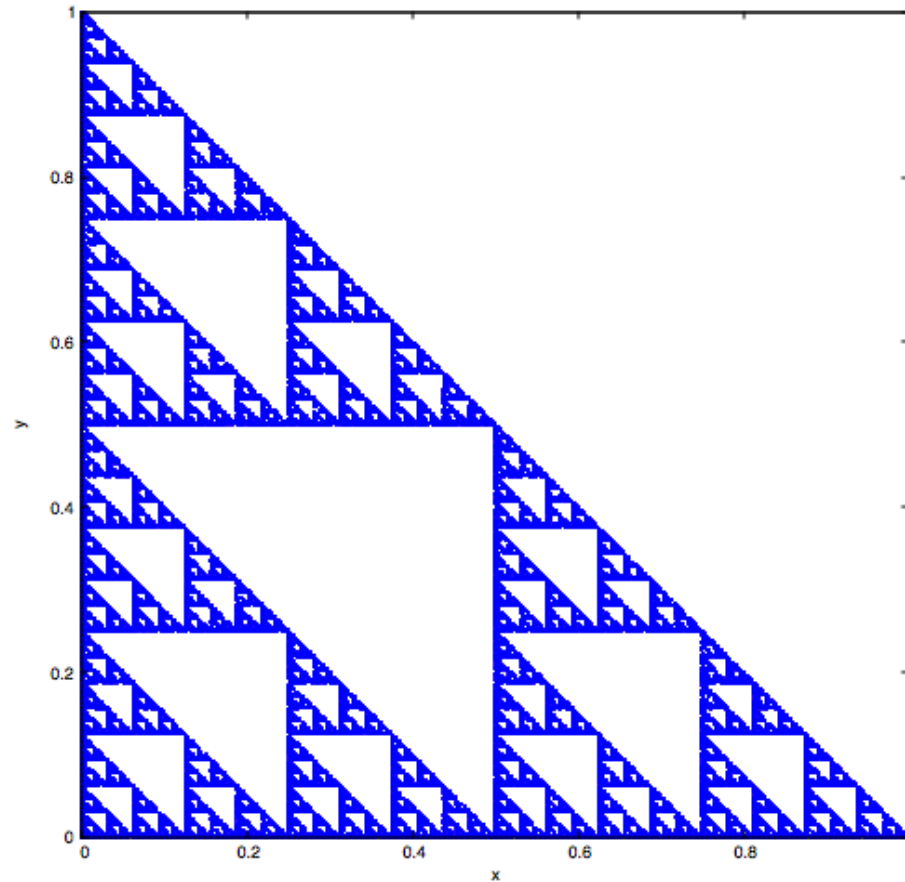
## Maxima code

```
n:100000;
array(x,n); array(y,n); array(rnd,n);
x[1]:random(1.0)$ y[1]:random(1.0);
for i:1 thru n do rnd[i]:random(3);
a1: matrix([1/2,0],[0,1/2]); a2: matrix([1/2,0],[0,1/2]); a3: matrix([1/2,0],[0,1/2]);
p1: [0,0]; p2: [1/2,0]; p3: [0,1/2];

sgx(x,y,r):=block(if(r=0) then return([1,0].(a1.[x,y]+p1))
else if(r=1) then return([1,0].(a2.[x,y]+p2))
else return([1,0].(a3.[x,y]+p3)));
sgy(x,y,r):=block(if(r=0) then return([0,1].(a1.[x,y]+p1))
else if(r=1) then return([0,1].(a2.[x,y]+p2))
else return([0,1].(a3.[x,y]+p3)));

for i:1 thru n-1 do (x[i+1]:bfloat(sgx(x[i],y[i],rnd[i])), y[i+1]:bfloat(sgy(x[i],y[i],rnd[i])));
data:makelist([x[i],y[i]],i,n/2,n)$
plot2d([discrete,data],[x,0,1],[y,0,1],[style,[points,0.1]],same_xy)$
```

# Sierpinski gasket



# Barnsley fern

$$f_1(x, y) = \begin{bmatrix} 0.00 & 0.00 \\ 0.00 & 0.16 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$f_2(x, y) = \begin{bmatrix} 0.85 & 0.04 \\ -0.04 & 0.85 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} 0.00 \\ 1.60 \end{bmatrix}$$

$$f_3(x, y) = \begin{bmatrix} 0.20 & -0.26 \\ 0.23 & 0.22 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} 0.00 \\ 1.60 \end{bmatrix}$$

$$f_4(x, y) = \begin{bmatrix} -0.15 & 0.28 \\ 0.26 & 0.24 \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix} + \begin{bmatrix} 0.00 \\ 0.44 \end{bmatrix}$$

$$p_1 = 0.01, p_2 = 0.85, p_3 = p_4 = 0.07$$

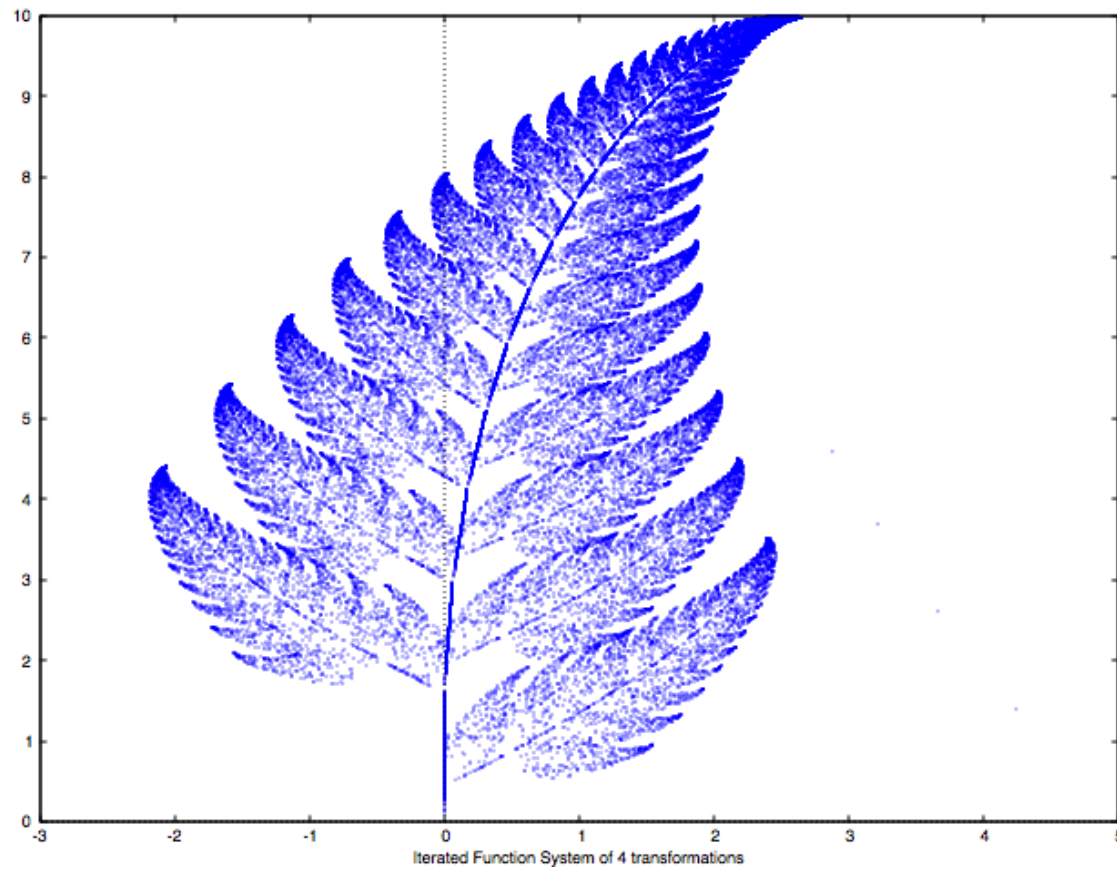


# Barnsley fern

## Maxima code

```
a1: matrix([0.85,0.04],[-0.04,0.85])$  
a2: matrix([0.2,-0.26],[0.23,0.22])$  
a3: matrix([-0.15,0.28],[0.26,0.24])$  
a4: matrix([0,0],[0,0.16])$p1: [0,1.6]$  
p2: [0,1.6]$  
p3: [0,0.44]$  
p4: [0,0]$  
w: [85,92,99,100]$  
  
ifs(w, [a1,a2,a3,a4], [p1,p2,p3,p4], [5,0], 50000, [style,dots]);
```

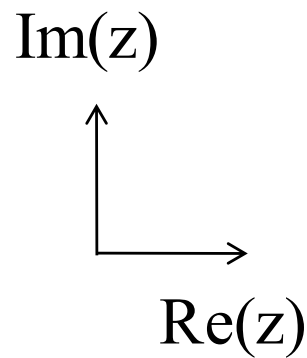
# Barnsley fern



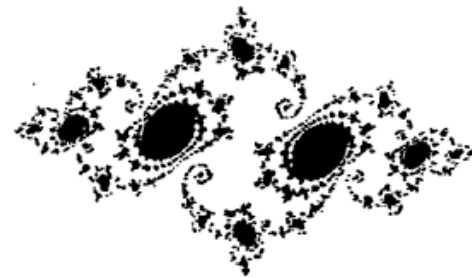
# Filled Julia set

- $Z_{n+1} = Z_n^2 + C$ ,  $Z_n, C$  は複素数

Cを固定したとき、すべてのnについて軌道が有界にとどまる相空間内の点集合。



$$C = -0.75$$



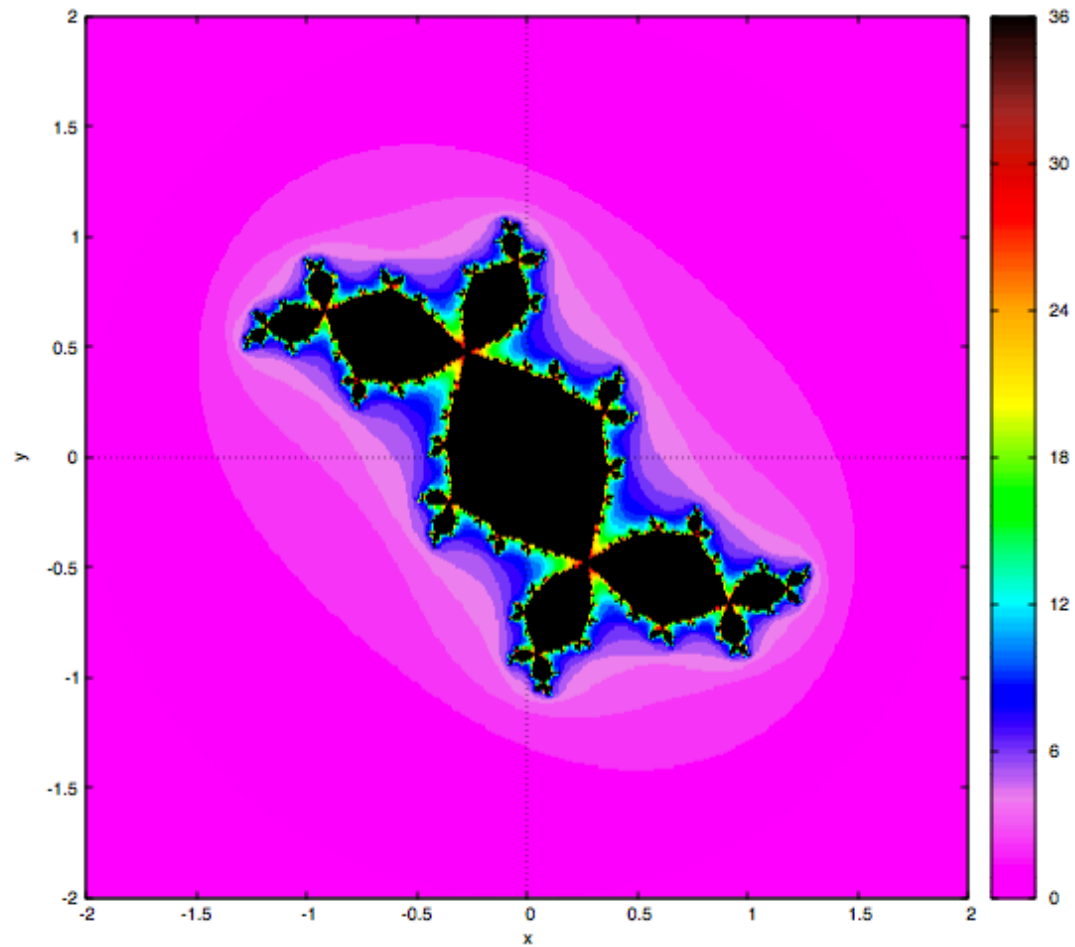
$$C = -0.75 + 0.1i$$

# Filled Julia set

Maxima code

```
julia (-0.122, 0.745, [iterations, 36],[x, -2, 2],[y, -2, 2], [grid, 400, 400],  
[color_bar_tics, 0, 6, 36])$
```

# Filled Julia set

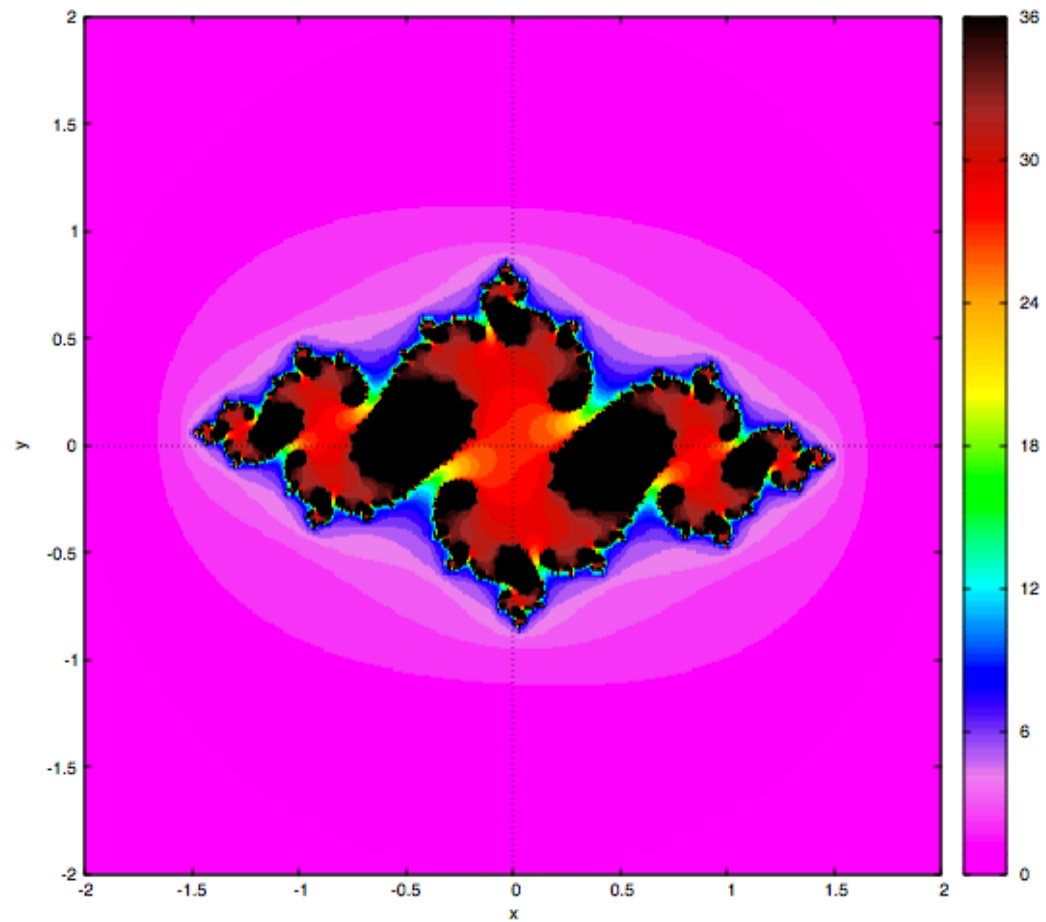


# Filled Julia set

Maxima code

```
julia (-0.754, 0.113, [iterations, 36],[x, -2, 2],[y, -2, 2], [grid, 400, 400],  
[color_bar_tics, 0, 6, 36])$
```

# Filled Julia set



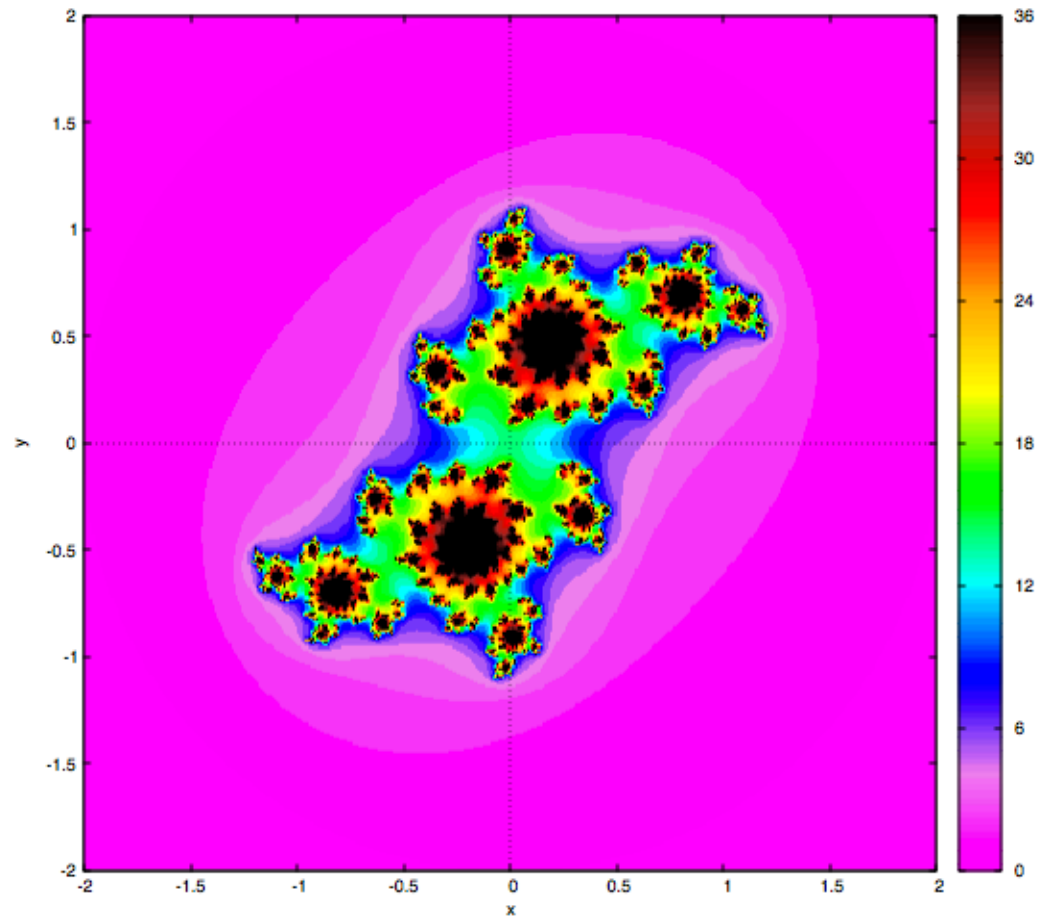
# Filled Julia set

Maxima code

```
julia (0.011, -0.670, [iterations, 36],[x, -2, 2],[y, -2, 2], [grid, 400, 400],  
[color_bar_tics, 0, 6, 36])$
```



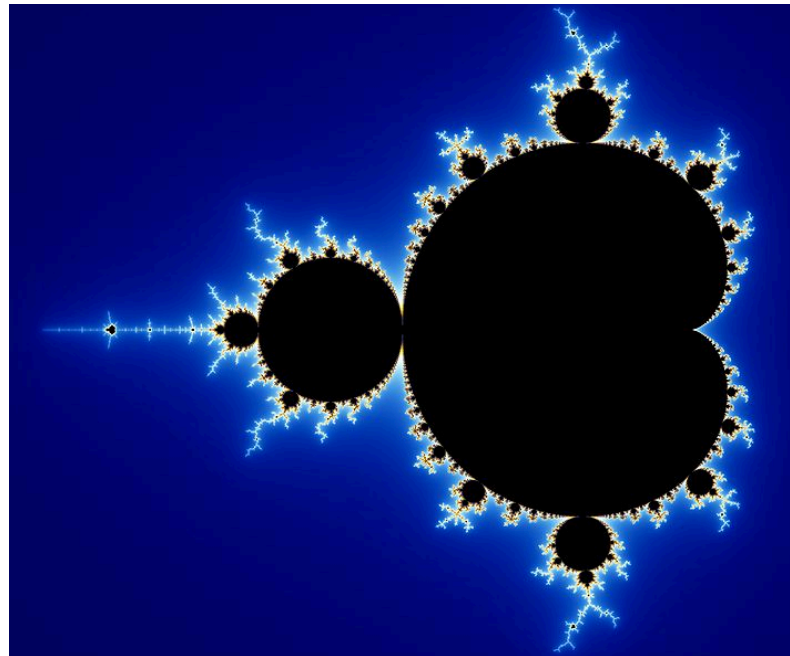
# Filled Julia set



# Mandelbrot set

- $Z_{n+1} = Z_n^2 + C$ ,  $Z_n, C$  は複素数  
Z=0が有界数列を生成するようなCの集合。

Im(z)  
↑  
↔  
Re(z)

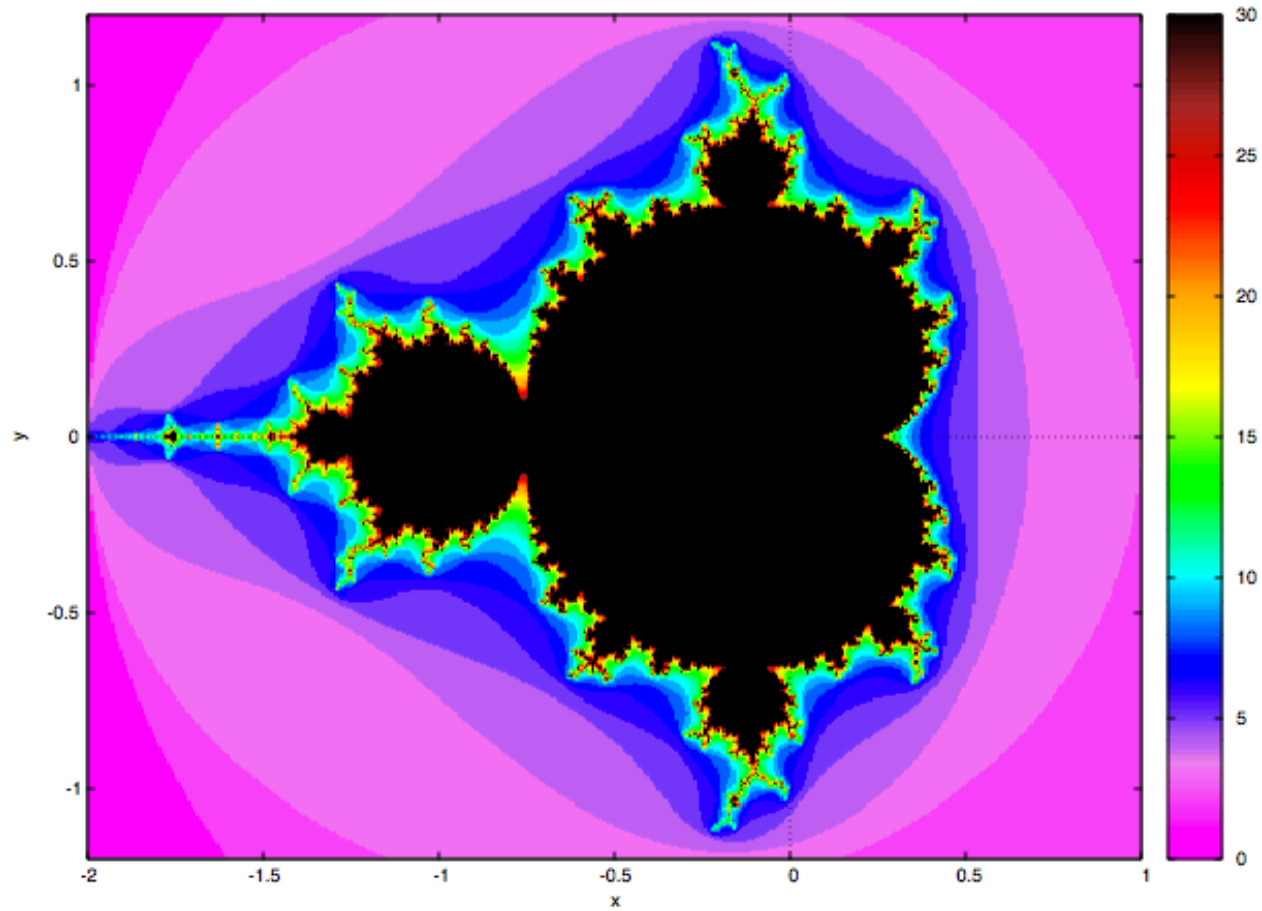


# Mandelbrot set

Maxima code

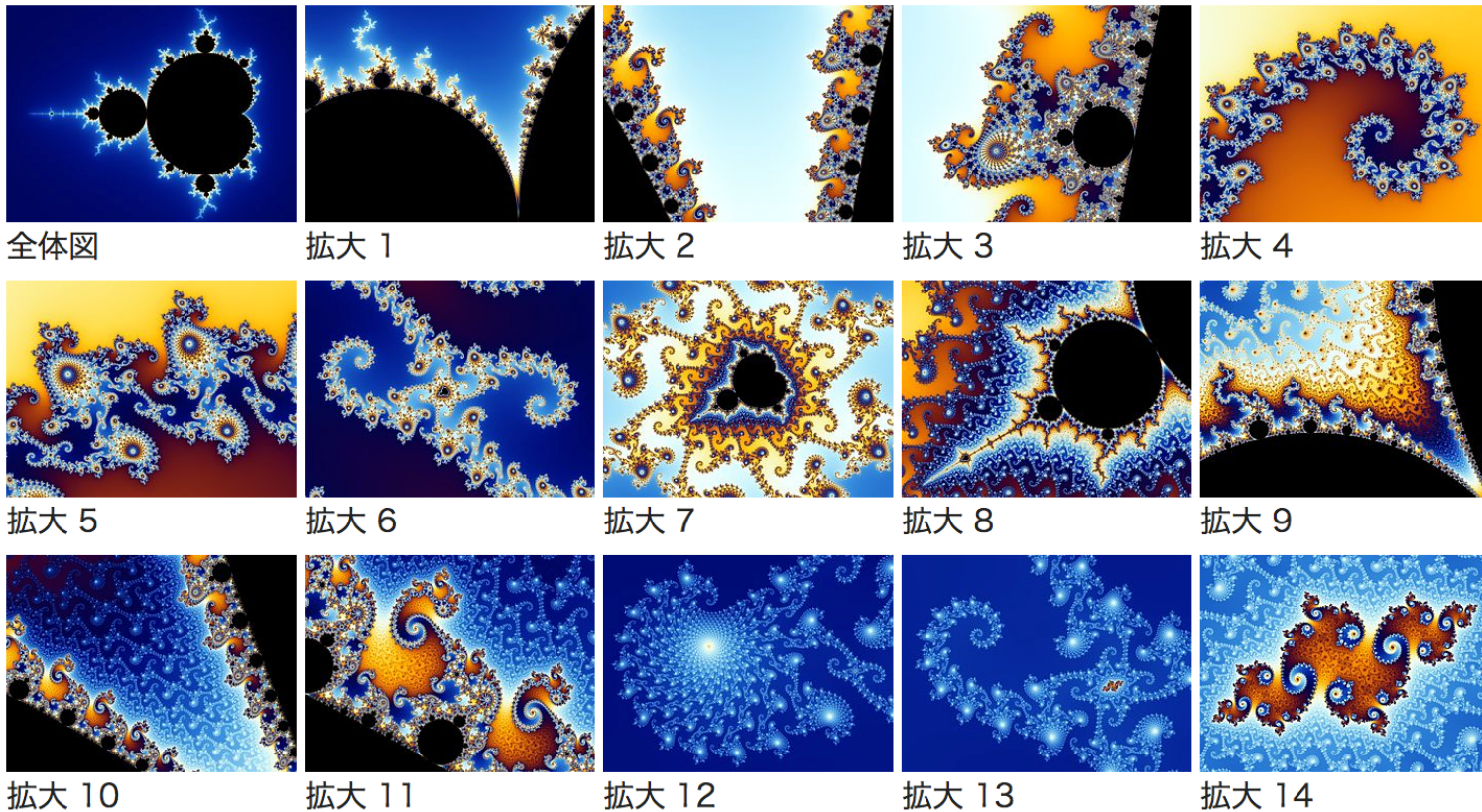
```
mandelbrot ([iterations, 30], [x, -2, 1], [y, -1.2, 1.2], [grid,400,400])$
```

# Mandelbrot set



# Mandelbrot set

- 連結かつ境界のHausdorff次元が2(=位相次元)である複雑なフラクタル。



# Topological dimension

- 一点からなる集合  $\{p\}$  に対して

$$\dim_T(\{p\}) = 0$$

- 単位線分  $I^1$  に対して

$$\dim_T(I^1) = 1$$

- 単位正方形  $I^2$  に対して

$$\dim_T(I^2) = 2$$

- 一般に  $m$ 次元超立方体  $I^m$  に対して

$$\dim_T(I^m) = m$$

# Hausdorff dimension

- $R^n$ 内の集合 $X$ を直径が  $\epsilon$  以下の閉集合で覆う。閉集合の直径を  $\epsilon_1, \epsilon_2, \dots, < \epsilon$  として $X$ の最小被覆を構成し、 $\Lambda_d(E) = \inf \sum_k \epsilon_k^d$ を考える。このとき

$$\Lambda_d(E) = \begin{cases} \infty & (d < d^*) \\ 0 & (d > d^*) \end{cases}$$

となる  $d^*$  をHausdorff次元  $\dim_H(X)$  という。

# Definition of fractals

- $R^n$  上の集合  $X$  がフラクタルであるとは

$$\dim_T(X) < \dim_H(X)$$

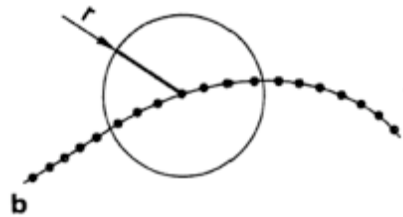
が成り立つときにいう。

[山口昌也, 1993]



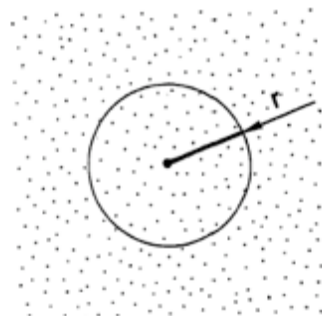
# Scale invariance and dimension

- n次元集合に対して、その集合上の点を中心とする半径rの球の中に入っている点の数をN(r)とすると、次元vは  $N(r) \sim r^v$  で与えられる。



線分

$$N(r) \sim r^1$$



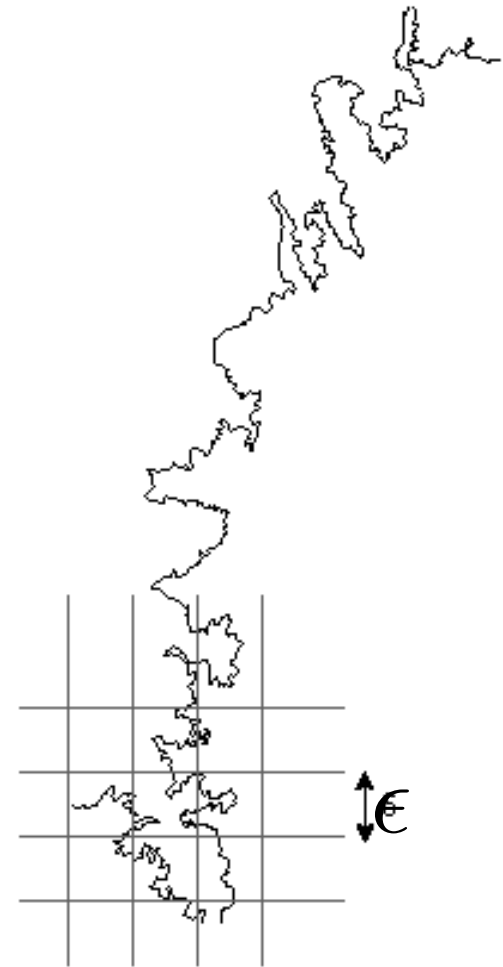
面

$$N(r) \sim r^2$$

# Scale invariance and dimension

- 相空間を一辺  $\epsilon$  の区間で分割し、与えられた集合  $X$  を覆うために区間がいくつ必要になるかを数える。
- 区間が  $C\epsilon^{-D}$  個必要となるとき、スケーリング則より  $D$  を求めることができる。

$$N(\epsilon) \sim C\epsilon^{-D}$$

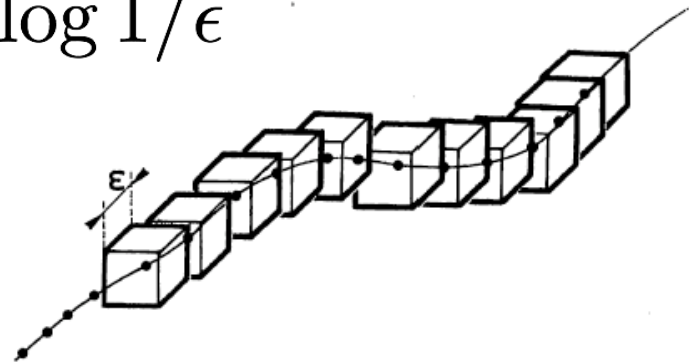


# Box-counting dimension

- $n$ 次元空間内の点集合  $X$  を一辺が  $\epsilon$  の  $n$ 次元の立方体で覆う。この被覆に必要な最小の立方体の数を  $N(\epsilon)$  とすると、Hausdorff次元の上限は、以下のBox-counting次元  $D(= \dim_B(X))$  で与えられる。

$$N(\epsilon) \sim \epsilon^D \iff D \sim \frac{\log N(\epsilon)}{\log 1/\epsilon}$$

$$D = \lim_{\epsilon \rightarrow 0} \frac{\log N(\epsilon)}{\log(1/\epsilon)}$$



$$\dim_T(X) \leq \dim_H(X) \leq \dim_B(X)$$

# Box-counting dimension

- 一点

$$N(\epsilon) = 1, D = 0$$

- 長さLの線分

$$N(\epsilon) = L \cdot \epsilon^{-1}$$

$$D = \lim_{\epsilon \rightarrow 0} \frac{\log(L \cdot \epsilon^{-1})}{\log(1/\epsilon)} = 1$$

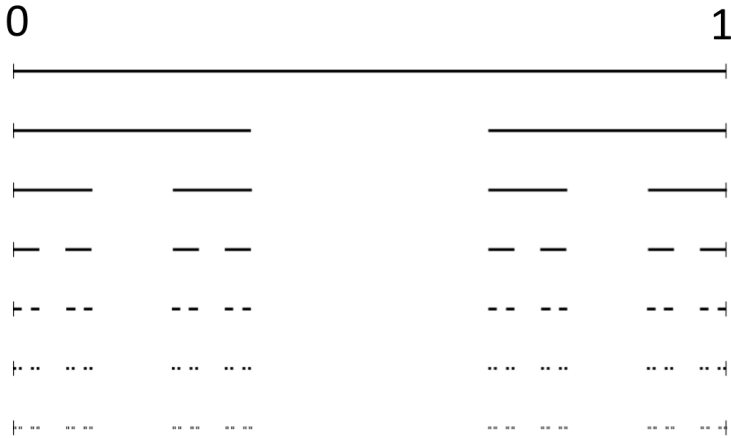
$$D = \lim_{\epsilon \rightarrow 0} \frac{\log N(\epsilon)}{\log(1/\epsilon)}$$

- 面積Sの局面

$$N(\epsilon) = S \cdot \epsilon^{-2}$$

$$D = \lim_{\epsilon \rightarrow 0} \frac{\log(S \cdot \epsilon^{-2})}{\log(1/\epsilon)} = 2$$

# Box-counting dimension of Cantor set



$$D = \lim_{\epsilon \rightarrow 0} \frac{\log N(\epsilon)}{\log(1/\epsilon)}$$

$$\epsilon = 1/3, N(\epsilon) = 2$$

$$\epsilon = (1/3)^2, N(\epsilon) = 2^2$$

⋮

$$\epsilon = (1/3)^m, N(\epsilon) = 2^m$$

$$D = \lim_{\epsilon \rightarrow 0} \frac{\log(2^m)}{\log(1/3)^{-m}} = \frac{\log 2}{\log 3} \sim 0.63$$

# Box-counting dimension of Cantor set

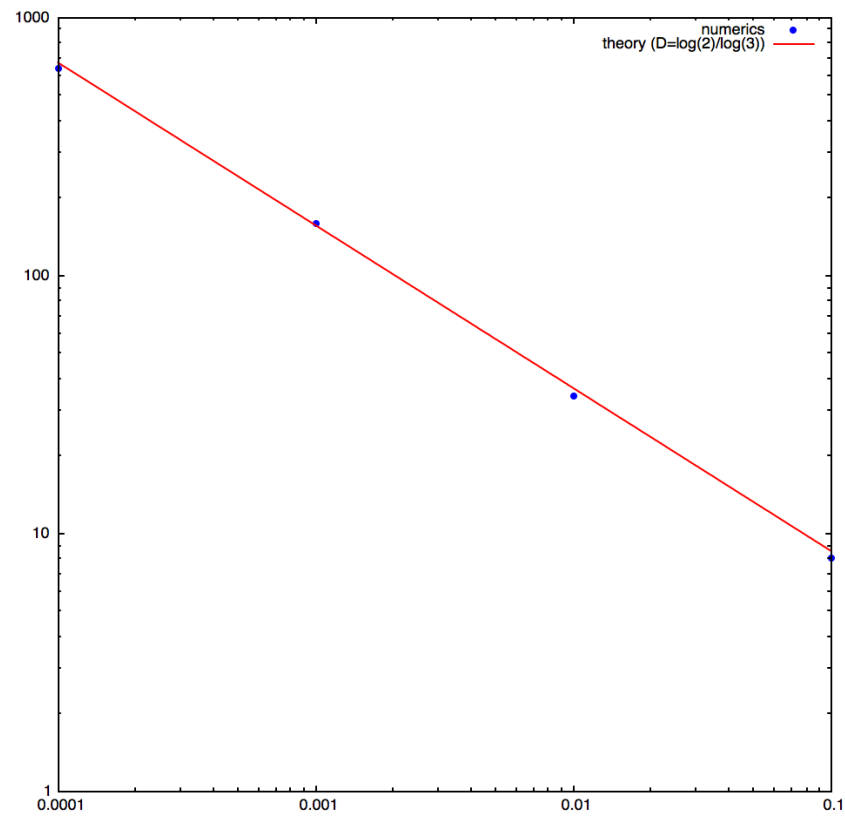
## Maxima code

```
array(m,4); for i:1 thru 4 do m[i]:10^i;
array(box,4); for i:1 thru 4 do box[i]:0;
array(flag,m[4]); for i:1 thru m[4] do flag[i]:0;

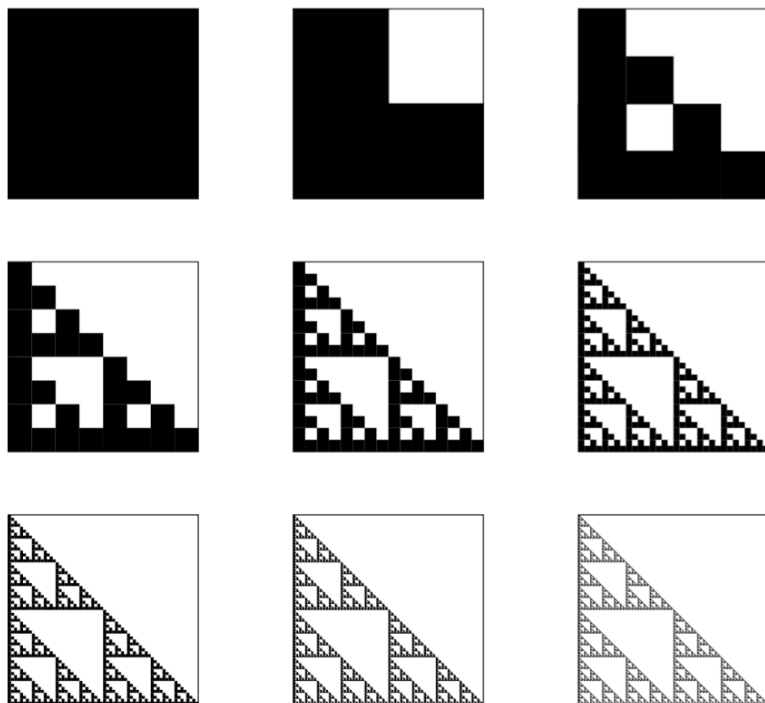
for j:1 thru 4 do (block(
  for i:1 thru m[j] do flag[i]:0,
  for i:n/2 thru n do flag[entier(x[i]*m[j])+1]:flag[entier(x[i]*m[j])+1]+1,
  for i:1 thru m[j] do if(flag[i]>0) then box[j]:box[j]+1)
)$

db:makelist([1/m[i],box[i]],i,1,4)$
dh:log(2)/log(3);
plot2d([[discrete,db],2*x^(-dh)],[x,1/10000,1/10],
[style,[points,1],lines],[legend, "numerics", "theory (D=log(2)/log(3))"],
same_xy,[gnuplot_preamble, "set logscale xy"])]$
```

# Box-counting dimension of Cantor set



# Box-counting dimension of Sierpinski gasket



$$D = \lim_{\epsilon \rightarrow 0} \frac{\log N(\epsilon)}{\log(1/\epsilon)}$$

$$\epsilon = 1/2, N(\epsilon) = 3$$

$$\epsilon = (1/2)^2, N(\epsilon) = 3^2$$

⋮

$$\epsilon = (1/2)^m, N(\epsilon) = 3^m$$

$$D = \lim_{\epsilon \rightarrow 0} \frac{\log(3^m)}{\log(1/2)^{-m}} = \frac{\log 3}{\log 2} \sim 1.54$$



# Box-counting dimension of Sierpinski gasket

Maxima code

```
array(m,3);
for i:1 thru 3 do m[i]:10^i;array(box,3);
for i:1 thru 3 do box[i]:0;
array(flag,m[3],m[3]);
for i:1 thru m[3] do (for j:1 thru m[3] do flag[i,j]:0);

for k:1 thru 3 do block(
  for i:1 thru m[k] do (for j:1 thru m[k] do flag[i,j]:0),
  for i:n/2 thru n do (for j:n/2 thru n do
    flag[entier(x[i]*m[k])+1,entier(y[j]*m[k])+1]:flag[entier(x[i]*m[k])+1,entier(y[j]*m[k])+1]+1),
  for i:1 thru m[k] do if(flag[i,j]>0) then box[k]:box[k]+1
)$

db:makelist([1/m[i],box[i]],i,1,3)$
dh:log(3)/log(2);
plot2d([[discrete,db],2*x^(-dh)],[x,1/1000,1/10],[style,[points,1],lines],[legend, "numerics",
"theory (D=log(3)/log(2))"],same_xy,[gnuplot_preamble, "set logscale xy"])]$
```