

Effective Fractal Dimension in Computational Complexity and Algorithmic Information Theory

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Contents

1. Fractal dimensions: a new characterization
2. r. b. dimension in Computational Complexity
3. Information theory and compression algorithms

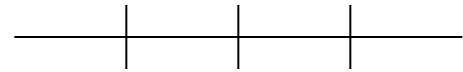
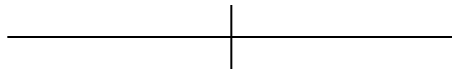
Fractal dimensions

- I will talk specifically about Hausdorff dimension
- Widely used in fractal geometry
- It can be defined in any metric space. Today I will stick to Σ^∞ the set of infinite sequences over finite Σ

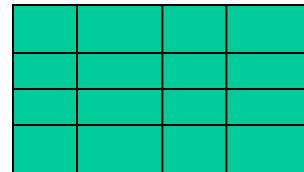
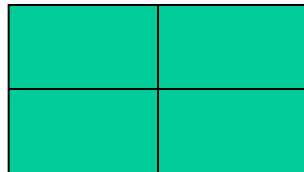
Today we'll use $\Sigma=\{0,1\}$

Fractal dimension

A line can be covered with N balls of diameter $1/N$

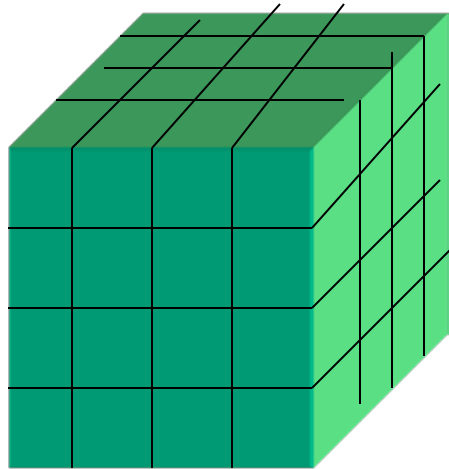


A surface can be covered with N^2 balls of diameter $1/N$



A has dimension D

A can be covered with around N^D balls of diameter $1/N$



A can be s-covered if

Number-of-balls * diameter^s
is bounded for arbitrarily small diameter

Hausdorff dimension

Let $s \in [0, \infty)$, $\delta > 0$

- $H^s_\delta(A) = \inf \sum |U_i|^s$ (infimum over all covers of A , $\{U_i\}$ with diameter $|U_i| < \delta$)
- $H^s(A) = \lim_{\delta \rightarrow 0} H^s_\delta(A)$

$$\mathbf{dim(A)} = \inf \{s \mid H^s(A) = 0\}$$

New characterization

- Effective dimension is based in a characterization of Hausdorff dimension on Σ^∞ given by Lutz (2000)
- The characterization is a very clever way to deal with a single covering using gambling

Hausdorff dimension (Lutz characterization)

A gambling game

A player bets on each element of an unknown sequence $x \in \Sigma^\infty$

- When betting on $x[n]$ he knows $x[1..n-1]$.
- A strategy in this game is a function $b: \Sigma^* \times \Sigma \rightarrow [0, 1]$, $b(w, a) = \alpha$ means “if $x[1..n-1] = w$, bet a fraction α of present capital to $x[n] = a$ ”.
- If he wins he multiplies by $|\Sigma|$, if he loses he gets 0.
- But the house takes a fixed percentage before each bet.

Hausdorff dimension (Lutz characterization)

A **martingale** is $d: \Sigma^* \rightarrow [0, \infty)$ such that

$$\frac{\sum_{a \in \Sigma} d(wa)}{|\Sigma|} = d(w)$$

It is the capital corresponding to a fixed strategy and a fair game (the house takes nothing)

Hausdorff dimension (Lutz characterization)

An **s-gale** is $d: \Sigma^* \rightarrow [0, \infty)$ such that

$$\frac{\sum_{a \in \Sigma} d(wa)}{|\Sigma|^s} = d(w)$$

It is the capital corresponding to a fixed strategy and a the house taking a fraction of $1 - |\Sigma|^{s-1}$

The smaller the s the more the house takes

Hausdorff dimension (Lutz characterization)

- An s -gale d **succeeds** on $x \in \Sigma^\infty$ if $\limsup_{n \rightarrow \infty} d(x[1..n]) = \infty$
- d **succeeds** on $A \subseteq \Sigma^\infty$ if d succeeds on each $x \in A$
- $G(A) = \{s \mid \text{there is an } s\text{-gale that succeeds on } A\}$

The smaller the s the harder to succeed

Hausdorff dimension (Lutz characterization)

Let $A \subseteq \Sigma^\infty$

The Hausdorff dimension of A is the infimum of $G(A)$.

[Lutz 00]

- $\dim(A) = \inf \{s \mid \forall \delta, \varepsilon \exists \{U_i\}$
 $A \subseteq \cup U_i, |U_i| < \delta$
 $\sum |U_i|^s < \varepsilon \}$
- $\dim(A) = \inf \{s \mid \exists d \text{ an } s\text{-gale}$
for each $x \in A$,
 $\limsup_n d(x[1..n]) = \infty \}$

Effectivizing Hausdorff dimension

- We restrict to constructive or effective strategies and get the corresponding “dimensions” that are meaningful in subsets of Σ^∞ we are interested in

Constructive dimension [Lutz00]

- A function $f: \Sigma^* \rightarrow \mathbb{R}$ is **constructive** if it is lower semi-computable

(there exists a non-decreasing computable function $f': \Sigma^* \times \mathbb{N} \rightarrow \mathbb{R}$ such that for every w

$$\lim_{m \rightarrow \infty} f'(w, m) = f(w)$$

- $G_{\text{constr}}(A) = \{s \mid \text{there is a constructive } s\text{-gale that succeeds on } A\}$
- $\text{cdim}(A) = \inf G_{\text{constr}}(A)$

Effective dimensions

- Restricting to effectively computable strategies we have:
 - computable by a finite automata \dim_{FS}
 - computable in polynomial time \dim_p
 - computable in polynomial space \dim_{pspace}
- Each of this effective dimensions is “the right one” for a set of sequences (complexity class)

[Lutz00, DaiLatLutMay04]

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Uses of effective dimension in complexity

1. To prove abundance results

Example: How dense are hard sets for exponential time?

$E = \text{DTIME}(2^n)$

$\dim_p(E) = 1$

$\text{DENSE} = \{ L \mid \exists \varepsilon \forall n \mid L^{\leq n} \mid > 2^{n\varepsilon} \}$

Density of hard sets

The p -dimension of sets that reduce to nondense sets (under p -majority reduction) is 0

Same for more general reductions

[Harkins-Hitchcock 2011]

Density of hard sets

1. Abundance result ($\dim_p(E)=1$)

Most sets in E do not reduce to nondense sets

2. Existence result (prob. method)

There is a set in E that does not reduce to nondense sets

- Consequence:

All hard sets for E are dense

Uses of effective dimension in complexity

3. New hypothesis

If $\dim_p(\text{NP}) > 0$ then all hard sets for NP are dense

Uses of effective dimension in complexity

3. New insights

Small span theorems: given a reduction, either the upper or the lower span is small

Small span theorem

- For every A in E , either

$$\dim'_p(P_m(A) \cap E) = 0$$

or

$$\dim'_p(P_m^{-1}(A) \cap E) = 0$$

[Hitchcock]

Open questions

- What is the p -dimension of NP?
- Is it possible that $0 < \dim_p(\text{NP}) < 1$?
- **Oracle results?**

Open questions

- Finding sources for BPP

Can I have $P^A = \text{BPP}$ when $\dim_?(A) > 0$?

Open questions

- What kind of strong natural proofs against P/poly can we get from $\dim_p(\text{P/poly}) = 0$?
- Known: how to get natural proofs from a weaker assumption, therefore
Strong ps.generators $\rightarrow \dim_p(\text{P/poly}) \neq 0$

Open questions

- Disjoint pairs: (A, B) such that $A \cap B = \emptyset$
- P-separable: S in P s.t. $A \subseteq S, B \subseteq S^c$
- Can you get inseparable pairs from $\dim_p(\text{NP})$?
- Strongly inseparable?

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References

- Effective Fractal Dimension Bibliography
Maintained by John Hitchcock
<http://www.cs.uwyo.edu/~jhitchco/>

The dimension of a point

- If we take a single $x \in \Sigma^\infty$ we can have $\text{cdim}(\{x\}) > 0$
- In fact constructive dimension can be defined in a pointwise way [Lutz03]

$$\text{cdim}(A) = \sup_{x \in A} \text{cdim}(\{x\})$$

I will write $\text{cdim}(x)$ for $\text{cdim}(\{x\})$

Martin-Löf randomness & information content

- x is Martin-Löf random iff $(\exists c)$
 $\forall n \quad K(x[1..n]) \geq n \log|\Sigma| - c$

(x is c -incompressible for a constant c)

$$K(w) = \min\{|p| \mid p \in \{0,1\}^*, U(p)=w\}$$

Dimension is Kolmogorov complexity

- The constructive dimension of a sequence is related to its information content
- [Mayordomo 02] For each $x \in \Sigma^\infty$

$$\text{cdim}(x) = \liminf_{n \rightarrow \infty} \frac{K(x[1..n])}{n \log|\Sigma|}$$

A sequence x has dimension bigger than s iff
 $(\exists \varepsilon) \forall n \quad K(x[1..n]) \geq (s+\varepsilon) n \log|\Sigma|$

In resource-bounded setting

$$KS^f(w) = \min\{|p| \mid U(p) = w \text{ in space } f(|w|)\}$$

- For each $x \in \Sigma^\infty$

$$\dim_{\text{comp}}(x) = \inf_{f \in \text{comp}} \liminf_{n \rightarrow \infty} \frac{KS^f(x[1..n])}{n \log|\Sigma|}$$

In resource-bounded setting

$$KS^q(w) = \min\{|p| \mid U(p) = w \text{ in space } q(|w|)\}$$

- For each $x \in \Sigma^\infty$

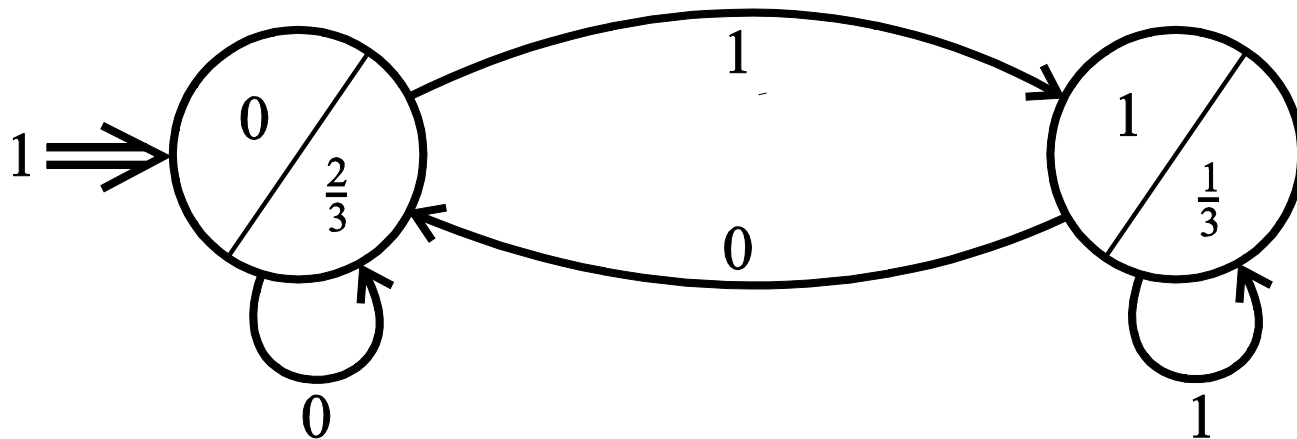
$$\dim_{\text{pspace}}(x) = \inf_{\substack{q \\ \text{polynomial}}} \liminf_{n \rightarrow \infty} \frac{KS^q(x[1..n])}{n \log|\Sigma|}$$

Finite state dimension

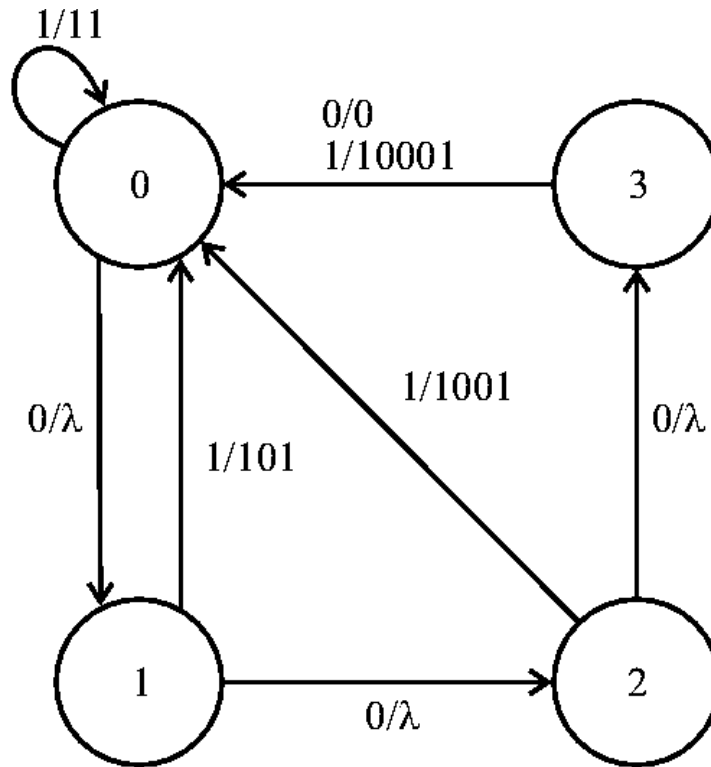
- We consider the case of Finite-State computation

$G_{FS}(A) = \{s \mid \text{there is a Finite State } s\text{-gale that succeeds on } A\}$

$\dim_{FS}(A) = \inf G_{FS}(A)$



Finite state compression



The input can be recovered given the output and the final state

Finite state compression

- **Theorem** Finite-state dimension is exactly the best compression rate achievable through finite-state compressors [Dai et al 04]

$$\dim_{\text{FS}}(x) = \inf_{C \text{ FS-comp}} \liminf_{n \rightarrow \infty} \frac{|\text{output}_C(x[1..n])|}{n \log|\Sigma|}$$

Any interest for non computer scientist?

- A real $\alpha \in [0,1]$ is **b-normal** if its base-b representation $x \in \{0, \dots, b-1\}^\infty$ is a sequence such that for every $w \in \{0, \dots, b-1\}^*$

$$\lim_{n \rightarrow \infty} \frac{\#\{i \leq n \mid x[i+1-|w|..i]=w\}}{n} = b^{-|w|}$$

- Other characterizations are based on the distribution of $\{b^k \alpha\}_k$ (Weyl criterion, etc)

Dimension characterization of normality

- A real $\alpha \in [0,1]$ is b-normal iff its base-b representation $x \in \{0, \dots, b-1\}^\infty$ has $\dim_{\text{FS}}(x)=1$
- A real $\alpha \in [0,1]$ is b-normal iff its base-b representation $x \in \{0, \dots, b-1\}^\infty$ is FS-random

[several papers]

FS-dimension is base dependent

What we know so far

- Several levels of effective dimension for which dimension and compression coincide
(constructive, pspace, finite state)
- Some intermediate levels for which the question of dimension vs compression has the known limitations of prediction vs compression algorithms
(polynomial time)

Polynomial time dimension

- If we consider only a class of reasonable compressors (those that don't start from scratch) then

p-compression is exactly p-dimension

[Lopez-Valdes, May]

pushdown dimension

- We consider BPD the set of pushdown machines that work with a bounded number of λ -transitions per input symbol
- **Theorem** [Albert et al 07]
BPD-dimension is exactly the best compression rate achievable through BPD-compressors

Still open for general PD-computation

Comparison with other levels

- PD-randomness is not normality
- Still open: Is PD-dimension 1 exactly normality?
- Is PD-dimension base dependent?

Comparison with other levels

- **Theorem** [Albert et al 08]

PD-compression is incomparable with the Lempel-Ziv compression algorithm:

- There are sequences for which PD-compression is better
- There are sequences for which Lempel-Ziv compression is better

Lempel-Ziv compressor is widely-used and universal for FS-compressors

References

- Effective Fractal Dimension Bibliography
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