

T u r i n g ' s N o r m a l N u m b e r s

Verónica Becher

Universidad de Buenos Aires

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A Note on Normal Numbers

A. N. Turing

Although it is known that all numbers are normal in the Wth section is finished.

example of a normal number is given by the D.N. of $\sqrt{2}$. What does it do in the Kth section? It must test whether K is satisfactory giving

~~of a normal number K is satisfactory giving~~

1 0 0 1

On the other hand the verdict cannot be 'normal' unless the number is normal in the Kth section of its motion

For if it were, then in the Kth section of its motion it would be normal in the Kth section of its motion

be bound to compute the first $R(K-1) + 1 = R(K)$ figures of the number

computed by the machine with K as its D.N. and to write

A Note on Normal Numbers

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Consider the R -figure integers in the scale of t ($t \geq 2$). If γ is any sequence of figures in that scale we denote by $N(t, \gamma, n, R)$ the number of these in which γ occurs exactly n times. Then it can be proved without difficulty that

$$\frac{\sum_{n=1}^R n N(t, \gamma, n, R)}{\sum_{n=1}^R N(t, \gamma, n, R)} = \frac{R - r + 1}{R} t^{-r}$$

where $l(\gamma) = r$ is the length of the sequence γ : it is also

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Reconstructed, corrected and completed in 2007

Becher, Figueira, Picchi, *Theoretical Computer Science* 377, 126-138.

Normality, a form of randomness

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For instance, if a number is normal to base 2, each of the digits '0' and '1' occur in the limit, half of the times; each of the blocks '00', '01', '10' and '11' occur one fourth of the times, and so on.

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A real number that is normal to every integer base is called *absolutely normal*, or just *normal*.

Counterexamples

0.1010010001000010000010000... not normal to base 2.

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Rationals are not normal (for each $q \in \mathbb{Q}$ there is a base b such that the expansion of q ends with all zeros).

Existence

Theorem (Borel 1909)

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Borel asked for an explicit example.

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where $l(\gamma) = r$ is the length of the sequence γ : it is also possible ²⁾ to prove that

$$\sum N(t, \gamma, n, R) < 1 + t^R e^{-K^2 t^r / 4R} \quad (1)$$

Turing's Note on Normal Numbers

Turing's Theorem 1

Borel's theorem on the measure of normal numbers, constructively.

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Turing's Theorem 2

An algorithm to construct normal numbers.

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Turing's First Page of the Handwritten Manuscript

His own appraisal of his work.

Turing's Theorem 1

Theorem 1

We can find a constructive³⁾ function $c(K, u)$ of two integral variables, such that

$$\tilde{K}_{c(K, u+1)} \subseteq \tilde{K}_{c(K, u)}$$

and $m \tilde{K}_{c(K, u)} > 1 - \frac{1}{K}$ for each K, u

and $\tilde{K}_{(K)} = \prod_{h=1}^{\infty} \tilde{K}_{c(K, u)}$ consists entirely of normal numbers for
each K .

Turing's Theorem 1

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$c(k, n)$ is such that

- ▶ $E_{c(k,n)}$ is included in $E_{c(k,n-1)}$ and
- ▶ measure of $E_{c(k,n)}$ is greater than $1 - 1/k$.

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- ▶ measure of $E_{c(k,n)}$ is greater than $1 - 1/k$.

Finally, for each k , $E(k) = \bigcap_n E_{c(k,n)}$ has measure exactly $1 - 1/k$ and it consists entirely of normal numbers.

Main idea in Turing's Theorem 1: finite approximations

The construction is uniform in the parameter k .

Prune the unit interval, by stages.

Stage 0: $E_{c(k,0)}$ is the whole unit interval.

Stage n : $E_{c(k,n)}$ results from removing from $E_{c(k,n-1)}$ the points that are **not** candidates to be normal, according to the inspection of an initial segment of their expansions.

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At the end, the construction discards

- ▶ all rational numbers, because of their periodic structure
- ▶ all irrational numbers with an unbalanced expansion
- ▶ all normal numbers whose convergence to normality is too slow

$E(k) = \bigcap_n E_{c(k,n)}$ consists entirely of normal numbers.

Its measure is exactly $1 - 1/k$ (because $E_{c(k,n)}$ measures $1 - \frac{1}{k} + \frac{1}{k+n}$).

Main idea in Turing's Theorem 1: finite approximations

Computable functions of the stage n ,

initial segment size	linear
base	sublinear
block length	sublogarithmic
frequency discrepancy	...	the technically largest converging to 0

$E_{c(k,n)}$, the set of reals not discarded up to stage n , is the union of finitely many intervals, tailored to measure $1 - \frac{1}{k} + \frac{1}{k+n}$.

Constructive Strong Law of Large Numbers

In most initial segments:

each single digit occurs about the expected number of times

each block of two digits occurs about the expected number of times

...

each block short-enough occurs about the expected number of times.

Lemma (extends Hardy & Wright 1938)

Fix b, w of length ℓ and N . For any real ε such that $\frac{7}{N} \leq \varepsilon \leq \frac{1}{b^\ell}$,

$$\sum_{\left| \frac{i}{N} - \frac{1}{b^\ell} \right| \geq \varepsilon} \text{number of blocks of length } N \text{ with exactly } i \text{ occurrences of } w \leq b^N 2 b^{2\ell} e^{-\frac{b^\ell \varepsilon^2 N}{6\ell}}.$$

Turing's Theorem 2

Theorem 2

There is a rule whereby given an integer k and an infinite sequence of figures 0 and 1 (the p th figure in the sequence being $v(p)$) we can find a normal number $\alpha(k, v)$ in the interval $(0,1)$ and in such a way that for fixed k these numbers form a set of measure at least $1 - 2/k$, and so that the first n figures of v determine $\alpha(k, v)$ to within 2^{-n} .

Turing's Theorem 2

There is an algorithm that, given an integer k and an infinite sequence ν of zeros and ones, produces a normal number $\alpha(k, \nu)$ in the unit interval, expressed in base two.

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In order to write down the first n digits of $\alpha(k, \nu)$ the algorithm requires at most the first n digits of ν .

For a fixed k these numbers $\alpha(k, \nu)$ form a set of measure at least $1 - 2/k$.

The idea in Theorem 2: “follow the measure”

It works by steps.

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At each step, divide the current interval in two halves, and choose the half that includes normal numbers in large-enough measure.

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Start with the unit interval.

At each step, divide the current interval in two halves, and choose the half that includes normal numbers in large-enough measure.

If both halves do, use the current bit of the oracle to decide
(this will happen infinitely often)

The output $\alpha(k, \nu)$ is the trace of the left/right selection at each step.

Algorithm

4

With each integer n we associate an interval of the form

$\left(\frac{m_n}{2^n}, \frac{m_n+1}{2^n}\right)$ whose intersection with $\widehat{E}_c(K)$ is of positive measure .
and given m_n we obtain m_{n+1} as follows. Put

$$m_{n+1} = \min \left\{ c(K, n) \cap \left(\frac{m_n}{2^n}, \frac{2m_n+1}{2^{n+1}} \right) = a_{n,m} \right.$$

$$\left. m_{n+1} = \min \left\{ c(K, n) \cap \left(\frac{2m_n+1}{2^{n+1}}, \frac{m_n+1}{2^n} \right) = b_{n,m} \right. \right.$$

and let r_n be the smallest m for which either $a_{n,m} < K^{-1} 2^{-2n}$
or $b_{n,m} < K^{-1} 2^{-2n}$ or both $a_{n,m} > \frac{1}{K(K+n+1)}$ and $b_{n,m} > \frac{1}{K(K+n+1)}$
There exists such an r_n for $a_{n,m}$ and $b_{n,m}$ decrease either to 0
or to some positive number. In the case where $a_{n,r_n} < K^{-1} 2^{-2n}$ we
put $m_{n+1} = 2m_n + 1$: if $a_{n,r_n} > K^{-1} 2^{-2n}$ but $b_{n,r_n} < K^{-1} 2^{-2n}$
we put $m_{n+1} = 2m_n$, and in the third case we put $m_{n+1} = 2m_n$
or $m_{n+1} = 2m_n + 1$ according as $\nu(u) = 0$ or 1. For each n the
interval $\left(\frac{m_n}{2^n}, \frac{m_n+1}{2^n}\right)$ includes normal numbers in positive measure.
The intersection of these intervals contains only one number
which must be normal.

Correctness of the algorithm

- ▶ Invariant: $I_n \cap E(k)$ has positive measure.
- ▶ Threshold: $M(k, n)$ is a lower bound of $\mu(E_{c(k,n)} \cap I_n)$ verifying
$$M(k, n) = M(k, n-1)/2 - (\mu E_{c(k,n)} - \mu E_{c(k,n+1)})/2.$$
- ▶ Output: $\alpha(k, n) = \bigcap_n I_n$, with explicit convergence to normality.

Turing's normal numbers

By taking particular instances of the input sequence ν the set of numbers that can be output has measure at least $1 - 2/k$.

When ν is computable (Turing puts all zeros), the algorithm yields a computable normal number.

The algorithm can be adapted to intercalate the bits of ν at fixed positions of the output sequence.

Theorem (Figueira PhD Thesis 2006)

There is a normal number in each Turing degree.

Computational Complexity of Turing's algorithm

The number of operations to produce a next digit in the output

- ▶ *simple-exponentially* many (literal reading)
- ▶ *double-exponentially* many (our reconstruction)

Turing's First Page of the Handwritten Manuscript

Not transcribed.

His own appraisal of his work.

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"No example of a normal number has ever been given."

Turing cites Champernowne's 0.123456789101112131415...
as an example of a normal number in base ten.

"It may also be natural that an example of a normal number be demonstrated as such and written down. This note cannot, therefore, be considered as providing convenient examples of normal numbers" //

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Letter exchange between Turing and Hardy (AMT/D/5)

as from
Thim. Corr. Camb

June 1

Dear Turing

I have just come across your letter (March 28), which I seem to have just come for reference and forgotten.

I have a vague recollection that Borel says in one of his books that (Cayley had shown him a construction. Top (écrit sur la théorie de la croissance (including the appendix), or the probability book (written under his direction by a lot of people, but including one volume on arithmetical prob. by himself). Also I seem to remember vaguely that when Chamberlain was doing his stuff, I had a look, but could find nothing satisfactory anywhere.

Now, of course, when I do write, I do so from London, when I have no look to give to. But if I put it off till I return, I may forget again long to be so unsatisfactory. But my 'feeling' is that L. made a jump which never got justified.

Yours sincerely
G.H. Hardy

? late 30's

G.H. Hardy was right but he missed the novelty

Henri Lebesgue in 1909

Waclaw Sierpiński in 1916

independently, each gave a non-finitary based construction:

Bulletin de la Société Mathématique de France 45:127–132 and 132–144, 1917

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In particular, Turing pioneered the theory of algorithmic randomness.

Turing's Normal Numbers: Towards Randomness

A real is random if it exhibits the almost-everywhere behavior of all reals. A random real must pass every test of these properties; for instance, its expansion must be evenly balanced.

Turing's Normal Numbers: Towards Randomness

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Definition (Martin-Löf 1966)

A test for randomness is a uniformly computably enumerable sequence of sets of intervals with rational endpoints whose measure is upper-bounded by a computable function and converges to zero.

A real number is random if it is covered by no such test.

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Corollary (Randomness Implies Normality)

The sequence $((0, 1) \setminus E(k))_{k \geq 0}$ is a ML-test.

Surprise

Absolutely normal numbers in just above quadratic time

Theorem (Becher, Heiber, Slaman 2013)

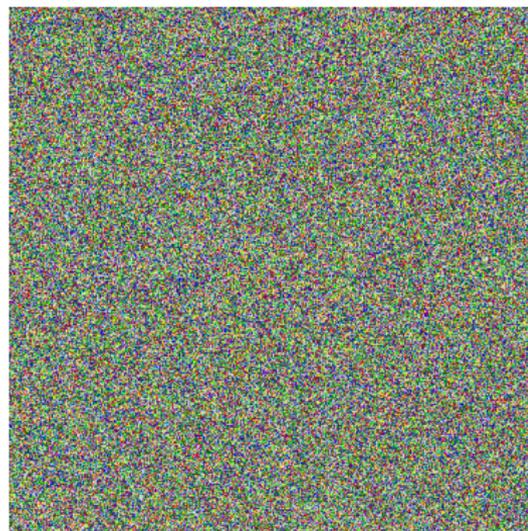
Suppose $f : \mathbb{N} \rightarrow \mathbb{N}$ is a computable non-decreasing unbounded function. There is an algorithm to compute an absolutely normal number x such that, for any base b , the algorithm outputs the first n digits in of its expansion after $O(f(n) n^2)$ elementary operations.

Lutz, Mayordomo 2013 and also Figueira, Nies 2013 have another argument for an absolutely normal number in polynomial time, based on polynomial-time martingales.

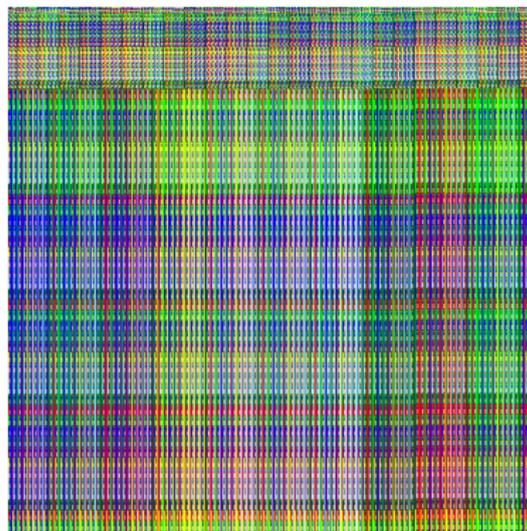
The output of our algorithm in base 10

Programmed by Martin Epsztejn

0.4031290542003809132371428380827059102765116777624189775110896366...

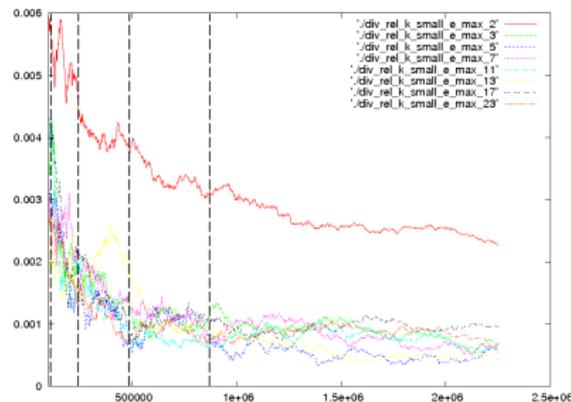
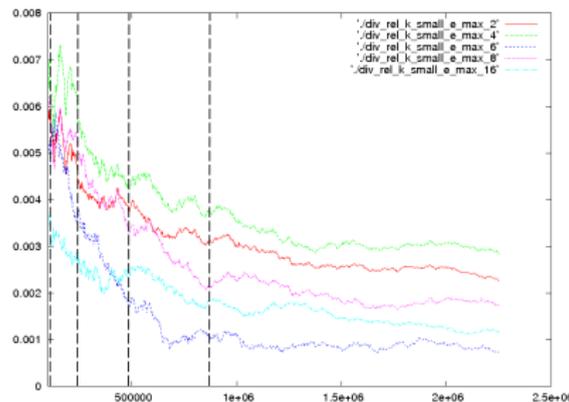


First 250000 digits output by the algorithm
Plotted in 500x500 pixels, 10 colors
Algorithm with parameters $t_i = (3 * \log(i)) + 3$; $\epsilon_i = 1/t_i$; Initial values $t_1 = 3$; $\epsilon_1 = 1$.
First extension in base 2 is of length $k = 405$. Then k increases only when necessary.



First 250000 digits of Champernowne
Plotted in 500x500 pixels, 10 colors

The output of our algorithm in each base



Left: Discrepancy for powers of 2, normalized by expected frequency.
Right: Discrepancy for prime digits, normalized by expected frequency.

Acknowledgements

To [Cristian Calude](#) for suggesting the problem of Sierpiński's normal numbers to me.

To [Gregory Chaitin](#) for pointing out Turing's Note on Normal Numbers.

To [Turing's Digital Archive](#) for the copy of the original manuscript.

To [Alexander Shen](#) for his help with a missing argument in the reconstruction of Turing's Theorem 2.

To [Joos Heintz](#) for encouraging me for more than ten years to find a polynomial time algorithm to produce absolutely normal numbers.

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