

Computing Absolutely Normal Numbers in Nearly Linear Time

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- A real number α is absolutely normal if it is normal in every base.

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- Theorem (Turing, late 1930s). There is an algorithm that computes an absolutely normal number.
- Theorem (Becher, Heiber, and Slaman, 2013). There is an algorithm that computes an absolutely normal number α in polynomial time. (It computes the successive bits of the binary expansion of α , with the n^{th} bit appearing in time polynomial in n .)

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- It computes the successive bits of the binary expansion of α , with the n^{th} bit appearing within $n(\log n)^{O(1)}$ steps.
- This was called **nearly linear time** by Gurevich and Shelah (1989), who proved that nearly linear time – unlike linear time! – is model robust.

Outline

- ① Martingales (and why)
- ② Lempel-Ziv martingales (and why)
- ③ Savings Accounts
- ④ Base Change
- ⑤ Absolutely Normal Numbers
- ⑥ Open Problem (if time)

Martingales

- $\Sigma_b = \{0, \dots, b-1\}$ the base b alphabet
- Σ_b^* are finite sequences, Σ_b^∞ infinite. sequences
- $x \upharpoonright n$ is the length- n prefix of x .
- A martingale is a function $d : \Sigma_b^* \rightarrow [0.. \infty)$ with the fairness property that, for every finite sequence w ,

$$d(w) = \frac{\sum_{i \in \Sigma_b} d(wi)}{b}.$$

- A martingale d succeeds on an infinite sequence $x \in \Sigma_b^\infty$ if

$$\limsup_n d(x \upharpoonright n) = \infty$$

(x can be predicted by d).

- Lebesgue measure can be defined in terms of martingales (a set has measure 0 if there is a martingale succeeding on every element of the set).
- And you **have** to use martingales to have a useful measure on small complexity classes ...
- ... because they aggregate a lot of information!

But how fast do they succeed?

Let $g : \Sigma_b^* \rightarrow [0, \infty)$ (may or may not be a martingale) and $S \in \Sigma_b^\infty$.

- g succeeds on S ($S \in S^\infty[g]$) if $\limsup_{n \rightarrow \infty} g(S \upharpoonright n) = \infty$.
- g $f(n)$ -succeeds on S ($S \in S^{f(n)}[g]$) if $\limsup_{n \rightarrow \infty} \frac{\log g(S \upharpoonright n)}{\log f(n)} > 1$.
- g succeeds exponentially on S ($S \in S^{\text{exp}}[g]$) if $\exists \epsilon > 0$ $S \in S^{2^{\epsilon n}}[g]$.

Schnorr and Stimm (1972) implicitly defined **finite-state martingales** and proved that every sequence $S \in \Sigma_b^\infty$ obeys the following dichotomy:

- 1 If S is b -normal, then no finite-state base- b martingale succeeds on S . (In fact, every finite-state base- b martingale decays exponentially on S .)
- 2 If S is not b -normal, then some finite-state base- b martingale succeeds exponentially on S .

Lempel-Ziv martingales

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$\therefore x \in (0, 1)$ is absolutely normal if none of the martingales $d_{LZ(b)}$ succeed exponentially on the base- b expansion of x .

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$\therefore x \in (0, 1)$ is absolutely normal if none of the martingales $d_{LZ(b)}$ succeed exponentially on the base- b expansion of x .

Moreover, $d_{LZ(b)}$ is fast and has a beautiful theory.

Lempel-Ziv martingales

How $d_{LZ(b)}$ works:

Parse $w \in \Sigma_b^*$ into distinct **phrases**, using a growing tree whose leaves are all of the previous phrases.

At each step, bet on the next digit in proportion to the number of leaves below each of the b options.

Savings Accounts

- The value of Lempel-Ziv martingale $d_{LZ(b)}$ on a certain infinite string S can fluctuate a lot.
- This makes base change more complicated (and time consuming).
- We use the notion of “savings account” here. That is, we construct an alternative martingale that **keeps money aside for the bad times to come**
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Definition

A **savings account** for a martingale $d : \Sigma_b^* \rightarrow [0, \infty)$ is a nondecreasing function $g : \Sigma_b^* \rightarrow [0, \infty)$ such that $d(w) \geq g(w)$ for every w .

Savings Accounts

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- g'_b succeeds at least on non- b -normal sequences.
- Both d'_b and g'_b can be computed in nearly linear time.
- If $S \notin S^\infty[g'_b]$ then S is b -normal.

Base Change

- We want an absolutely normal real number α , that is, the base b representation $seq_b(\alpha)$ is not in $S^\infty[d'_b]$.
- For this we convert d'_b into a base-2 martingale $d_b^{(2)}$ succeeding on the **base-2 representations of the reals with base- b representation in $S^\infty[d'_b]$** .
- Again, $d_b^{(2)}$ succeeds on $seq_2(real(S^\infty[d'_b]))$.

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- We use Carathéodory construction to define measures.
- Computing in nearly linear time is also delicate.
- In fact our computation $\widehat{d_b^{(2)}}$ approximates $d_b^{(2)}$ slowly

$$|\widehat{d_b^{(2)}}(y) - d_b^{(2)}(y)| \leq \frac{1}{|y|^3}$$

Absolutely Normal Numbers

- From previous steps we have a family of martingales $(d_b^{(2)})_b$ so that $d_b^{(2)}$ **succeeds on base-2 representations of non- b -normal sequences.**
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- We want to construct $S \notin S^\infty[d_b^{(2)}]$ for every b .
- Nearly linear time makes it painful to construct a martingale d for the union of $S^\infty[d_b^{(2)}]$.
- Then we diagonalize over d to construct S .

Time bounds ...

- All the steps were performed in **online** nearly linear time on a common **time bound independent of base b** .
- Many technical details were simplified in this presentation ... please read our paper.

Thank you!