
An Introduction to Dynamical Systems and Fractals: 2

David Broomhead
The School of Mathematics and
Centre for Interdisciplinary Computational
and Dynamical Analysis (CICADA),
The University of Manchester.

**Funded by the Engineering and Physical Sciences Research Council (EPSRC)
and the University of Manchester.**

Overview

In yesterday's talk we covered the first two parts of the plan

- Some properties of the Cantor set
- Ways to characterise fractals
 - Hyperbolic iterated function systems (IFSs)
 - Semi-infinite strings of symbols seen as a metric space
 - Topological equivalence with the Cantor set
 - Non-hyperbolic IFSs
 - Digital forcing/controlling of an inverted pendulum

Now let's move on to discuss iterated function systems.

● Overview

- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

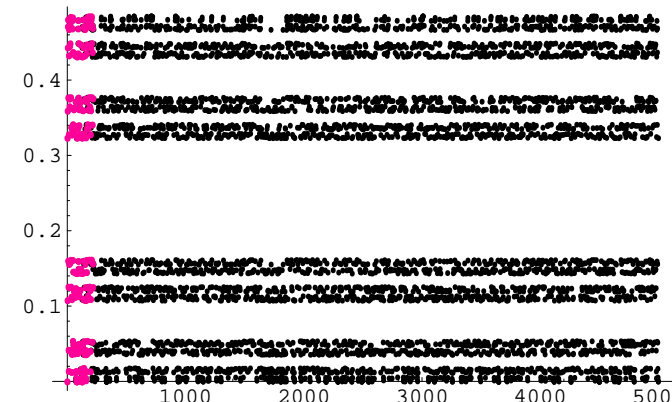
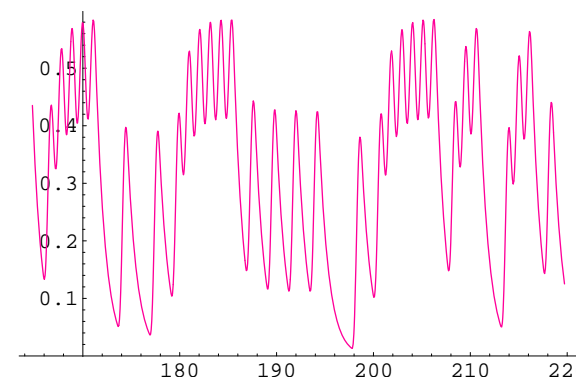
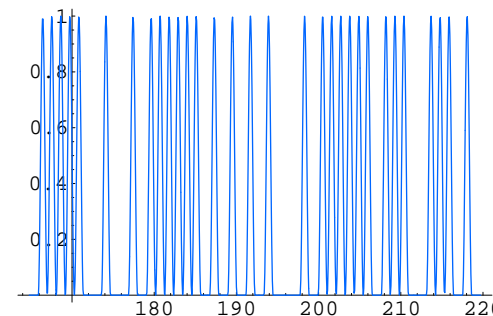
A Simple Digital Channel

- First order system driven by a clocked random pulse sequence:

$$\frac{dy}{dt} = -\gamma y + \xi(t)$$

$$\xi(t) = \sum_p a_p g(t - p\tau)$$

- $\{a_p\} \in \{0, 1\}^{\mathbb{N}}$ are the input symbols
- g is supported on $(0, \tau)$.
- Symbols input at constant rate, τ^{-1} .
- In the examples, g is a raised cosine.
- In the numerical example $\gamma\tau = \log 3$
- Plotting the samples $\{y_n \stackrel{\text{def}}{=} y(n\tau)\}$ gives a Cantor set.



- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

What is going on here?

- Integrate the ODE for one sample period, τ .

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

What is going on here?

- Integrate the ODE for one sample period, τ .
- Depending on the symbol the output changes as:

$$y \mapsto f_0(y) = \lambda y$$

$$y \mapsto f_1(y) = \lambda y + b$$

where $\lambda = e^{-\gamma\tau}$ and $b = e^{-\gamma\tau} \int_0^\tau e^{\gamma t} g(t) dt$

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

What is going on here?

- Integrate the ODE for one sample period, τ .
- Depending on the symbol the output changes as:

$$y \mapsto f_0(y) = \lambda y$$

$$y \mapsto f_1(y) = \lambda y + b$$

where $\lambda = e^{-\gamma\tau}$ and $b = e^{-\gamma\tau} \int_0^\tau e^{\gamma t} g(t) dt$

- The sampled output is given by random composition

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

What is going on here?

- Integrate the ODE for one sample period, τ .
- Depending on the symbol the output changes as:

$$y \mapsto f_0(y) = \lambda y$$

$$y \mapsto f_1(y) = \lambda y + b$$

where $\lambda = e^{-\gamma\tau}$ and $b = e^{-\gamma\tau} \int_0^\tau e^{\gamma t} g(t) dt$

- The sampled output is given by random composition
- For a random sequence $\{a_0, \dots, a_p, \dots\} \in \{0, 1\}^{\mathbb{N}}$ the sequence of output values is $\{y_1, y_2, y_3, \dots\}$ where:

$$y_1 = f_{a_0}(y_0)$$

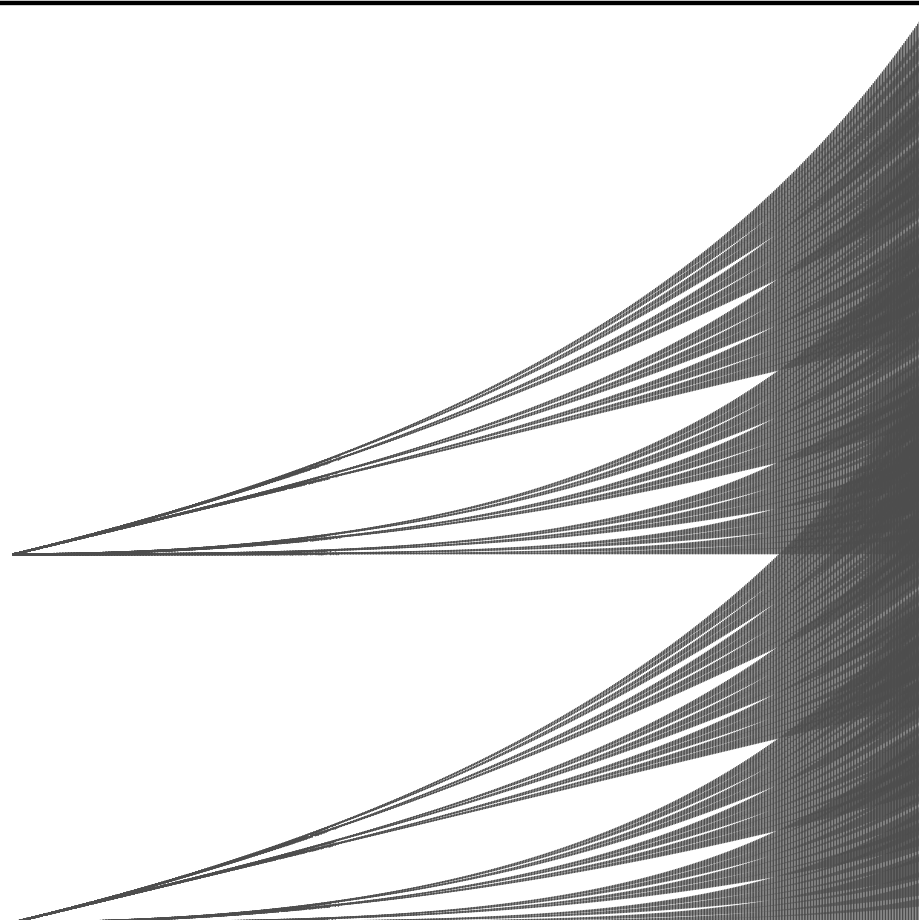
$$y_2 = f_{a_1}(y_1) \quad \text{and so on}$$

- Generally, $y_n = f_{a_{n-1}} \circ \dots \circ f_{a_1} \circ f_{a_0}(y_0)$

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

Parameter dependence

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion



- The channel example: rescale $y \mapsto y/b$ to get:

$$\{y \mapsto \lambda y, y \mapsto \lambda y + 1 : \lambda = e^{-\gamma\tau} \in [0, 1)\}$$

- Plot: random iterates (plotted vertically) for each λ

The gasket examples

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

- The gasket examples can be thought of as IFSs
- Let's call the set of vertices of the triangle $P = \{p_1, p_2, p_3\}$. Then we have three maps that can be applied:

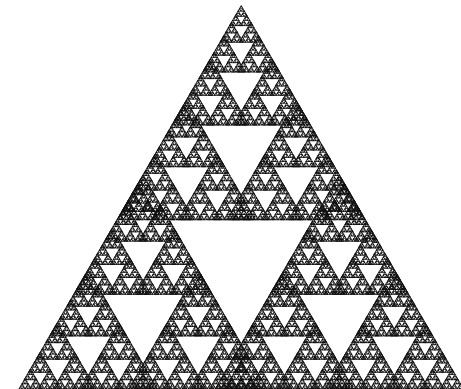
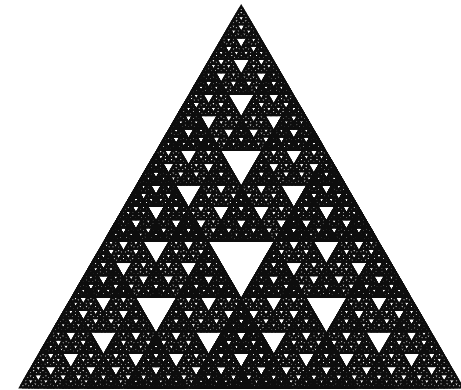
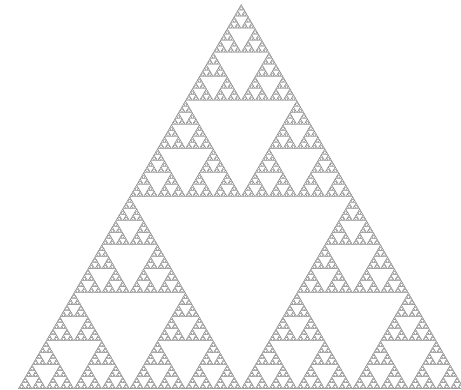
$$x \mapsto f_i(x) = s(x - p_i) + p_i$$

- The random walk is given by random composition of these.
- For a random choices of the vertices $\{i_0, \dots, i_n, \dots\} \in P^{\mathbb{N}}$ the sequence of point visited in the plane is $\{x_1, x_2, x_3, \dots\}$ where:

$$x_1 = f_{i_0}(x_0)$$

$$x_2 = f_{i_1}(x_1) \quad \text{and so on}$$

- So that $x_2 = f_{i_1} \circ f_{i_0}(x_0)$ etc.



The symbol space

- We have been speaking of spaces $\Sigma = \mathcal{A}^{\mathbb{N}}$ which consists of (all) semi-infinite strings of symbols from \mathcal{A} , a finite alphabet.
- This can be made into a metric space, say, by introducing

$$d(a, a') = 2^{-\rho(a, a')}$$

where $\rho(a, a')$ is the maximum length of substrings starting at the left, over which the strings a and a' agree.

- It will be natural to think of the left shift dynamics $\sigma : \Sigma \rightarrow \Sigma$ on this space
- We will also be interested in the inverse of this the right shift

$$\sigma^{-1}a = \{ \sigma_a^{-1}a = (a, a) \mid a \in \mathcal{A} \}$$

- For the application, think of a string a as the history of inputs to the system.

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

Hyperbolic Iterated Function Systems

- Let \mathcal{C} be the set of nonempty compact subsets of a complete metric space, (\mathbf{X}, \mathbf{d})

- Define the map $F : \mathcal{C} \rightarrow \mathcal{C}$

$$F(U) = \bigcup_{a=1}^{|\mathcal{A}|} f_a(U)$$

\mathcal{A} is a finite alphabet and the maps $\{f_a : a \in \mathcal{A}\}$ act on \mathbf{X} .

- If each of the $\{f_a : a \in \mathcal{A}\}$ is a contraction mapping:

$$\mathbf{d}(f_a(x) - f_a(x')) \leq c_a \mathbf{d}(x - x') \quad \text{with } c_a < 1 \quad \text{for every } x, x' \in \mathbf{X}$$

- Then there is a set K which is the unique fixed point of F

$$K = \bigcup_{a=1}^{|\mathcal{A}|} f_a(K)$$

- For any $U \in \mathcal{C}$, $F^k(U) \rightarrow K$ in the Hausdorff metric.

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

Addressing K

- In the case of two symbols $\mathcal{A} = \{0, 1\}$, K satisfies

$$K = f_0(K) \cup f_1(K)$$

- The maps are contractions so $f_0(K)$ and $f_1(K)$ are two smaller copies of K
- We can rewrite the K s on the right hand side

$$K = f_0(f_0(K)) \cup f_0(f_1(K)) \cup f_1(f_0(K)) \cup f_1(f_1(K))$$

- Now K is seen as the union of 4 even smaller copies of itself
- The process is sometimes called **backward iteration**
- Consider the taking the following limit of this process

$$\bigcap_{n \geq 0} f_{a_0} \circ f_{a_1} \circ \dots \circ f_{a_n}(K)$$

- This converges uniformly to a single point in K which depends only on the infinite sequence $(a_0, a_1, \dots) \in \Sigma$.
- This defines a continuous surjection $\pi : \Sigma \rightarrow K$.

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

IFSs with overlaps

- In the case of two symbols $\mathcal{A} = \{0, 1\}$, K satisfies

$$K = f_0(K) \cup f_1(K)$$

- All points in $f_0(K)$ have "0" as the first symbol in their addresses, and all points in $f_1(K)$ have "1" as their first symbol
- If $f_0(K) \cap f_1(K) \neq \emptyset$ then there are points which have at least two addresses, one beginning with "0" and one beginning with "1".
- Digital channel example

$$y \mapsto f_0(y) = \lambda y$$

$$y \mapsto f_1(y) = \lambda y + b$$

- If $f_0([0, b/(1 - \lambda)]) \cap f_1([0, b/(1 - \lambda)]) \neq \emptyset$ then $K = [0, b/(1 - \lambda)]$ and so we have overlap
- Condition for overlap is then $b \leq \lambda b/(1 - \lambda) \iff \lambda \geq 1/2$

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

The channel example and Cantor sets

■ Digital channel example

$$y \mapsto f_0(y) = \lambda y$$

$$y \mapsto f_1(y) = \lambda y + b$$

■ If $\lambda < 1/2$ we have the strong separation condition

$$f_0(K) \cap f_1(K) = \emptyset$$

■ This implies the open set condition.

■ It is also true that $\pi : \Sigma \rightarrow K$ is homeomorphism

■ The middle thirds Cantor set is therefore topologically conjugate to (Σ, d)

■ So we can find the Hausdorff dimension of K using the result for self-similar sets satisfying the open set condition:

$$\dim_H(K) = \dim_B(K) = \frac{\log 2}{\log \lambda^{-1}} < 1$$

■ So for all $\lambda < 1/2$ the attractor K is totally disconnected

■ All these attractors are therefore conjugate to the Cantor set.

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

Forward iteration

- The iteration process represented by

$$x_n = f_{a_{n-1}} \circ \dots \circ f_{a_1} \circ f_{a_0}(x_0)$$

is known as **forward iteration**

- Think of $\mathbf{a} = (a_{-1}, a_{-2}, a_{-3} \dots) \in \Sigma$ as the history of symbols input to the channel .

- We are currently at

$$x = \pi(\mathbf{a}) = \bigcap_{n \geq 1} f_{a_{-1}} \circ f_{a_{-2}} \circ \dots \circ f_{a_{-n}}(K)$$

- If the next input is $a_0 \in \mathcal{A}$, so we move to $\mathbf{a}' = (a_0, \mathbf{a}) \in \sigma^{-1}\mathbf{a}$

- And in \mathbf{x} we move to $x' = f_{a_0}(x)$ by forward iteration

- But $x' = \pi((a_0, \mathbf{a})) = \bigcap_{n \geq 0} f_{a_0} \circ f_{a_{-1}} \circ \dots \circ f_{a_{-n}}(K)$

- We have a (semi-)conjugacy between the IFS dynamics on K and the right shift on Σ

$$f_{a_0} \circ \pi = \pi \circ \sigma_{a_0}^{-1}$$

where $\sigma_{a_0}^{-1}(\mathbf{a}) = (a_0, \mathbf{a})$ is a possible value of the right shift.

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- **Forward iteration**
- Conclusion

Conclusion

- Overview
- A Simple Digital Channel
- What is going on here?
- Parameter dependence
- The gasket examples
- The symbol space
- Hyperbolic Iterated Function Systems
- Addressing K
- IFSs with overlaps
- The channel example and Cantor sets
- Forward iteration
- Conclusion

We have completed the first 5 parts of the plan:

- Some properties of the Cantor set
- Ways to characterise fractals
- Hyperbolic iterated function systems (IFSs)
- Semi-infinite strings of symbols seen as a metric space
- Topological equivalence with the Cantor set
- Non-hyperbolic IFSs
- Digital forcing/controlling of an inverted pendulum