

Dimensional properties of self-similar and self-affine fractals

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The Chinese University of Hong Kong

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Joint work with De-Jun Feng

What are fractals?

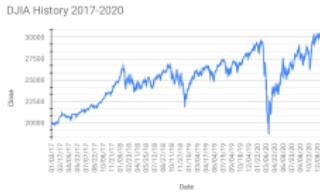
- Fractals: geometric objects with ‘self-similarity’ at arbitrarily small scales.
- Fractals are everywhere.



Romanesco broccoli



Islamic geometric patterns

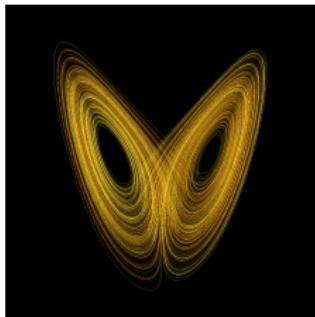


DJIA index

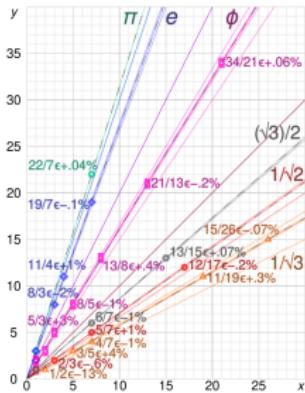
Table: Some fractals in nature, art and society.¹

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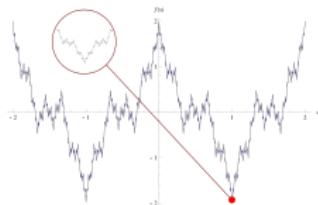
- **Applications:** art design, computer graphics, data compression, modeling real-world phenomena...
- **Theoretical research:** dynamical systems, number theory, harmonic analysis, probability theory...



Lorenz attractor

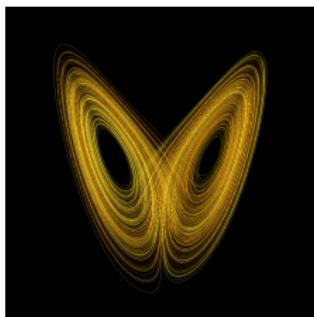


Numbers defined by
Diophantine properties

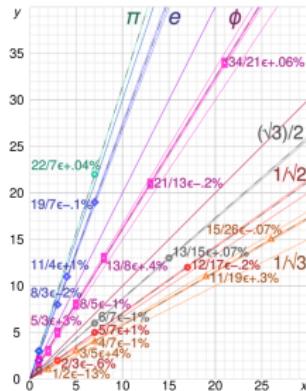


Graphs of
Weierstrauss functions

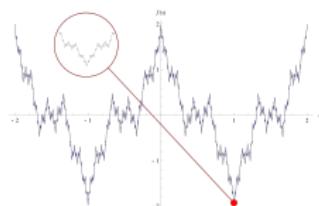
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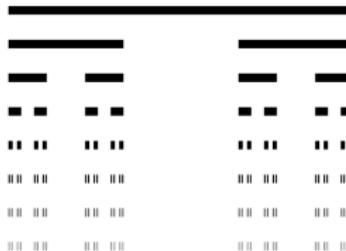
It is important to understand the **geometric** properties of fractals both in **practice** and **theory**.

Dimension theory

- Fractal **dimensions** are the most important notions to study the '**size**' of fractals in a rigorous way.
- A **dimension** is a **number** (usually not an integer) concerning how the fractal fills up space in small scales.

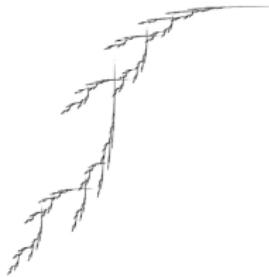
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- A **dimension** is a **number** (usually not an integer) concerning how the fractal fills up space in small scales.
- There are **many** different notions of **dimensions** including:
 - Hausdorff dimension \dim_H ;
 - box dimension \dim_B .
- For the **middle-third Cantor set** C ,

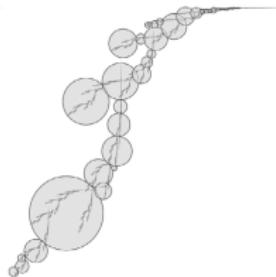


$$\dim_H C = \dim_B C = \frac{\log 2}{\log 3}.$$

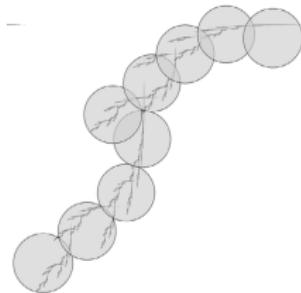
Hausdorff and box dimensions by **covers**:²



A self-affine set F



A cover \mathcal{E}_r for $\dim_H F$ by sets with diameters $\leq r$



A cover \mathcal{E}_r for $\dim_B F$ by sets with diameters $= r$

Hausdorff and box dimensions of a set F are respectively the **infimum** of the **exponents s** such that

$$\forall \varepsilon > 0, \exists r \rightarrow 0 \text{ and allowable cover } \mathcal{E}_r \text{ with } \sum_{E \in \mathcal{E}_r} |E|^s < \varepsilon,$$

where $|\cdot|$ denotes the diameter in Euclidean norm. Hence

$$0 \leq \dim_H F \leq \dim_B F \leq d \quad \text{for } F \subset \mathbb{R}^d.$$

²Figures by Fraser.

Self-similar and self-affine sets and measures

- By **iterated function system** (IFS) we mean a finite family of contracting affine maps

$$\mathcal{F} = \{f_j(x) = T_j x + a_j\}_{j=1}^m,$$

where T_j are invertible matrices on \mathbb{R}^d with $\|T_j\| < 1$, and $a_j \in \mathbb{R}^d$.

- The **self-affine set K** is the unique nonempty compact set such that

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- Given a probability vector $p = (p_j)_{j=1}^m$, the **self-affine measure μ** is the unique Borel probability measure such that

$$\mu = \sum_{j=1}^m p_j f_j \mu,$$

where $f_j \mu = \mu \circ f_j^{-1}$ denotes the **push-forward** of μ under f_j .

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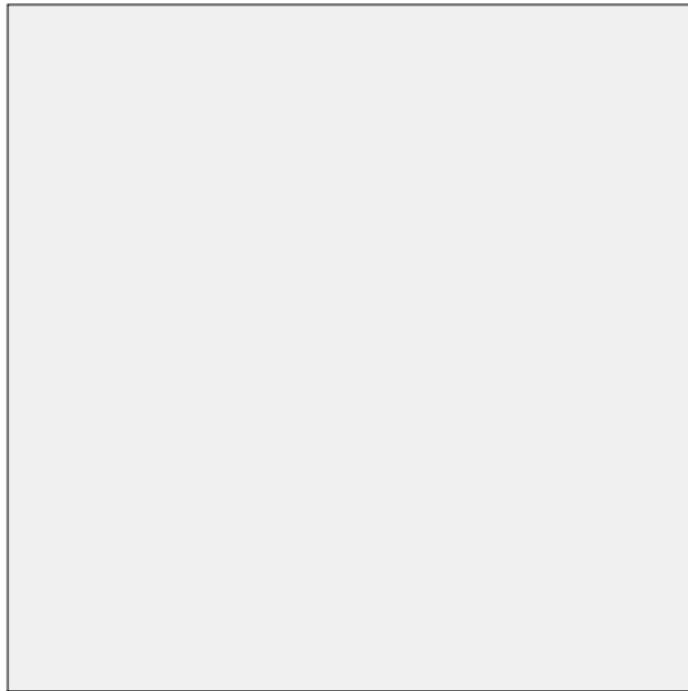
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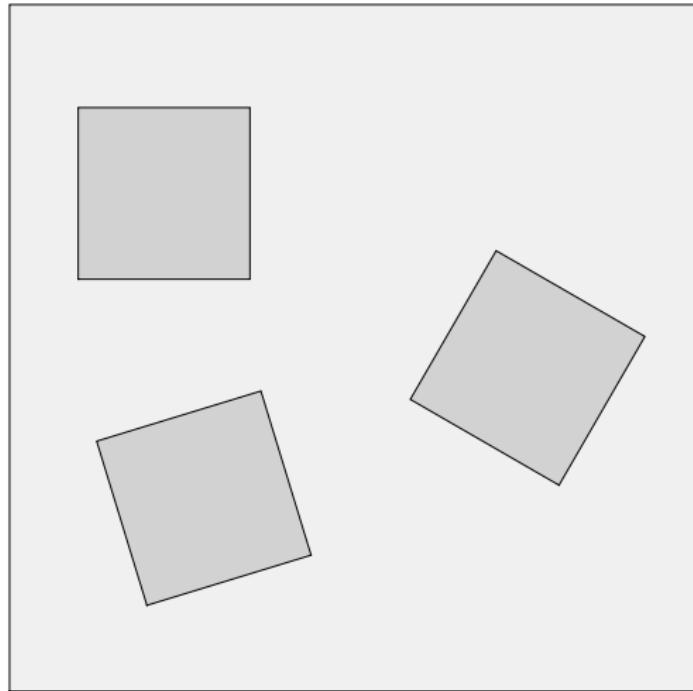
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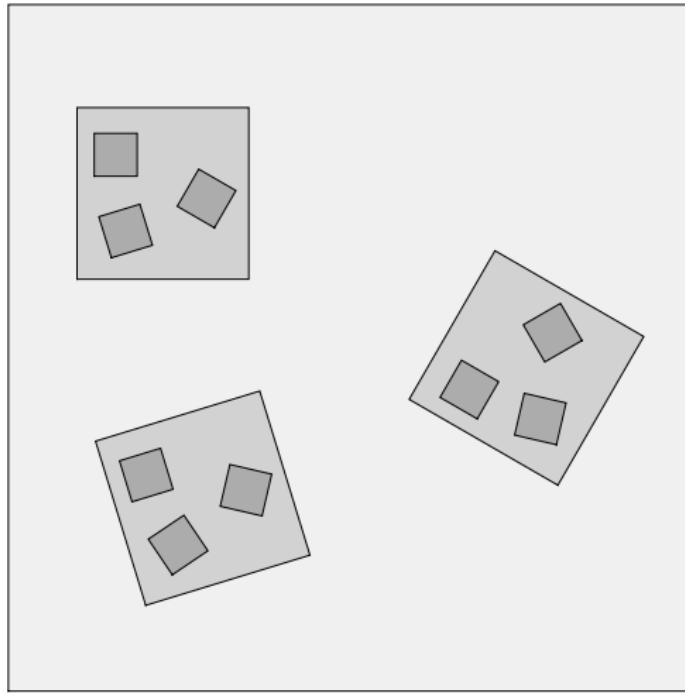
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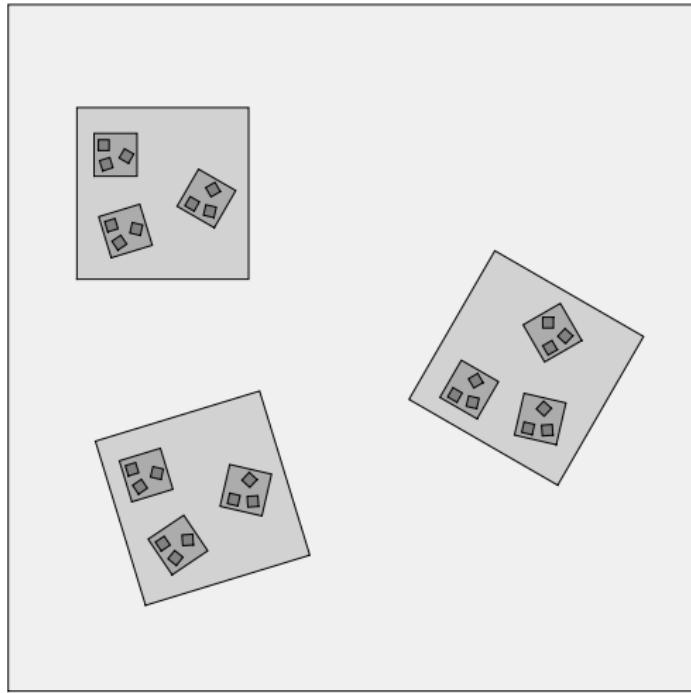
where $f_j \mu = \mu \circ f_j^{-1}$ denotes the **push-forward** of μ under f_j .

- If f_j are **similarities**, we call K a **self-similar set** and μ a **self-similar measure**.

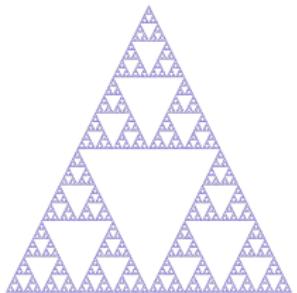




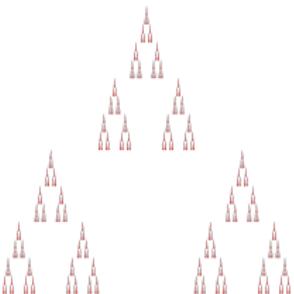




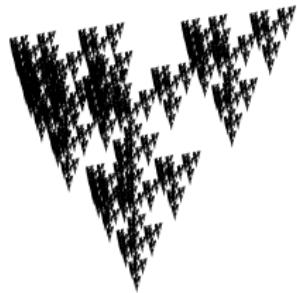




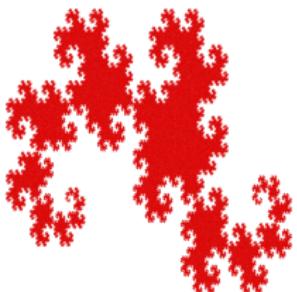
Sierpiński triangle



Bedford-McMullen carpet



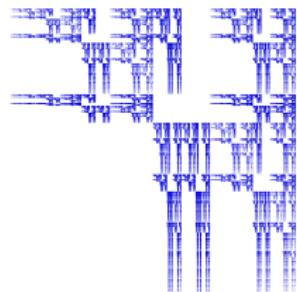
Typical self-affine set



Heighway dragon



Barnsley fern



Barański carpet

Table: Some examples of self-similar and self-affine sets³.

³Figures by the scripts at GitHub repo [zfengg/PlotIFS.jl](#) under MIT License.

The goal of this talk

To briefly explain our results about the dimensional properties of self-similar and self-affine sets and measures.

Estimates on the dimension of self-similar measures with overlaps

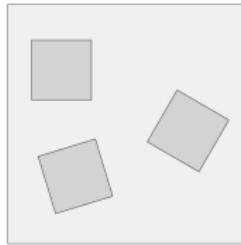
For a self-similar measure μ , the dimension of μ is

$$\dim \mu = \lim_{r \rightarrow 0} \frac{\log \mu(B(x, r))}{\log r} \quad \text{for } \mu\text{-a.e. } x.$$

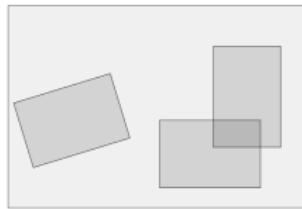
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no overlaps



overlapping

- With sufficient separation conditions, $\dim \mu$ is relatively well understood. There is good deal of work in this direction.
- It is central and challenging to determine the dimension of overlapping self-similar measures.

Lower bounds on $\dim \mu$

- We developed tools from **dynamical systems** and presented a method to estimate the dimension of **overlapping** self-similar measures **from below**.

Lower bounds on $\dim \mu$

- We developed tools from **dynamical systems** and presented a method to estimate the dimension of **overlapping** self-similar measures **from below**.
- A **uniform lower bound** on the dimension of **Bernoulli convolutions** μ_β which are self-similar measures associated with

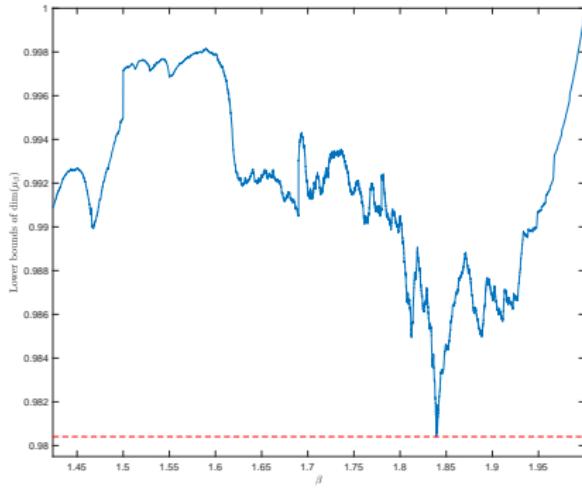
$$\{x/\beta \pm 1\}, \beta \in (1, 2) \quad \text{and} \quad (1/2, 1/2).$$

- Bernoulli convolutions have been studied since **1930s**. (**Erdős**, **Kahane**, **Garsia**,...)

Theorem (Feng and F, 2022)

$\dim \mu_\beta \geq 0.98040856$ for all $\beta \in (1, 2)$.

- (Hare and Sidorov, 2018) **0.82**.
- (Kleptsyn, Pollicott, and Vytnova, 2022) **0.96399** through a different approach.



For $\beta_3 \approx 1.839$ called the **tribonacci number** ($x^3 - x^2 - x - 1 = 0$),

$$\dim \mu_{\beta_3} = 0.98040931953 \pm 10^{-11}.$$

Recall our uniform lower bound: 0.98040856.

Conjecture (Feng and F, 2022)

$$\dim \mu_{\beta_3} = \inf_{\beta \in (1,2)} \dim \mu_\beta.$$

Upper bounds on $\dim \mu_\beta$ when β is Pisot

- When β is a **Pisot** number, e.g., the **golden ratio** $(\sqrt{5} + 1)/2$,
- we establish a **new relation** between $\dim \mu_\beta$ and the **entropy rate** $h(\eta)$ of some **equilibrium state** η ,

$$\dim \mu_\beta = \frac{h(\eta)}{\log \beta}.$$

- The distribution of η is given by some **products of matrices**.

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- The distribution of η is given by some **products of matrices**.
- Computable **upper bounds** on $\dim \mu_\beta$ in terms of the **conditional entropies** of η .

Example (Feng and F, 2022)

$\dim \mu_\alpha = 0.999995036 \pm 10^{-9}$, where $\alpha \approx 1.325$ is the largest root of $x^3 - x - 1 = 0$ (the smallest Pisot number called **plastic constant**).

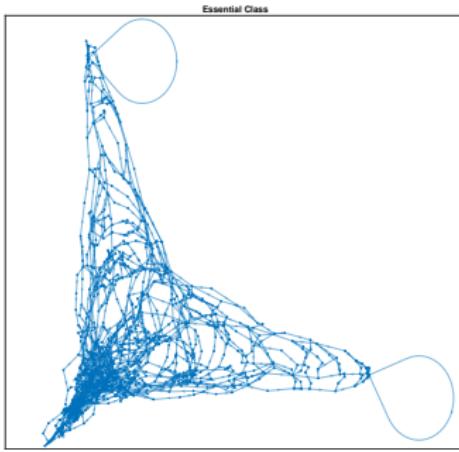


Figure: The directed graph for η in the previous example.

Dimension of homogeneous IFS with algebraic translations

- Let μ be a **self-similar measure** associated with

$$\mathcal{F} = \{f_j(x) = \lambda_j x + t_j\}_{j=1}^m \quad \text{and} \quad p = (p_j)_{j=1}^m.$$

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- A natural upper bound:

$$\dim \mu \leq \min \left\{ 1, \frac{H(p)}{\chi} \right\},$$

where $H(p)$ is the **entropy** and χ is the **Lyapunov exponent**.

- The equality holds under **sufficient separation** conditions.

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- The equality holds under **sufficient separation** conditions.
- We say \mathcal{F} has **exact overlaps** if $f_{i_1} \circ \dots \circ f_{i_n} = f_{j_1} \circ \dots \circ f_{j_n}$ for some **distinct** words $i_1 \dots i_n \neq j_1 \dots j_n \in \{1, \dots, m\}^n$.

Conjecture (exact overlaps conjecture)

If $\dim \mu < \min \{1, H(p)/\chi\}$, then \mathcal{F} has exact overlaps.

A version for self-similar **sets** was due to (Simon, 1996).

Recall the IFS $\{\lambda_j x + t_j\}_{j=1}^m$.

Significant progress in recent years:

- (Hochman, 2014) all λ_j and t_j are algebraic numbers.
- (Rapaport, 2022) only λ_j are algebraic numbers.
- (Varjú, 2019) $m = 2$ and $\lambda_j = \lambda \in (0, 1)$. (Bernoulli convolutions)
- (Rapaport and Varjú, 2024) $\lambda_j = \lambda \in (0, 1)$ and t_j are rational numbers.

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Theorem (Feng and F, 2024)

Suppose $\lambda_j = \lambda \in (-1, 1) \setminus \{0\}$ and t_j are **algebraic numbers**. If \mathcal{F} has **no exact overlaps**, then

$$\dim \mu = \min \left\{ 1, \frac{\sum_{j=1}^m p_j \log p_j}{\log |\lambda|} \right\}.$$

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The exact overlaps conjecture is still **open**!

Typical self-affine sets with nonempty interior

- Fix the linear part $\mathbf{T} = (T_1, \dots, T_m)$ with $\|T_j\| < 1/2$.
- Consider self-affine sets $K^{\mathbf{a}}$ depending on translations $\mathbf{a} \in \mathbb{R}^{dm}$.
- In 1988, Falconer introduced the affinity dimension, $\dim_{\text{AFF}} \mathbf{T}$.

Classical results

- (Falconer, 1988; Solomyak, 1998) For \mathcal{L}^{dm} -a.e. \mathbf{a} ,

$$\dim_H K^{\mathbf{a}} = \dim_B K^{\mathbf{a}} = \min \{d, \dim_{\text{AFF}} \mathbf{T}\}.$$

- (Jordan, Pollicott, and Simon, 2007) If $\dim_{\text{AFF}} \mathbf{T} > d$, then $\mathcal{L}^d(K^{\mathbf{a}}) > 0$ for \mathcal{L}^{dm} -a.e. \mathbf{a} .

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Question

How about the interior of typical $K^{\mathbf{a}}$?

Although this seems a rather fundamental question, it has hardly been studied.

We introduce a quantity

$$\gamma(\mathbf{T}) = \inf \left\{ \gamma \geq 0 : \sup_{n \geq 1} \sum_{|I|=n} \alpha_d(T_I)^\gamma |\det T_I| \leq 1 \right\},$$

which only depends on \mathbf{T} .

Theorem (Feng and F, 2023)

If $\gamma(\mathbf{T}) > d$, then $K^{\mathbf{a}}$ has nonempty interior for almost all \mathbf{a} .

Fourier transform + Self-affine transversality.

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Suppose $T_i T_j = T_j T_i$ for $1 \leq i, j \leq m$. If $\sum_{j=1}^m |\det T_j|^2 > 1$, then $K^{\mathbf{a}}$ has nonempty interior for almost all \mathbf{a} .

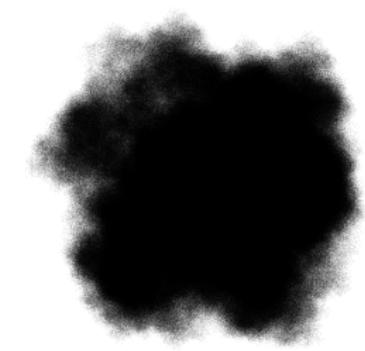
Symbolic representation + Steinhaus Theorem.



$\dim_{\text{AFF}} \mathbf{T} < 2$



$\dim_{\text{AFF}} \mathbf{T} > 2$



Our conditions satisfied

Table: Some numerical experiments and **an open question.**

- Intermediate dimensions were introduced by (Falconer, Fraser, and Kempton, 2020) to interpolate the Hausdorff and box dimensions.
- Impose $r^{1/\theta} \leq |E| \leq r$ ($0 \leq \theta \leq 1$) on the allowable covers.
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- Intermediate dimensions have seen interesting applications.

Theorem (F, 2023)

Let $\pi^{\mathbf{a}}: \Sigma \rightarrow \mathbb{R}^d$ the natural coding and $E \subset \Sigma$. For $0 < \theta \leq 1$ and $\mathcal{L}\text{-a.e. } \mathbf{a} \in \mathbb{R}^{md}$, the θ -intermediate dimensions of $\pi^{\mathbf{a}}(E) \subset K^{\mathbf{a}}$ are constants given by the capacity dimensions.

Results extended to the **generalized Φ -intermediate dimensions** introduced by (Banaji, 2023) in several other settings.

Replace $r^{1/\theta} \leq |E| \leq r$ with $\Phi(r) \leq |E| \leq r$.

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Suppose $\lim_{r \rightarrow 0} r^\varepsilon \log \Phi(r) = 0$ for all $\varepsilon > 0$. Then **Φ -intermediate dimensions** of

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- are **constant**.

These settings share a phenomenon called **transversality**.

Dimension coincidence for some affine-invariant sets

In **specific nonconformal** dynamical systems, **invariant sets** usually have **distinct** Hausdorff and box dimensions.

Theorem (F, 2024)

Let K be a compact subset of $\mathbb{T}^2 = \mathbb{R}^2/\mathbb{Z}^2$ invariant under the endomorphism $(x, y) \mapsto (nx, my) \pmod{1}$ ($n > m \geq 2$). Suppose the symbolic coding of K satisfies **weak specification**. The following statements are **equivalent**.

- A $\dim_H K = \dim_B K$.
- B $0 < \mathcal{H}^\varphi(K) < \infty$ for some gauge function φ .
- C $\dim \mu = \dim_H K$, where μ is the **measure of maximal entropy** on K .

When $d \geq 3$, we find examples in which (A) does not hold but (C) holds, which is a **new phenomenon** not appearing in the planar cases.

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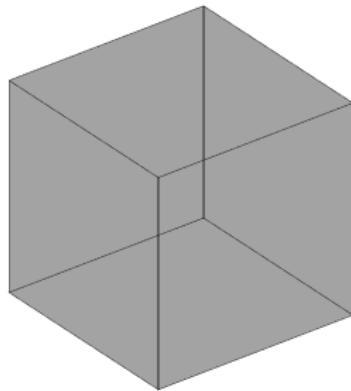
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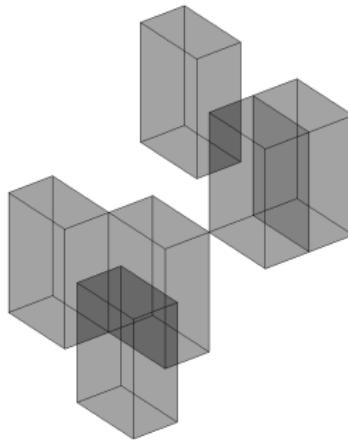
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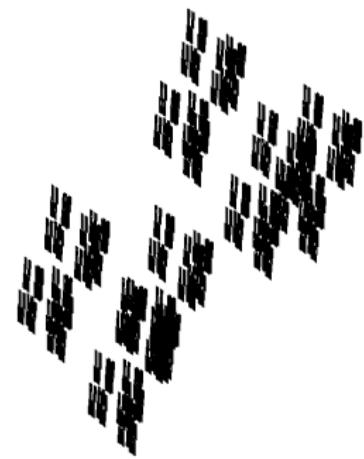
- (A) and (B) are equivalent for **Bedford-McMullen sponges**.



Initial cube



First iteration



The self-affine set

Table: A Bedford-McMullen sponge⁴.

⁴Figures generated by the scripts at GitHub repo [zfengg/SelfAffine](https://github.com/zfengg/SelfAffine).

- Fractals are **everywhere**. In fractal geometry, we study the '**size**' of fractals and how they behave under geometric operations.
- Self-similar and self-affine sets and measures are an **important** class of **dynamically-driven** fractals.
- We have investigated the **dimensional properties** of these fractals from **different perspectives**: **numerically**, **theoretically**, **typically**, and **specifically**.

Thank you for listening!



A fractal in the sky! (Helsinki, Jun 2023)