#### Effective Fractal Dimension

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AIM Workshop on Effective Randomness

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## Measures on Cantor Space

Outer measures from premeasures

Approximate sets from outside by open sets and weigh with a general measure function.

- A premeasure is a function  $\rho: 2^{<\omega} \to \mathbb{R}^+_0 \cup \{\infty\}$ .
- One can obtain an outer measure  $\mu_{\rho}$  from  $\rho$  by letting

$$\mu_{\rho}(X) = \inf_{C \subseteq 2^{<\omega}} \left\{ \sum_{\sigma \in C} \rho(\sigma) : \bigcup_{\sigma \in C} N_{\sigma} \supseteq X \right\},\$$

where  $N_{\sigma}$  is the basic open cylinder induced by  $\sigma$ . (Set  $\mu_{\rho}(\emptyset) = 0$ .)

The resulting  $\mu = \mu_{\rho}$  is a countably subadditive, monotone set function, an outer measure.

# Measures on Cantor Space

From outer measures to measures

#### Measurable sets:

Restriction to sets A which satisfy

$$(\forall Y) \ \mu(Y) = \mu(Y \cap A) + \mu(Y \setminus A),$$

yields the measurable sets.

• The measurable sets form a  $\sigma$ -algebra, and  $\mu$  is an additive set function on this  $\sigma$ -algebra.

The more "well-behaved"  $\rho$  is, the better are the regularity properties of  $\mu_{\rho}.$ 

In particular, if ρ is already additive on cylinders, then the μ-measurable sets comprise the Borel sets, and μ coincides with ρ on the Borel sets. "Geometric" measures should be translation invariant.

- Geometric outer measures:  $\rho$  depends only on  $|\sigma|$ .
- ► Most famous example: Lebesgue measure  $\lambda$  given by  $\rho(\sigma) = 2^{-|\sigma|}$ .
- ► More general: function h, h(0) = 0, right-continuous;  $\rho(\sigma) = h(2^{-|\sigma|})$ .
- ► In Cantor space:  $h : \mathbb{N} \to \mathbb{R}_0^+$ ,  $h(n) \to \infty$  as  $n \to \infty$ ;  $\rho(\sigma) = 2^{-h(|\sigma|)}$ .

# Measures on Cantor Space Nullsets

The way we constructed outer measures,  $\mu(A) = 0$  is equivalent to the existence of a sequence  $(C_n)_{n \in \omega}$ ,  $C_n \subseteq 2^{<\omega}$ , such that for all n,

$$A \subseteq \bigcup_{C_n} N_{\sigma}$$
 and  $\sum_{C_n} \rho(\sigma) \leqslant 2^{-n}$ .

Thus,

every nullset is contained in a  $G_{\delta}$  nullset.

#### Randomness

Effective nullsets and randomness

By requiring that the covering nullset is effectively  $G_{\delta}$ , we obtain a notion of effective nullsets.

#### Definition

Let μ (= μ<sub>ρ</sub>) be an outer measure based on a computable premeasure ρ. A set A is effectively μ-null if there exists a recursive function f such that for all n,

$$A\subseteq igcup_{\sigma\in W_{f(n)}} N_\sigma$$
 and  $\sum_{\sigma\in W_{f(n)}} 
ho(\sigma)\leqslant 2^{-n}$ 

▶ A real  $X \in 2^{\omega}$  is µ-random iff  $\{X\}$  is not µ-null.

## Hausdorff Measures and Hausdorff Dimension

For  $\rho(\sigma) = 2^{-|\sigma|s}$ , s a nonnegative real number, we obtain  $\mathcal{H}^s$ , the s-dimensional Hausdorff measure.

- ► Note: The actual definition of the Hausdorff measure ℋ<sup>h</sup> is a little more involved. (One wants to ensure that for the resulting measures, all Borel sets are measurable.)
- We are primarily concerned with nullsets. For nullsets the more involved definition coincides with the one given here.

The Hausdorff dimension assigns to every set of reals an "adequate" measure.

#### Definition

The Hausdorff dimension of  $A \subseteq 2^{\omega}$  is defined as

$$\dim_{\mathsf{H}} A = \inf\{s > 0 : \mathcal{H}^{s}(A) = 0\}$$

#### Properties of Hausdorff Dimension

- Lebesgue measure:  $\lambda(A) > 0$  implies dim<sub>H</sub>(A) = 1.
- Monotony:  $A \subseteq B$  implies  $\dim_{H}(A) \leq \dim_{H}(B)$ .
- ▶ Stability: For  $A_1, A_2, \dots \subseteq 2^{\omega}$  it holds that

$$\dim_{\mathsf{H}}(\bigcup A_i) = \sup \{\dim_{\mathsf{H}}(A_i)\}.$$

- Important geometric properties:
  - ► If F is Hölder continuous, i.e. if there are constants c, r > 0 for which

$$(\forall x, y) \ d(F(x), F(y)) \leq cd(x, y)^r$$
,

then

$$\dim_{\mathsf{H}} F(A) \leqslant (1/r) \dim_{\mathsf{H}}(A).$$

For r = 1, F is Lipschitz continuous. If F is bi-Lipschitz, then

 $\dim_{\mathsf{H}} h(A) = \dim_{\mathsf{H}}(A).$ 

## Hausdorff Dimension and Martingales

Hausdorff dimension can be expressed in terms of martingales.

- ► Recall that a martingale is a function  $d: 2^{<\omega} \to [0, \infty)$  such that  $2d(\sigma) = d(\sigma^{\frown}0) + d(\sigma^{\frown}1)$ .
- Given s ≥ 0, a martingale d is called s-successful on a real X ∈ 2<sup>ω</sup> if

$$\limsup d(X \upharpoonright_n)/2^{(1-s)n} = \infty.$$

Note that the usual success-notion for martingales is just being 1-successful.

#### Theorem (Lutz)

For any set  $A \subseteq 2^{\omega}$ ,

 $\dim_{\mathsf{H}} A = \inf\{s : \text{ some martingale } d \text{ is } s \text{-successful on all } X \in A\}.$ 

# Packing Dimension

Lutz' martingale characterization allows for an easy characterization of another dimension concept, packing dimension, which can be seen as a dual to Hausdorff dimension.

Instead of "covering" a set with open balls, "pack" it with disjoint balls.

Given  $0 < s \le 1$ , a martingale d is strongly s-successful on a real X if

lim inf 
$$d(X \upharpoonright_n)/2^{(1-s)n} \to \infty$$
.

Theorem (Athreya, Hitchcock, Lutz, and Mayordomo)

For any set  $A \subseteq 2^{\omega}$ ,

dim<sub>P</sub>  $A = \inf\{s : some \ d \ is strongly \ s-successful \ on \ all \ X \in A\}.$ 

Hausdorff dimension can be effectivized using effective Hausdorff measures.

#### Definition (Lutz)

The  $\Sigma_1^0$ -Hausdorff dimension, or simply 1-dimension (constructive dimension), of  $A \subseteq 2^{\omega}$  is defined as

$$\dim_{\mathsf{H}}^{1} A = \inf \{ s \in \mathbb{Q}_{0}^{+} : A \text{ is effectively } \mathcal{H}^{s}\text{-null} \}.$$

- There are single reals of non-zero dimension: every λ-random real has dimension one.
- I-dimension has an important stability property [Lutz]:

$$\dim_{\mathsf{H}}^{1} A = \sup \{ \dim_{\mathsf{H}}^{1} \{ X \} : X \in A \}.$$

# Effective Dimension and Algorithmic Entropy

Effective Hausdorff dimension can be interpreted as a degree of incompressibility.

Theorem ((Ryabko); Mayordomo)

For every real X,

$$\dim_{\mathsf{H}}^{1} X = \liminf_{n \to \infty} \frac{\mathsf{K}(X \upharpoonright_{n})}{n}$$

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## Effective Dimension and Algorithmic Entropy

Effective packing dimension

1-packing dimension (constructive strong dimension) can be effectivized using the martingale characterization by Athreya et al.

Theorem (Athreya et al)

For every real X,

$$\dim_{\mathsf{P}}^{1} X = \limsup_{n \to \infty} \frac{\mathsf{K}(X \upharpoonright_{n})}{n}.$$

The three basic examples

Let 0 < r < 1 rational. Given a Martin-Löf random set X, define  $X_r$  by

$$X_r(m) = egin{cases} X(n) & ext{if } m = \lfloor n/r 
floor, \ 0 & ext{otherwise}. \end{cases}$$

Then  $\dim^1_H X_r = r$ .

- Geometry: Hölder transformation of Cantor set
- Information theory: Insert redundancy

The three basic examples

Let  $\mu_p$  be a Bernoulli ("coin-toss") measure with bias  $p \in \mathbb{Q} \cap [0, 1]$ , and let X be random with respect to  $\mu_p$ . Then

$$\dim_{\mathsf{H}}^{1} X = H(\mu_{p}) := -[p \log p + p \log(1-p)].$$

[Lutz; Eggleston]

 Kolmogorov complexity can be seen as an effective version of entropy.

The three basic examples

Let U be a universal, prefix-free machine. Given a computable real number  $0 < s \leq 1$ , the binary expansion of the real number

$$\Omega^{(s)} = \sum_{\sigma \in \mathsf{dom}(U)} 2^{-\frac{|\sigma|}{s}}$$

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has effective dimension s [Tadaki].

• Note that  $\Omega^{(1)}$  is just Chaitin's  $\Omega$ .

For all examples randomness is extractible

Each of the three examples actually computes a Martin-Löf random real.

- ▶ This is obvious for the "diluted" sequence.
- For recursive Bernoulli measures, one may use Von-Neumann's trick to turn a biased random real into a uniformly distributed random real. More generally, any real which is random with respect to a recursive measure computes a Martin-Löf random real [Levin; Kautz].
- Ω<sup>(s)</sup> computes a fixed-point free function. It is of r.e. degree, and hence it follows from the Arslanov completeness criterion that Ω<sup>(s)</sup> is Turing complete (and thus T-equivalent to a Martin-Löf random real).

## The Dimension Problem

Are there reals of "genuine" non-integral dimension?

The stability property implies that the Turing lower cone of each of the three examples has effective dimension 1.

#### Question

Are there any Turing lower cones of non-integral dimension?

Any such lower cone would come from a real of non-integral dimension for which it is not possible to extract some content of higher degree of randomness effectively.

## Many-One Reducibility

#### Theorem (Reimann and Terwijn)

Let  $\mu_p$  be a computable Bernoulli measure with bias p. If X is  $\mu_p$ -random, then

$$Y \leq_{\mathsf{m}} X \Rightarrow \dim^{1}_{\mathsf{H}} Y \leq H(\mu_{p}).$$

#### Proof.

- Given an m-reduction f, define
  F = {n : (∀m < n)f(m) ≠ f(n)}, so F is the set of all positions of Y, where an instance of X is queried for the first time.</p>
- F induces a Kolmogorov-Loveland place selection rule. If X is μ<sub>p</sub>-random, this selection rule will yield a new sequence with the same limit frequency as X.

This technique does not extend to weaker reducibilities, since for Bernoulli measures the Levin-Kautz result holds for a total Turing reduction.

Theorem (Reimann and Nies)

For each rational  $\alpha$ ,  $0 \leq \alpha \leq 1$ , there is a real  $X \leq_{wtt} \emptyset'$  such that

 $\dim_{\mathsf{H}}^{1} X = \alpha \quad and \quad (\forall Z \leq_{\mathsf{wtt}} X) \dim_{\mathsf{H}}^{1} Z \leq \alpha.$ 

#### A Wtt Lower Cone of Non-Integral Dimension The strategy

#### Requirements:

$$R_{\langle e,j\rangle}: Z = \Psi_e(X) \ \Rightarrow \ \exists (k \ge j) \ K(Z \upharpoonright_k) \leqslant^+ (\alpha + 2^{-j})k$$

where  $(\Psi_e)$  is a uniform listing of wtt reduction procedures.

We can assume each Ψ<sub>e</sub> also has a certain (non-trivial) lower bound on the use g<sub>e</sub>, because otherwise the reduction would decrease complexity anyway.

#### A Wtt Lower Cone of Non-Integral Dimension The strategy

- Define a length k<sub>j</sub> where we intend to compress Z, and let m<sub>j</sub> = g<sub>e</sub>(k<sub>j</sub>).
- Define σ<sub>j</sub> of length m<sub>j</sub> in a way that, if x = Ψ<sub>e</sub><sup>σ<sub>j</sub></sup> is defined then we compress it down to (α + 2<sup>-b<sub>j</sub></sup>)k<sub>j</sub>, by constructing an appropriate nullset L.
- The opponent's answer could be to remove σ<sub>j</sub> from P. (σ<sub>j</sub> is not of high dimension.)
- In this case, the capital he spent for this removal exceeds what we spent for our request, so we can account our capital against his.
- Of course, usually σ<sub>j</sub> is much longer than x. So we will only compress x when the measure of oracle strings computing it is large.

#### A Wtt Lower Cone of Non-Integral Dimension An important Lemma

We assume that P is effectively approximated by clopen sets P<sub>s</sub>.

#### Lemma

Let C be a clopen class such that  $C \subseteq P_s$  and  $C \cap P_t = \emptyset$  for stages s < t. Then

 $\Omega_t - \Omega_s \geqslant (\lambda C)^{\alpha}.$ 

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#### A Wtt Lower Cone of Non-Integral Dimension Combining the strategies $R_i$

- In the course of the construction, some R<sub>j</sub> might have to pick a new σ<sub>j</sub>.
- ▶ In this case we have to initialize all  $R_n$  of lower priority (n > j).
- ▶ We have to make sure that this does not make us enumerate too much measure into *L*.
- ▶ We therefore have to assign a new length k<sub>n</sub> to the strategies R<sub>n</sub>.

► For this, it is important to know the use of the reduction related to R<sub>j</sub>.

# The Turing Case

For the Turing case, the best known result is the following.

Theorem (Kjos-Hanssen, Merkle, and Stephan)

There exists recursive, non-decreasing, unbounded function h and a real X such that for all n,

$$K(X \upharpoonright_n) \ge h(n) \tag{(*)}$$

and X does not compute a Martin-Löf random real.

- The condition (\*) can be interpreted in terms of (generalized) Hausdorff measures. Reals satisfying (\*) are called complex.
- ▶ A real is complex with recursive bound *h* iff it is not effectively  $\mathcal{H}^{\tilde{h}}$ -null, where  $\tilde{h} = 2^{-h(n)}$ .

A function f is diagonally nonrecursive (dnr) if for all n,  $f(n) \neq \varphi_n(n)$ .

▶ Call a function *f h*-bounded if  $f(n) \leq h(n)$  for all *n*.

#### Theorem (Kumabe)

There exists a minimal degree that contains a dnr function which is bounded by a recursive function.

# **Diagonally Non-Recursive Functions**

Dnr functions and complex reals

#### Theorem (Kjos-Hanssen et al)

If X computes a recursively bounded dnr function f, then X computes a complex real.

Proof:

- Assume f ≤<sub>T</sub> X is g-bounded dnr. Code f into a real (e.g. via unary representation); since f is rec. bounded, so are the lengths of the codes.
- Let *I* ≥ 0. For every σ, |σ| ≤ *I*, consider program ψ<sub>σ</sub> on input (*e*, .):
  - Wait till  $U(\sigma)$  converges.
  - Check whether U(σ) correctly encodes a sequence of natural numbers ⟨y<sub>1</sub>,..., y<sub>k</sub>⟩ with k ≥ e.
  - ▶ If so, return y<sub>e</sub>.

# **Diagonally Non-Recursive Functions**

Dnr functions and complex reals

- By the Recursion Theorem, there exists a number e<sub>σ</sub> such that ψ<sub>σ</sub>(e<sub>σ</sub>, x) = φ<sub>e<sub>σ</sub></sub>(x) for all x. The fixed point can be found effectively.
- Let e be the maximum of all e<sub>σ</sub>, |σ| ≤ I, and let h(I) be larger than the longest possible string needed to code a g-bounded function.
- ▶ It follows that  $C(A \upharpoonright_{h(I)}) > I$ .
  - Suppose that  $U(\sigma) = A \upharpoonright_{h(n)}$  for some  $|\sigma| \leq n$ .
  - Then  $\psi_{\sigma}(e_{\sigma}, e_{\sigma})$  returns  $f(e_{\sigma})$ .
  - But e<sub>σ</sub> is a fixed point for ψ<sub>σ</sub>, so ψ<sub>σ</sub>(e<sub>σ</sub>, e<sub>σ</sub>) = φ<sub>e<sub>σ</sub></sub>(e<sub>σ</sub>), contradicting the assumption that f is dnr.

## **Possible Strategies**

To show that there exists a lower cone of non-integral dimension:

- Construct a minimal degree of positive dimension.
- Combine the wtt-technique with a hyperimmune-free construction.
- $\Omega^{(s)}$ -operators?

To show that no such cone exists:

Show that every real of positive dimension computes a measure for which it is random and apply the Levin-Kautz technique.

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Use sophisticated extractors?