From Brain Waves to Mathematics of Fractals

- The beauty of numbers behind irregular functions -

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Nara Women's University, November 2009

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What can I do for them?

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What can I do for them?

• Medical doctor?

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- Medical doctor?
- Mathematician?

Sorry....no patience..



What can I do for them?

- Medical doctor?
- Mathematician?
- Brain scientist?

Sorry....no patience.. How can I help?



What can I do for them?

- Medical doctor?
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- Brain scientist?

Sorry....no patience.. How can I help? It might be interesting!?



• Why is it difficult to analyze functions like brain waves?

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- Even if a part is enlarged, the complexity of the data is not reduced.

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- The methods of classical calculus can not be applied!

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- Why is it difficult to analyze functions like brain waves?
- Even if a part is enlarged, the complexity of the data is not reduced.
- The methods of classical calculus can not be applied!

My research dream

Find new techniques to analyze irregular functions like brain waves!

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Self-similarity

The geometric characterization of the simplest fractal is self-similarity: the shape is made of smaller copies of itself. The copies are similar to the whole.

Examples of fractals



- The simplest fractals are constructed by iteration. For example, start with a filled-in triangle and iterate this process:
- For every filled-in triangle, connect the midpoints of the sides and remove the middle triangle. Iterating this process produces, in the limit, the Sierpinski Gasket.
- The gasket is self-similar.



Extention of self-similarity

- Self-similarity can be extended to allow the pieces to look like the whole in some sense.
- The right window is a rescaling of the x-axis by a factor of 4, and the y-axis by a factor of 2. The right picture has about the same distribution of jumps as the left.



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Examples

Stock price movement?



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Examples

Stock price movement? Coastline?



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Examples

Stock price movement? Coastline? Mountain?

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Examples Stock price movement? Coastline? Mountain? Tree?



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Examples

Stock price movement? Coastline? Mountain? Tree? Female!

Let the binary expansion of $x \in [0,1]$ be

$$x = \sum_{k=1}^{\infty} \epsilon_k 2^{-k}, \qquad \epsilon_k = \epsilon_k(x) \in \{0, 1\}.$$

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Examples

• If $x \in [0,1]$ is a dyadic point, there are two ways to express:

$$\frac{1}{2} = .011111 \dots = .100000 \dots$$

 If x ∈ [0, 1] is a rational number, the binary expansion is either terminating or repeating:

$$\frac{3}{8} = .011, \qquad \frac{1}{3} = .010101010101 \dots = .\overline{01}.$$

Lebesgue's singular function: unfair coin tossing

- Imagine flipping a coin.
- Suppose this coin has probability a of landing heads and probability 1 a of landing tails. $(a \neq 1/2)$
- Determine a number $t \in [0, 1]$ by flipping the coin infinitely many times:

$$t = 0.\epsilon_1 \epsilon_2 \dots = \sum_{k=1}^{\infty} \epsilon_k 2^{-k},$$

where ϵ_k is 0 if the kth flip is heads, or 1 if it is tails.

 Define Lebesgue's singular function as the probability distribution

$$L_a(x) := Prob(t \le x).$$

Functional equation

Theorem (De Rham, 1957)

 $L_a(x)$ is the unique continuous solution of the functional equation

$$L_a(x) = \begin{cases} aL_a(2x), & 0 \le x \le \frac{1}{2}, \\ (1-a)L_a(2x-1) + a, & \frac{1}{2} \le x \le 1, \end{cases}$$

where 0 < a < 1, and $a \neq 1/2$.



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Property of Lebesgue's singular function



Figure: Lebesgue's singular function (a = 0.3)

Theorem (Salem, 1943)

 $L_a(x)$ is strictly increasing and $L'_a(x) = 0$ almost everywhere.

Definition (Differentiability)

A function f if differentiable at x = a, if there exist finite numbers M and N such that

$$f'_{+}(a) := \lim_{h \to 0+} \frac{f(a+h) - f(a)}{h} = M,$$

$$f'_{-}(a) := \lim_{h \to 0^{-}} \frac{f(a+h) - f(a)}{h} = N,$$

and M = N.

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Question 1

- Can I give a concrete example of $x \in [0,1]$ where $L'_a(x) = 0$?
- What set of $x \in [0,1]$ have $L'_a(x) = 0$?

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Question 1

- Can I give a concrete example of $x \in [0,1]$ where $L'_a(x) = 0$?
- What set of $x \in [0,1]$ have $L'_a(x) = 0$?

For instance,

- x = 1/2?
- x = 1/3?
- x = 3/7?

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Definition

For
$$x = \sum_{k=1}^{\infty} \epsilon_k(x) 2^{-k}$$
, define

$$D_1(x) := \lim_{n \to \infty} \frac{1}{n} \sum_{k=1}^n \epsilon_k(x) = \lim_{n \to \infty} \frac{|\{1 \le k \le n : \epsilon_k = 1\}|}{n}$$

provided the limit exists. Put

$$D_0(x) := 1 - D_1(x) = \lim_{n \to \infty} \frac{|\{1 \le k \le n : \epsilon_k = 0\}|}{n}$$

 $D_i(x)$ is the density of the digit i in the binary expansion of x.

Examples

•
$$x = 1/3?$$

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Examples

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$$x = 1/3? \rightarrow x = .\overline{01}$$

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Examples

•
$$x = 1/3? \to x = .\overline{01} \to D_0(x) = D_1(x) = 1/2.$$

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Examples

•
$$x = 1/3? \rightarrow x = .01 \rightarrow D_0(x) = D_1(x) = 1/2.$$

• $x = 3/7?$

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Definition

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$$x = \sum_{k=1}^{\infty} \epsilon_k(x) 2^{-k}$$
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 $D_i(x)$ is the density of the digit *i* in the binary expansion of *x*.

Examples

•
$$x = 1/3? \to x = .\overline{01} \to D_0(x) = D_1(x) = 1/2.$$

• $x = 3/7? \to x = .\overline{011}$

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Density of 0 and 1 in the binary expansion of x

Definition

For
$$x = \sum_{k=1}^{\infty} \epsilon_k(x) 2^{-k}$$
, define

$$D_1(x) := \lim_{n \to \infty} \frac{1}{n} \sum_{k=1}^n \epsilon_k(x) = \lim_{n \to \infty} \frac{|\{1 \le k \le n : \epsilon_k = 1\}|}{n}$$

provided the limit exists. Put

$$D_0(x) := 1 - D_1(x) = \lim_{n \to \infty} \frac{|\{1 \le k \le n : \epsilon_k = 0\}|}{n}$$

 $D_i(x)$ is the density of the digit *i* in the binary expansion of *x*.

Examples

•
$$x = 1/3? \to x = .\overline{01} \to D_0(x) = D_1(x) = 1/2.$$

•
$$x = 3/7? \rightarrow x = .\overline{011} \rightarrow D_0(x) = 1/3, D_1(x) = 2/3.$$

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Theorem (Kawamura, 2009)

If $x \in [0,1]$ is dyadic, then $L'_a(x)$ does not exist, since

 $L_{a+}'(x) \neq L_{a-}'(x).$

If $x \in [0, 1]$ is not dyadic and
• $D_0(x) = D_1(x)$, then $L'_a(x) = 0$.
• $D_0(x) \neq D_1(x)$, then $L'_a(x) = \begin{cases} 0, & \text{if } a^{D_0(x)}(1-a)^{D_1(x)} < 1/2, \\ +\infty, & \text{if } a^{D_0(x)}(1-a)^{D_1(x)} > 1/2. \end{cases}$

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Answer for Question 1 (cont.)

Examples

•
$$x = 1/2?$$

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Answer for Question 1 (cont.)

Examples

•
$$x = 1/2? \rightarrow 1/2$$
 is a dyadic point!

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• $x = 1/2? \rightarrow 1/2$ is a dyadic point! $\rightarrow L'_a(1/2)$ does not exist.

• x = 1/3?

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•
$$x = 3/7? \rightarrow D_0(x) = 1/3, D_1(x) = 2/3.$$

$$\rightarrow L_a'(3/7) = \begin{cases} 0, & \text{if} \quad a^{1/3}(1-a)^{2/3} < 1/2, \\ +\infty, & \text{if} \quad a^{1/3}(1-a)^{2/3} > 1/2. \end{cases}$$

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Takagi's nowhere differentiable function



Definition (Takagi's function, 1903)

$$T(x) := \sum_{n=1}^{\infty} \frac{1}{2^n} \phi^{(n)}(x), \quad 0 \le x \le 1,$$

where

$$\phi(x) := \begin{cases} 2x, & 0 \le x \le 1/2, \\ 2 - 2x, & 1/2 \le x \le 1. \end{cases}$$

 ϕ is a typical chaotic dynamical system on [0,1].

Question 2

We know that Takagi's function is nowhere differentiable. But, at which $x \in [0,1]$ does T(x) have an infinite derivative?

Note!

Recall that if $T'(x) = \pm \infty$, the graph of T has a vertical tangent line at x.

Answer to Question 2

• Let I_n and O_n be the number of 1's and 0's, respectively in the first n binary digits of x.

• Let
$$D_n := O_n - I_n$$
.

Theorem (Begle & Ayres, 1937)

If $x \in [0,1]$ is dyadic, then T'(x) does not exist, since

$$T'_+(x) \neq T'_-(x).$$

2 If $x \in [0,1]$ is not dyadic, then

$$T'(x) = \begin{cases} +\infty, & \text{if } \lim_{n \to \infty} D_n = +\infty, \\ -\infty, & \text{if } \lim_{n \to \infty} D_n = -\infty, \\ \text{does not exist,} & \text{if } \lim_{n \to \infty} D_n \text{ does not exist.} \end{cases}$$

Recall that in classical calculus, the chain rule is used to compute the derivative of the composition of two differentiable functions: If

$$h(x) = f(g(x)),$$

then

$$h'(x) = f'(g(x))g'(x).$$

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Question 3

But what about a function such as $T(L_a^{-1}(x))$: the composition of Takagi's function and the inverse of Lebesgue's singular function?

Put

$$f(x) = T(x),$$
 $g(x) = L_a^{-1}(x),$

and

$$h(x) = f(g(x)) = T(L_a^{-1}(x)).$$

If we try to use the chain rule to compute h'(x), we may run into one of the indeterminate products

$$+\infty \cdot 0$$
, or $-\infty \cdot 0$.

How can we overcome this problem?

Put

$$f(x) = T(x),$$
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How can we overcome this problem?

Answer

Wait for my next paper, please!

Question 4

Takagi's function T(x) is nowhere differentiable. Then how can we find the maximum points?

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Takagi's function T(x) is nowhere differentiable. Then how can we find the maximum points?

Theorem (Kahane, 1959)

- The maximum value of T(x) is 2/3.
- The binary expansion of any maximum point of T(x) is

$$x = . \begin{cases} 01 & 01 & 01 & 01 \\ or & 0r & 0r & 0r \\ 10 & 10 & 10 & 10 \end{cases} \begin{pmatrix} 01 & 0r & 01 \\ or & 0r & 0r \\ 10 &$$

Theorem (Hata-Yamaguti, 1984)

Takagi's function and Lebesgue's singular function are related by

$$T(x) = \frac{1}{2} \left. \frac{\partial L_a(x)}{\partial a} \right|_{a=\frac{1}{2}}$$

Why not keep differentiating?

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Why not keep differentiating?

Definition (*n*-th partial derivatives of $L_a(x)$)

$$T_n(x) := \frac{1}{n!} \left. \frac{\partial^n L_a(x)}{\partial a^n} \right|_{a=\frac{1}{2}}, \qquad n = 1, 2, 3, \dots$$

n-th partial derivatives of $L_a(x)$.



Figure: Graphs of T_1 (top left), T_2 (top right), T_3 (bottom left) and T_4 (bottom right).

Theorem (Allaart-Kawamura, 2006)

For each $n \in \mathbf{N}$, $T_n(x)$ is continuous but nowhere differentiable.

Question 5

- What are the maximum values of T_n ?
- Where are they attained?

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Maximum of T_2



Theorem (A-K, 2006)

The binary expansion of any maximum point of $T_2(x)$ has the form:

Maximum of T_2



Theorem (A-K, 2006)

The binary expansion of any maximum point of $T_2(x)$ has the form:

$$x = .00 \begin{cases} 01 \\ or \\ 10 \end{cases} 01010101 \begin{cases} 01 \\ or \\ 10 \end{cases}$$

Maximum of T_3



Theorem (A-K, 2006)

The binary expansion of any maximum point of $T_3(x)$ in $[0, \frac{1}{2}]$ has the form:



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Extensive numerical computation suggested that

Conjecture

For each $n \ge 4$, T_n has only finitely many maximum points!

Self-similar sets in the complex plane

Consider a unique bounded continous solution $G_{\alpha}(x)$ of

$$G_{\alpha}(x) = \begin{cases} \alpha G_{\alpha}(2x), & 0 \le x < 1/2, \\ (1-\alpha)G_{\alpha}(2x-1) + \alpha, & 1/2 \le x \le 1, \end{cases}$$

where $\alpha \in \mathbf{C}$ such that $|\alpha| < 1$.

Self-similar sets in the complex plane

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where $\alpha \in \mathbf{C}$ such that $|\alpha| < 1$.

Remark

If $\alpha = a$, a real number, then

$$G_a(x) = L_a(x), \qquad 0 < a < 1, \quad a \neq 1/2.$$

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Properties of G_{α}

•
$$G_{\alpha}:[0,1] \rightarrow \mathbf{C}$$
,

•
$$\overline{G_{\alpha}([0,1])}$$
: self-similar set on C

Example: if $\alpha = 1/2 + 1/2i$, $\overline{G_{\alpha}([0,1])}$ is Levy's dragon curve.



Figure: Graphs of G_{α} (top left), view from the top (top right), from a different angle (bottom left), Levy dragon curve (bottom right).

Observation

Each coordinate function is somewhat similar to Takagi's function!

This is no surprise, because...

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It seems that I have enjoyed exploring the wonders of irregular functions, but...

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• Did I forget about my dream?

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- Did I forget about my dream?
- Where are the applications?
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Brain science (Tsuda and Yamaguchi, 2006)

Self-similar functions whose graphs look remarkably like $G_{\alpha}(x)$ appear in neural systems!

Message to future female scientists

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