## Experimental Computation and Visual Theorems: Part III. Random Walks

## Jonathan Borwein FRSC FAAAS FAA FBAS FAMS

 (With Aragón, Bailey, P. Borwein, Skerritt, Straub, Tam, Wan, Zudilin, ...)
australia
Centre for Computer Assisted Research Mathematics and its Applications The University of Newcastle, Australia

http://carma.newcastle.edu.au/meetings/evims/
http://www.carma.newcastle.edu.au/jon/visuals-ext-abst.pdf

## For 2016 Presentations <br> Revised 25-02-16

## Reflect-Reflect-Average for a line and ellipse



## Reflect-Reflect-Average



## 2016 Presentations

```
Jonathan Borwein FRSC FAA FAAA
Laureate Professor
and Director CARMA
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```



## 2016 Presentations as

Distinguished Scholar in Residence Western University, London Ontario

## Western <br> UNIVERSITY•CANADA <br> 

April 12-13: Owens Lectures Wayne State University

1. Lambert W in Optimization 2. Walking on Numbers


Revised 4-02-2016

## EXTENDED ABSTRACT

Long before current graphic, visualisation and geometric tools were available, John E. Littlewood (1885-1977) wrote in his delightful Miscellany ${ }^{1}$ :

A heavy warning used to be given [by lecturers] that pictures are not rigorous; this has never had its bluff called and has permanently frightened its victims into playing for safety. Some pictures, of course, are not rigorous, but I should say most are (and I use them whenever possible myself). [p. 53]

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Over the past decade, the role of visual computing in my own research has expanded dramatically.

In part this was made possible by the increasing speed and storage capabilities-and the growing ease of programming-of modern multi-core computing environments [BMC].

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- I first briefly discuss both visual theorems and experimental computation.
- I then turn to dynamic geometry (iterative reflection methods $[A B]$ ) and matrix completion problems (applied to protein conformation [ABT]). ${ }^{2}$ (Case studies I)
- After an algorithmic interlude (Case studies II), I end with description of work from my group in probability (behaviour of short random walks [BS, BSWZ]) and transcendental number theory (normality of real numbers [AB3]). (Case studies III)

[^4]
## My plans



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JMB was among roughly 60 new 2015 Fellows of the American Mathematical Society. He was cited "For contributions to nonsmooth analysis and classical analysis as well as experimental mathematics and visualization of mathematics."

John Monaghan
Luc Trouche
Jonathan M. Borwein

## Tools and Mathematics

Instruments for learning
J. Monaghan, L. Trouche, J.M. Borwein Tools and Mathematics

Instruments for learning

Series: Mathematics Education Library

- The only book on the topic of tools and mathematics education
- Comprehensive coverage from pre-history to future directions in the field
- Content divided equally among the areas of curriculum, assessment, and policy design

This book is an exploration of tools and mathematics and issues in mathematics education related to tool use. The book has four parts. The first part sets the scene with a reflection on doing a mathematical task with different tools, a mathematician's account of tool use in his work and historical considerations of tool use. The second part opens with a broad review of technology and intellectual trends, circa 1970, and continues with three case studies of approaches in mathematics education and the place of tools in these approaches. The third part considers issues related to mathematics instructions: curriculum, assessment and policy; the calculator debate; mathematics in the real world; and teachers' use of technology. The final part looks to the future and digital tools: task design; the importance of artefacts in gameplay; and new forms of activity via connectivity.

## Key References and URLS

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http://dx.doi.org/10.4153/CJM-2011-079-2.

## Contents

(1) PART III: Randomness

- Randomness is slippery
- Pi is not 22/7
- Continued fractions
- Is Pi random?

O
Normality

- Normality
- Normality of Pi
- BBP digit algorithms

O
Random-ish walks and

- Some background
- IIla. Short rambles
- Simulating densities
(4)


## Special functions

- Meijer-G
${ }^{( }{ }_{p} F_{q}$


## Number walks

- Number walks (base four)


## Walks on 'reals

- IIIb: Study of number walks
- IIIc: Stoneham numbers

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- Number of points visited
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## Other formats

- Fractals everywhere
- 3D drunkard's walks
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$\mathbf{6} \mapsto \mathbf{1 2} \mapsto 24 \mapsto 48 \mapsto \mathbf{9 6}$ to obtain the estimate

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3 \frac{10}{71}<\pi<3 \frac{10}{70} .
$$

## Archimedes' "Method of Mechanical Theorems"

Pi movie below

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- Only recently rediscovered and even more recently reconstructed ...


## Proving $\pi$ is not $\frac{22}{7}$

Even Maple or Mathematica 'knows' this since

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\begin{equation*}
0<\int_{0}^{1} \frac{(1-x)^{4} x^{4}}{1+x^{2}} d x=\frac{22}{7}-\pi, \tag{1}
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- Accidentally, $22 / 7$ is one of the early continued fraction approximation to $\pi$. These commence:

$$
3, \frac{22}{7}, \frac{333}{106}, \frac{355}{113}, \ldots
$$

## (1) PART III: Randomness

- Randomness is slippery
- Pi is not $22 / 7$
- Continued fractions
- Is Pi random?
,
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- Normality
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(3)

Random-ish walks and

- Some background
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\int_{0}^{t} \frac{x^{4}(1-x)^{4}}{1+x^{2}} d x=\frac{1}{7} t^{7}-\frac{2}{3} t^{6}+t^{5}-\frac{4}{3} t^{3}+4 t-4 \arctan (t)
$$

as differentiation easily confirms, and the fundamental theorem of calculus proves (1).

An opinion without 3.14 is an onion. You'll understand.

## Randomness

- The digits expansions of $\pi, e, \sqrt{2}$ appear to be "random":

$$
\begin{aligned}
\pi & =3.141592653589793238462643383279502884197169399375 \ldots \\
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## Are they really?

- 1949 ENIAC (Electronic Numerical Integrator and Calculator) computed of $\pi$ to 2,037 decimals (in 70 hours)—proposed by polymath John von Neumann (1903-1957) to shed light on distribution of $\pi$ (and of $e$ ).



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## Two continued fractions

## Change representations often

Gauss map. Remove the integer, invert the fraction and repeat: for 3.1415926 and 2.7182818 to get the fractions below.


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Leonhard Euler (17071783) named $e$ and $\pi$.
"Lisez Euler, lisez Euler, c'est notre maître à tous." Simon Laplace (1749-1827)

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References

## Are the digits of $\pi$ random?

| Digit | Ocurrences |
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| 0 | $99,993,942$ |
| 1 | $99,997,334$ |
| 2 | $100,002,410$ |
| 3 | $99,986,911$ |
| 4 | $100,011,958$ |
| 5 | $99,998,885$ |
| 6 | $100,010,387$ |
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Table: Counts of first billion digits of $\pi$. Second half is 'right' for law of large
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- There are equally many zeroes and ones in the binary expansion of $\pi$
- Or pretty much anything else...


## What is "random"?

## A hard question



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It might be:

- Unpredictable (fair dice or coin-flips)?
- Without structure (noise)?
- Algorithmically random ( $\pi$ is not)?
- Quantum random (radiation)?

Folks believe this is the most random.

- Incompressible ('zip' does not help)?


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Conjecture (Borel) All irrational algebraic numbers are $b$-normal

Best Theorem [BBCP, 04] (Feeble but hard) Asymptotically all degree $d$ algebraics have at least $n^{1 / d}$ ones in binary (should be $n / 2$ )

## Randomness in Pi?



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```
http://mkweb.bcgsc.ca/pi/art/
```



- a better color palette for art if not for science


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## Normality

## Definition

A real constant $\alpha$ is $b$-normal if, given the positive integer $b \geq 2$ (the base), every $m$-long string of base- $b$ digits appears in the base- $b$ expansion of $\alpha$ with precisely the expected limiting frequency $1 / b^{m}$.

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- Indeed, almost all real numbers are $b$-normal simultaneously for all positive integer bases ("absolute normality").



## Normality

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A real constant $\alpha$ is $b$-normal if, given the positive integer $b \geq 2$ (the base), every $m$-long string of base- $b$ digits appears in the base- $b$ expansion of $\alpha$ with precisely the expected limiting frequency $1 / b^{m}$.

- Given an integer $b \geq 2$, almost all real numbers, with probability one, are $b$-normal (Borel).
- Indeed, almost all real numbers are $b$-normal simultaneously for all positive integer bases ("absolute normality").
- Unfortunately, it has been very difficult to prove normality for any number in a given base $b$, much less all bases simultaneously.



## Normal numbers

## concatenation numbers

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- The first Champernowne number proven 10-normal was:

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C_{10}:=0.123456789101112131415161718 \ldots
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C E(10):=0.23571113171923293137414347 \ldots
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- Copeland-Erdős constant
- Normality proofs are not known for $\pi, e, \log 2, \sqrt{2}$ etc.


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## Theorem (Davenport-Erdös (1952))

Let $p$ be any polynomial positive on the natural numbers. Then the concatenation number

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0 . p(1) p(2) p(3) \ldots p(n) \ldots
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is Borel normal (in the base of presentation).

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- Includes Champernowne's number and 0.1491625... (Besicovich)
- See H. Davenport and P. Erdös, "Note on normal numbers." Can. J. Math., 4 (1952), 58-63.


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## - Normality of Pi

- BBP digit algorithmsRandom-ish walks and
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- Meijer-G
- ${ }_{p} F_{q}$

Number walks

- Number walks (base four)

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- IIIb: Study of number walks
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| String | Occurrences | String | Occurrences | String | Occurrences |
| :---: | ---: | :---: | ---: | :---: | :---: |
| 0 | $99,993,942$ | 00 | $10,004,524$ | 000 | $1,000,897$ |
| 1 | $99,997,334$ | 01 | $9,998,250$ | 001 | $1,000,758$ |
| 2 | $100,002,410$ | 02 | $9,999,222$ | 002 | $1,000,447$ |
| 3 | $99,986,911$ | 03 | $10,000,290$ | 003 | $1,001,566$ |
| 4 | $100,011,958$ | 04 | $10,000,613$ | 004 | $1,000,741$ |
| 5 | $99,998,885$ | 05 | $10,002,048$ | 005 | $1,002,881$ |
| 6 | $100,010,387$ | 06 | $9,995,451$ | 006 | 999,294 |
| 7 | $99,996,061$ | 07 | $9,993,703$ | 007 | 998,919 |
| 8 | $100,001,839$ | 08 | $10,000,565$ | 008 | 999,962 |
| 9 | $100,000,273$ | 09 | $9,999,276$ | 009 | 999,059 |
|  |  | 10 | $9,997,289$ | 010 | 998,884 |
|  |  | 11 | $9,997,964$ | 011 | $1,001,188$ |
|  |  | $\vdots$ | $\vdots$ | $\vdots$ | $\vdots$ |
|  |  | 99 | $10,003,709$ | 099 | 999,201 |
|  |  |  |  | $\vdots$ | $\vdots$ |
|  |  |  |  | 999 | $1,000,905$ |
| TOTAL | $1,000,000,000$ | TOTAL | $1,000,000,000$ | TOTAL | $1,000,000,000$ |

Table: Counts for the first billion digits of $\pi$.

## Is $\pi$ 16-normal

$\hookleftarrow$ Counts of first trillion hex digits

| 0 | 62499881108 |
| :---: | ---: |
| 1 | 62500212206 |
| 2 | 62499924780 |
| 3 | 62500188844 |
| 4 | 62499807368 |
| 5 | 62500007205 |
| 6 | 62499925426 |
| 7 | 62499878794 |
| 8 | $\underline{\mathbf{6 2 5 0 0 2} 16752}$ |
| 9 | 62500120671 |
| A | 62500266095 |
| B | 62499955595 |
| C | 62500188610 |
| D | 62499613666 |
| E | 62499875079 |
| F | 62499937801 |
| Total | $\mathbf{1 , 0 0 0 , 0 0 0 , 0 0 0 , 0 0 0}$ |

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- They are 353CB3F7F0C9ACCFA9AA215F2

See www.karrels.org/pi/index.html
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## Modern $\pi$ Calculation Records:

| Name | Year | Correct Digits |
| :--- | :---: | :---: |
| Miyoshi and Kanada | 1981 | $2,000,036$ |
| Kanada-Yoshino-Tamura | 1982 | $16,777,206$ |
| Gosper | 1985 | $17,526,200$ |
| Bailey | Jan. 1986 | $29,360,111$ |
| Kanada and Tamura | Sep. 1986 | $33,554,414$ |
| Kanada and Tamura | Oct. 1986 | $67,108,839$ |
| Kanada et. al | Jan. 1987 | $134,217,700$ |
| Kanada and Tamura | Jan. 1988 | $201,326,551$ |
| Chudnovskys | May 1989 | $480,000,000$ |
| Kanada and Tamura | Jul. 1989 | $536,870,898$ |
| Kanada and Tamura | Nov. 1989 | $1,073,741,799$ |
| Chudnovskys | Aug. 1991 | $2,260,000,000$ |
| Chudnovskys | May 1994 | $4,044,000,000$ |
| Kanada and Takahashi | Oct. 1995 | $6,442,450,938$ |
| Kanada and Takahashi | Jul. 1997 | $51,539,600,000$ |
| Kanada and Takahashi | Sep. 1999 | $206,158,430,000$ |
| Kanada-Ushiro-Kuroda | Dec. 2002 | $1,241,100,000,000$ |
| Takahashi | Jan. 2009 | $1,649,000,000,000$ |
| Takahashi | April 2009 | $2,576,980,377,524$ |
| Bellard | Dec. 2009 | $2,699,99,990,000$ |
| Kondo and Yee | Aug. 2010 | $\mathbf{5 , 0 0 0 , 0 0 0 , 0 0 0 , 0 0 0}$ |
| Kondo and Yee | Oct. 2011 | $\mathbf{1 0 , 0 0 0 , 0 0 0 , 0 0 0 , 0 0 0}$ |
| Kondo and Yee | Dec. 2013 | $\mathbf{1 2 , 1 0 0 , 0 0 0 , 0 0 0 , 0 0 0}$ |



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Prior to 1996, most folks thought to compute the $d$-th digit of $\pi$, you had to generate the (order of) the entire first $d$ digits. This is not true:

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- An algorithm found by computer-now used to check record $\pi$ computations and in some compilers.


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This is based on the following then new formula for $\pi$ :

$$
\begin{equation*}
\pi=\sum_{i=0}^{\infty} \frac{1}{16^{i}}\left(\frac{4}{8 i+1}-\frac{2}{8 i+4}-\frac{1}{8 i+5}-\frac{1}{8 i+6}\right) \tag{2}
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where ${ }_{2} \mathrm{~F}_{1}(1,1 / 4 ; 5 / 4,-1 / 4)=0.955933837 \ldots$ is a Gaussian hypergeometric function.

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- Bailey-Crandall (220) link BBP and normality.


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- Won by David Deutsch — discoverer of Quantum Computing.


## Stefan Banach (1892-1945) <br> Another Nazi casualty

A mathematician is a person who can find analogies between theorems; a better mathematician is one who can see analogies between proofs and the best mathematician can notice analogies between theories. ${ }^{3}$


[^5]
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L: Pearson posed question about a 'rambler' taking unit random steps (Nature, '05).

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- UNSW: Donovan and Nuyens, WWII cryptography.


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John William Strutt (Lord Rayleigh) (1842-1919): discoverer of Argon, explained why sky is blue.
The problem "is the same as that of the composition of $n$ isoperiodic vibrations of unit amplitude and phases distributed at random" he studied in 1880 (diffusion equation, Brownian motion, ...)

Karl Pearson (1857-1936): founded statistics, eugenicist \& socialist, changed name $(C \mapsto K)$, declined knighthood.

- UNSW: Donovan and Nuyens, WWII cryptography.
- appear in graph theory, quantum chemistry, in quantum physics as hexagonal and diamond lattice integers, etc ...


## The first walk (Venn)

## Why is the sky blue?



The first person to visualize the random nature of pi's decimal digits was the Victorian nathematician John Venn. In The Logic of Chance (1888), he suggested that the digits 0 to 7 epresent eight compass directions, and he followed the path tracked by these digits in pi. He nisses out the initial 3, and starts 14159. Venn's image was the first "random walk", an idea now ised frequently in probability and statistics. (The illustration is taken from my book, Alex's tdventures in Numberland)


MY HOBBY: TEACHING TRICKY QUESTIONS TO THE CHILDREN OF MY SCIENTIST FRIENDS.

## One 1500-step ramble: a familiar picture



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- 1D (and 3D) easy. Expectation of RMS distance is easy $(\sqrt{n})$.


## One 1500-step ramble: a familiar picture



- 1D (and 3D) easy. Expectation of RMS distance is easy $(\sqrt{n})$.
- 1D or 2D lattice: probability one of returning to the origin.


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- Some background
- Illa. Short rambles
- Simulating densities
©
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- Meijer-G
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- Number walks (base four)

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- IIIb: Study of number walks
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- Fractal and box-dimension
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- Walks on the genome


## Case study II: short rambles



1000 three-step uniform planar walks

## The moments of an $n$-step planar walk:

- Second simplest case:

$$
W_{2}=\int_{0}^{1} \int_{0}^{1}\left|e^{2 \pi i x}+e^{2 \pi i y}\right| \mathrm{d} x \mathrm{~d} y=?
$$

[^6]
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- Mathematica 10 and Maple 18 still think the answer is 0 ('bug' or 'feature'?).

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- Mathematica 10 and Maple 18 still think the answer is 0 ('bug' or 'feature'?).
- There is always a 1-dimension reduction ${ }^{4}$

$$
\begin{aligned}
W_{n}(s) & =\int_{[0,1]^{n}}\left|\sum_{k=1}^{n} e^{2 \pi x_{k} i}\right|^{s} \mathrm{~d}\left(x_{1}, \ldots, x_{n-1}, x_{n}\right) \\
& =\int_{[0,1]^{n-1}}\left|1+\sum_{k=1}^{n-1} e^{2 \pi x_{k} i}\right|^{s} \mathrm{~d}\left(x_{1}, \ldots, x_{n-1}\right)
\end{aligned}
$$

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\end{aligned}
$$

- So $W_{2}=4 \int_{0}^{1 / 4} \cos (\pi x) \mathrm{d} x=\frac{4}{\pi}$.


## Art meets science

## Art meets science

## AAAS \& Bridges conference



A visualization of six routes that 1000 ants took after leaving their nest in search of food. The jagged blue lines represent the breaking off of random ants in search of seeds.
(Nadia Whitehead 2014-03-25 16:15)

## Art meets science

## AAAS \& Bridges conference



A visualization of six routes that 1000 ants took after leaving their nest in search of food. The jagged blue lines represent the breaking off of random ants in search of seeds.
(Nadia Whitehead 2014-03-25 16:15)
(JonFest 2011 Logo) Three-step random walks. The (purple) expected distance travelled is 1.57459 ..

The closed form $W_{3}$ is given below.


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## Simulating the densities for $n=3,4$



3-Step Radial Random Walk Probability Density
for $1,000,000$ Trials Allocated to 1,000 Radius Bins


5-Step Radial Random Walk Probability Density
for $1,000,000$ Trials Allocated to 1,000 Radius Bins


4-Step Radial Random Walk Probability Density for 1,000,000 Trials Allocated to 1,000 Radius Bins


6-Step Radial Random Walk Probability Density
for $1,000,000$ Trials Allocated to 1,000 Radius Bins


## Pearson's original full question

A man starts from a point $O$ and walks $l$ yards in a straight line; he then turns through any angle whatever and walks another lyards in a second straight line. He repeats this process $n$ times. I require the probability that after these $n$ stretches he is at a distance between $r$ and $r+\delta r$ from his starting point, $O$.

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"the graphical construction, however carefully reinvestigated, did not permit of our considering the curve to be anything but a straight line. . . Even if it is not absolutely true, it exemplifies the extraordinary power of such integrals of J [Bessel] products to give extremely close approximations to such simple forms as horizontal lines."

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- JMAA 2016. Our analysis of short walks extends interestingly to arbitrary dimensions (JMB, Straub, Vignat).


## The radial densities for $n=3,4$ are modular functions

Let $\sigma(x):=\frac{3-x}{1+x}$. Then $\sigma$ is an involution on $[0,3]$ sending $[0,1]$ to $[1,3]$ :

$$
\begin{equation*}
p_{3}(x)=\frac{4 x}{(3-x)(x+1)} p_{3}(\sigma(x)) . \tag{3}
\end{equation*}
$$

So $\frac{3}{4} p_{3}^{\prime}(0)=p_{3}(3)=\frac{\sqrt{3}}{2 \pi}, p(1)=\infty$.

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So $\frac{3}{4} p_{3}^{\prime}(0)=p_{3}(3)=\frac{\sqrt{3}}{2 \pi}, p(1)=\infty$. We found:

$$
p_{3}(\alpha)=\frac{2 \sqrt{3} \alpha}{\pi\left(3+\alpha^{2}\right)}{ }_{2} F_{1}\left(\begin{array}{c}
\frac{1}{3}, \frac{2}{3} \\
1
\end{array} \left\lvert\, \frac{\alpha^{2}\left(9-\alpha^{2}\right)^{2}}{\left(3+\alpha^{2}\right)^{3}}\right.\right)=\frac{2 \sqrt{3}}{\pi} \frac{\alpha}{\mathrm{AG}_{3}\left(3+\alpha^{2}, 3\left(1-\alpha^{2}\right)^{2 / 3}\right)}
$$

where $\mathrm{AG}_{3}$ is the cubically convergent mean iteration (1991):

$$
\mathrm{AG}_{3}(a, b):=\frac{a+2 b}{3} \bigotimes\left(b \cdot \frac{a^{2}+a b+b^{2}}{3}\right)^{1 / 3}
$$

The densities $p_{3}(\mathrm{~L})$ and $p_{4}(\mathrm{R})$

## Formula for the 'shark-fin' $p_{4}$

We ultimately deduce on $2 \leq \alpha \leq 4$ a hyper-closed form:

$$
p_{4}(\alpha)=\frac{2}{\pi^{2}} \frac{\sqrt{16-\alpha^{2}}}{\alpha}{ }_{3} F_{2}\left(\left.\begin{array}{c}
\frac{1}{2}, \frac{1}{2}, \frac{1}{2}  \tag{5}\\
\frac{5}{6}, \frac{7}{6}
\end{array} \right\rvert\, \frac{\left(16-\alpha^{2}\right)^{3}}{108 \alpha^{4}}\right) .
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$$

$\leftarrow p_{4}$ from (5) vs 18-terms of empirical power series
$\checkmark$ Proves $p_{4}(2)=\frac{2^{7 / 3} \pi}{3 \sqrt{3}} \Gamma\left(\frac{2}{3}\right)^{-6}=$

$$
\frac{\sqrt{3}}{\pi} W_{3}(-1) \approx 0.494233<\frac{1}{2}
$$

- Empirically, quite marvelously, we found - and proved by a subtle use of distributional Mellin transforms - that on $[0,2]$ as well:

$$
p_{4}(\alpha) \stackrel{?}{=} \quad \frac{2}{\pi^{2}} \frac{\sqrt{16-\alpha^{2}}}{\alpha} \Re_{3} F_{2}\left(\left.\begin{array}{c}
\frac{1}{2}, \frac{1}{2}, \frac{1}{2}  \tag{6}\\
\frac{5}{6}, \frac{7}{6}
\end{array} \right\rvert\, \frac{\left(16-\alpha^{2}\right)^{3}}{108 \alpha^{4}}\right)
$$

(Discovering this $\Re$ brought us full circle.)

The radial densities for $5 \leq n \leq 8$

## (and large $n$ approximation)






## The radial densities for $5 \leq n \leq 8$




Both $p_{2 n+4}, p_{2 n+5}$ are $n$-times continuously differentiable for $x>0$ with $p_{n}(x) \sim \frac{2 x}{n} e^{-x^{2} / n}$. So "four is small" but "eight is large."



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- Pearson wondered if $p_{5}$ was linear on $[0,1]$. Only disproven in sixties.


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## Meijer-G (1936) form for $W_{3}$

## Theorem (Meijer-G form for $W_{3}$ )

For $s$ not an odd integer

$$
W_{3}(s)=\frac{\Gamma\left(1+\frac{s}{2}\right)}{\sqrt{\pi} \Gamma\left(-\frac{s}{2}\right)} G_{33}^{21}\left(\left.\begin{array}{c|c}
1,1,1 & \frac{1}{2},-\frac{s}{2},-\frac{s}{2}
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- Proved using residue calculus methods.



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- First found by Crandall via CAS.
- Proved using residue calculus methods.
- $W_{3}(s)$ is among the first non-trivial higher order Meijer-G function to be placed in closed form.



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For $\Re s>-2$ and $s$ not an odd integer

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W_{4}(s)=\frac{2^{s}}{\pi} \frac{\Gamma\left(1+\frac{s}{2}\right)}{\Gamma\left(-\frac{s}{2}\right)} G_{44}^{22}\left(\left.\begin{array}{c}
1, \frac{1-s}{2}, 1,1  \tag{7}\\
\frac{1}{2}-\frac{s}{2},-\frac{s}{2},-\frac{s}{2}
\end{array} \right\rvert\, 1\right) .
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He [Gauss (or Mathematica)] is like the fox, who effaces his tracks in the sand with his tail.- Niels Abel (1802-1829)

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But we really need a formula with $s=1$, that is an integer.

## Visualizing $W_{4}, W_{5}$, and $W_{6}$ on the real line




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- Use recursion from $s>1$


## Visualizing $W_{4}, W_{5}$, and $W_{6}$ on the real line




- Use recursion from $s>1$
- Nonnegativity of $W_{4}$ was hard to prove (Wan)


## Visualizing $W_{4}$ in the complex plane



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- Easily drawn now in Mathematica from the Meijer-G representation


## Visualizing $W_{4}$ in the complex plane



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- Each point is coloured differently (black is zero and white infinity). Note the poles and zeros.


## Visualizing $W_{4}$ in the complex plane:



- Easily drawn now in Mathematica from the Meijer-G representation.
- Each quadrant is coloured differently (black is zero and white infinity). Note the poles and zeros.


## Visualizing $W_{4}$ in the complex plane:



- Less easily drawn now from the Meijer-G representation.
- As prepared for Springer's Mathematical Beauties (2016).


## Simplifying the Meijer integrals for $W_{3}$ and $W_{4}$

- We (humans and/or computers) now obtained:


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## Corollary (Hypergeometric forms for non-integer $s>-2$ )

$$
W_{3}(s)=\frac{\tan \left(\frac{\pi s}{2}\right)}{2^{2 s+1}}\binom{s}{\frac{s-1}{2}}^{2}{ }_{3} F_{2}\left(\left.\begin{array}{c}
\frac{1}{2}, \frac{1}{2}, \frac{1}{2} \\
\frac{s+3}{2}, \frac{s+3}{2}
\end{array} \right\rvert\, \frac{1}{4}\right)+\binom{s}{\frac{s}{2}}{ }_{3} F_{2}\left(\left.\begin{array}{c}
-\frac{s}{2},-\frac{s}{2},-\frac{s}{2} \\
1,-\frac{s-1}{2}
\end{array} \right\rvert\, \frac{1}{4}\right),
$$

and
$W_{4}(s)=\frac{\tan \left(\frac{\pi s}{2}\right)}{2^{2 s}}\binom{s}{\frac{s-1}{2}}^{3}{ }_{4} F_{3}\left(\left.\begin{array}{c}\frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{s}{2}+1 \\ \frac{s+3}{2}, \frac{s+3}{2}, \frac{s+3}{2}\end{array} \right\rvert\, 1\right)+\binom{s}{\frac{s}{2}} 4 F_{3}\left(\left.\begin{array}{c}\frac{1}{2},-\frac{s}{2},-\frac{s}{2},-\frac{s}{2} \\ 1,1,-\frac{s-1}{2}\end{array} \right\rvert\, 1\right)$.

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- We (humans) were able to provably take the limit at $\pm$ 1: e.g.,

$$
\begin{aligned}
W_{4}(-1) & =\frac{\pi}{4}{ }_{7} F_{6}\left(\left.\begin{array}{c}
\frac{5}{4}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2} \\
\frac{1}{4}, 1,1,1,1,1
\end{array} \right\rvert\, 1\right)=\frac{\pi}{4} \sum_{n=0}^{\infty} \frac{(4 n+1)\binom{2 n}{n}^{6}}{4^{6 n}} \\
& =\frac{\pi}{4}{ }_{6} F_{5}\binom{\frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \frac{1}{2}, \left.\frac{1}{2} \right\rvert\, 1}{1,1,1,1,1}+\frac{\pi}{64}{ }_{6} F_{5}\left(\left.\begin{array}{c}
\frac{3}{2}, \frac{3}{2}, \frac{3}{2}, \frac{3}{2}, \frac{3}{2}, \frac{3}{2} \\
2,2,2,2,2
\end{array}\right|_{1}\right) .
\end{aligned}
$$

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9) References

## Hypergeometric values of $W_{3}$ :

With much work involving moments of elliptic integrals we obtain:

## Theorem (Tractable hypergeometric form for $W_{3}$ )

(a) For $s \neq-3,-5,-7, \ldots$, we have

$$
W_{3}(s)=\frac{3^{s+3 / 2}}{2 \pi} \beta\left(s+\frac{1}{2}, s+\frac{1}{2}\right){ }_{3} F_{2}\left(\left.\begin{array}{c}
\frac{s+2}{2}, \frac{s+2}{2}, \frac{s+2}{2}  \tag{8}\\
1, \frac{s+3}{2}
\end{array} \right\rvert\, \frac{1}{4}\right) .
$$

(b) For every natural number $k=1,2, \ldots$,

$$
W_{3}(-2 k-1)=\frac{\sqrt{3}\binom{2 k}{k}^{2}}{2^{4 k+1} 3^{2 k}} 3 F_{2}\left(\left.\begin{array}{c}
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k+1, k+1
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$$

- The following formula hints at role played by Bessel functions (Kluywer 1906 and http:
//www.carma.newcastle.edu.au/jon/walks-anu.pdf):

$$
W_{n}=n \int_{0}^{\infty} J_{1}(x) J_{0}(x)^{n-1} \frac{\mathrm{dx}}{x} \approx \frac{\sqrt{n \pi}}{2}
$$

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## What is a (base four) random walk ?

Pick a random number in $\{0,1,2,3\}$ and move according to $0=\rightarrow, 1=\uparrow, 2=\leftarrow, 3=\downarrow$

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## 11222330

## What is a random walk (base 4)?

Pick a random number in $\{0,1,2,3\}$ and move $0=\rightarrow, 1=\uparrow, 2=\leftarrow, 3=\downarrow$



Figure: A million step base-4 pseudorandom walk. We use the spectrum to show when we visited each point (ROYGBIV and R).

## Random walks look similarish



Figure: Eight different base-4 (pseudo)random ${ }^{5}$ walks of one million steps.

[^8]

Figure: Directions for base-3 and base-7 random walks.

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## III: Two rational numbers

## The base-4 digit expansion of $Q 1$ and $Q 2$ :

## Q1=

0.221221012232121200122101223121001222100011232123121000122210001222 10001222100012221000012221000122201103010122010012010311033333333333 33333333333333330111111111111111111111111111100100000000300300320032 00320030223000322203000322230003022220300032223000322230003222300032 22320000232223000322230032221330023321233023213232112112121222323233 33303000001000323003230032203032030110333011103301103101111011332333 323232232122121121112112232222122 . .

Q2 $=$
0.221221012232121200122101223121001222100011232123121000122210001222 10001222100012221000012221000122201103010122010012010311033333333333 33333333333333330111111111111111111111111111100100000000300300320032 00320030223000322203000322230003022220300032223000322230003222300032 22320000232223000322230032221330023321233023213232112112121222323233 33303000001000323003230032203032030110333011103301103101111011000000 000000...

## III: Two rational numbers



Figure: Self-referent walks on the rational numbers $Q 1$ (top) and $Q 2$ (bottom).

The following relatively small rational numbers [G. Marsaglia, 2010]

$$
Q 3=\frac{3624360069}{7000000001} \text { and } Q 4=\frac{123456789012}{1000000000061},
$$

have base-10 periods with huge length of $\mathbf{1 , 7 5 0 , 0 0 0 , 0 0 0}$ digits and $1,000,000,000,060$ digits, respectively.

## Two more rationals

The following relatively small rational numbers [G. Marsaglia, 2010]

$$
Q 3=\frac{3624360069}{7000000001} \text { and } Q 4=\frac{123456789012}{1000000000061},
$$

have base-10 periods with huge length of $\mathbf{1 , 7 5 0 , 0 0 0 , 0 0 0}$ digits and $1,000,000,000,060$ digits, respectively.


Figure: Walks on the first million base-10 digits of the rationals $Q 3$ and $Q 4$.

## Walks on the digits of numbers



Figure: A walk on the first 10 million base- 4 digits of $\pi$.
See also D. Bailey, J. Borwein, R. Brent and M. Reisi, "Reproducibility in computational science a case study: randomness of the digits of Pi." Preprint 2016.
https://www.carma.newcastle.edu.au/jon/pi-repro.pdf

## Walks on the digits of numbers



Figure: 100 million base- 4 digits of $\pi$ coloured by number of returns to points.

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## The Stoneham numbers

$$
\alpha_{b, c}=\sum_{n=1}^{\infty} \frac{1}{c^{n} b^{\pi}}
$$

1973 Richard Stoneham proved some of the following (nearly 'natural') constants are $b$-normal for relatively prime integers $b, c$ :

$$
\alpha_{b, c}:=\frac{1}{c b^{c}}+\frac{1}{c^{2} b^{c^{2}}}+\frac{1}{c^{3} b^{c^{3}}}+\ldots
$$

Such super-geometric sums are Stoneham constants. To 10 places

$$
\alpha_{2,3}=\frac{1}{24}+\frac{1}{3608}+\frac{1}{3623878656}+\ldots
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- Since $3<2^{3-1}=4, \alpha_{2,3}$ is 2-normal and 6-nonnormal!


## The Stoneham numbers <br> $$
\alpha_{b, c}=\sum_{n=1}^{\infty} \frac{1}{c^{n} b^{x}}
$$



Figure: $\alpha_{2,3}$ is 2-normal (top) but 6-nonnormal (bottom). Is seeing believing?

## The Stoneham numbers <br> $$
\alpha_{b, c}=\sum_{n=1}^{\infty} \frac{1}{c^{n} b^{n}}
$$



Figure: Is $\alpha_{2,3}$ 3-normal or not?

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## The expected distance to the origin

## Theorem

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$\left.\begin{array}{|c|c|r|c|c|}\hline \text { Number } & \text { Base } & \text { Steps } & \begin{array}{c}\text { Average normalized } \\ \text { dist. to the origin: } \\ \frac{1}{\text { Steps }} \sum_{N=2}^{\text {Steps }} \frac{\text { dist }}{N}\end{array} & \text { Normal } \\ \hline \frac{\sqrt{\pi N}}{2}\end{array}\right]$

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## Number of points visited

- The expected number of distinct points visited by an $N$-step random walk on a two-dimensional lattice behaves for large $N$ like $\pi N / \log (N)$ (Dvoretzky-Erdős, 1951).


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- 1988 D. Downham and S. Fotopoulos gave better bounds on the expectation. It lies in:

$$
\left(\frac{\pi(N+0.84)}{1.16 \pi-1-\log 2+\log (N+2)}, \frac{\pi(N+1)}{1.066 \pi-1-\log 2+\log (N+1)}\right) .
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$$

- For example, for $N=10^{6}$ these bounds are (199256.1,203059.5), while $\pi N / \log (N)=227396$, which overestimates the expectation.


## Catalan's constant <br> $$
G=1-1 / 4+1 / 9-1 / 16+\cdots
$$



Figure: A walk on one million quad-bits of $G$ with height showing frequency

## Paul Erdős (1913-1996)

## "My brain is open"


(a) Paul Erdős (Banff 1981. I was there)

(b) Émile Borel (1871-1956)

Figure: Two of my favourites. Consult MacTutor.

## Number of points visited:

## Again $\pi$ looks random


(a) (Pseudo)random walks.

(b) Walks built by chopping up 10 billion digits of $\pi$.

Figure: Number of points visited by 10,000 million-steps base-4 walks.

## Points visited by various base-4 walks

| Number | Steps | Sites visited | Bounds on the expectation of sites visited by a random walk |  |
| :---: | :---: | :---: | :---: | :---: |
|  |  |  | Lower bound | Upper bound |
| Mean of 10,000 random walks | 1,000,000 | 202,684 | 199,256 | 203,060 |
| Mean of 10,000 walks on the digits of $\pi$ | 1,000,000 | 202,385 | 199,256 | 203,060 |
| $\alpha_{2,3}$ | 1,000,000 | 95,817 | 199,256 | 203,060 |
| $\alpha_{3,2}$ | 1,000,000 | 195,585 | 199,256 | 203,060 |
| $\pi$ | 1,000,000 | 204,148 | 199,256 | 203,060 |
| $\pi$ | 10,000,000 | 1,933,903 | 1,738,645 | 1,767,533 |
| $\pi$ | 100,000,000 | 16,109,429 | 15,421,296 | 15,648,132 |
| $\pi$ | 1,000,000,000 | 138,107,050 | 138,552,612 | 140,380,926 |
| $e$ | 1,000,000 | 176,350 | 199,256 | 203,060 |
| $\sqrt{2}$ | 1,000,000 | 200,733 | 199,256 | 203,060 |
| $\log 2$ | 1,000,000 | 214,508 | 199,256 | 203,060 |
| Champernowne $C_{4}$ | 1,000,000 | 548,746 | 199,256 | 203,060 |
| Rational number $Q_{1}$ | 1,000,000 | 378 | 199,256 | 203,060 |
| Rational number $Q_{2}$ | 1,000,000 | 939,322 | 199,256 | 203,060 |

## Normal numbers need not be so "random" ...



Figure: Champernowne $C_{10}=0.123456789101112 \ldots$ (normal). Normalized distance to the origin: 15.9 ( 50,000 steps).

## Normal numbers need not be so "random"



Figure: Champernowne $C_{4}=0.123101112132021 \ldots$ (normal). Normalized distance to the origin: 18.1 (100,000 steps). Points visited: 52760. Expectation: (23333, 23857).

## Normal numbers need not be so "random" ...



Figure: Stoneham $\alpha_{2,3}=0.0022232032 \ldots 4$ (normal base 4). Normalized distance to the origin: 0.26 (1,000,000 steps). Points visited: 95817. Expectation: $(199256,203060)$.

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Figure: Stoneham $\alpha_{2,3}=0.0022232032 \ldots 4$ (normal base 4). Normalized distance to the origin: 0.26 (1,000,000 steps). Points visited: 95817. Expectation: $(199256,203060)$.


Figure: A pattern in the digits of $\alpha_{2,3}$ base 4 . We show only positions of the walk after $\frac{3}{2}\left(3^{n}+1\right), \frac{3}{2}\left(3^{n}+1\right)+3^{n}$ and $\frac{3}{2}\left(3^{n}+1\right)+2 \cdot 3^{n}$ steps, $n=0,1, \ldots, 11$.

## Experimental conjecture

## Theorem (Base-4 structure of Stoneham $\alpha_{2,3}$ )

Denote by $a_{k}$ the $k^{\text {th }}$ digit of $\alpha_{2,3}$ in its base 4 expansion: $\alpha_{2,3}=\sum_{k=1}^{\infty} a_{k} / 4^{k}$, with $a_{k} \in\{0,1,2,3\}$ for all $k$. Then, for all $n=0,1,2, \ldots$ one has:
(i) $\sum_{k=\frac{3}{2}\left(3^{n}+1\right)}^{\frac{3}{2}\left(3^{n}+1\right)+3^{n}} e^{a_{k} \pi i / 2}=\left\{\begin{array}{lc}-i, & n \text { odd } \\ -1, & \mathrm{n} \text { even }\end{array}\right.$;
(ii) $a_{k}=a_{k+3^{n}}=a_{k+2 \cdot 3^{n}}$ if $k=\frac{3\left(3^{n}+1\right)}{2}, \frac{3\left(3^{n}+1\right)}{2}+1, \ldots, \frac{3\left(3^{n}+1\right)}{2}+3^{n}-1$.


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## Box-dimension:



$$
\text { Box-dimension }=\lim _{\text {side } \rightarrow 0} \frac{\log (\# \text { boxes })}{\log (1 / \text { side })}
$$

Norway is "frillier" - Hitchhiker's Guide to the Galaxy

## Box-dimension:



Fractals: self-similar (zoom invariant) partly space-filling shapes (clouds \& ferns not buildings \& cars). Curves have dimension 1 , squares dimension 2

## Box-dimension:



Fractals: self-similar (zoom invariant) partly space-filling shapes (clouds \& ferns not buildings \& cars). Curves have dimension 1, squares dimension 2

## Box-dimension:

## Tends to '2' for a planar random walk

Approximate fractal dimension of Pi in base 4: 1.842
Steps of the walk: $1,000,000,000$


Fractals: self-similar (zoom invariant) partly space-filling shapes (clouds \& ferns not buildings \& cars). Curves have dimension 1 , squares dimension 2

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## Fractals everywhere



## Fractals everywhere



The picture fractalized by the Barnsley's
http://frangostudio.com/frangocamera.html

## Fractals everywhere

## From Space



## Fractals everywhere



## Fractals everywhere



## Fractals everywhere



## Fractals everywhere



Pascal triangle modulo two [1] [1,1] [1,2,1] [1,3,3,1,] [1,4,6,4,1] [1,510,10,5,1] ...

## Fractals everywhere



Steps to construction of a Sierpinski cube

# The Sierpinski Triangle 

$$
1 \mapsto 3 \mapsto 9
$$



## The Sierpinski Triangle

$$
1 \mapsto 3 \mapsto 9
$$



## Fractals everywhere

## The Sierpinski Triangle

$$
1 \mapsto 3 \mapsto 9
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## Fractals everywhere

## The Sierpinski Triangle

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1 \mapsto 3 \mapsto 9
$$



http:
//oldweb.cecm.sfu.ca/cgi-bin/organics/pascalform

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Figure: Matt Skerritt's 3D walk on $\pi$ (base 6), showing one million steps. But 3D random walks are not recurrent.

## Three dimensional walks:



Figure: Matt Skerritt's 3D walk on $\pi$ (base 6 ), showing one million steps. But 3D random walks are not recurrent.
"A drunken man will find his way home, a drunken bird will get lost forever." (Kakutani)

## Three dimensional printing:



Figure: The future is here ...

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## Chaos games:



Figure: Coloured by frequency - leads to random fractals. Row 1: Champernowne $C_{3}, \alpha_{3,5}$, random, $\alpha_{2,3}$. Row 2: Champernowne $C_{4}$, $\pi$, random, $\alpha_{2,3}$. Row 3: Champernowne $C_{6}, \alpha_{3,2}$, random, $\alpha_{2,3}$.

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- Meijer-G
- ${ }_{p} F_{q}$

Number walks

- Number walks (base four)

Walks on 'reals

- IIIb: Study of number walks
- IIIc: Stoneham numbers

Features of our walks

- Expected distance to origin
- Number of points visited
- Fractal and box-dimension

8 Other formats

- Fractals everywhere
- 3D drunkard's walks
- Chaos games
- 2-automatic numbers
- Walks on the genome
(9) References


## Automatic numbers: Thue-Morse and Paper-folding

Automatic numbers are never normal. They are given by simple but fascinating rules...giving structured/boring walks:


Figure: Paper folding. The sequence of left and right folds along a strip of paper that is folded repeatedly in half in the same direction. Unfold and read 'right' as ' 1 ' and 'left' as ' 0 ': 10110011100100

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Figure: Paper folding. The sequence of left and right folds along a strip of paper that is folded repeatedly in half in the same direction. Unfold and read 'right' as ' 1 ' and 'left' as ' 0 ': 10110011100100

Thue-Morse constant (transcendental; 2-automatic, hence nonnormal):

$$
\begin{gathered}
T M_{2}=\sum_{n=1}^{\infty} \frac{1}{2^{t(n)}} \text { where } t(0)=0, \text { while } t(2 n)=t(n) \text { and } t(2 n+1)=1-t(n) \\
0.01101001100101101001011001101001 \ldots
\end{gathered}
$$

## Automatic numbers: Thue-Morse and Paper-folding

Automatic numbers are never normal. They are given by simple but fascinating rules...giving structured/boring walks:

(b) 10 million bits of paperfolding sequence.

Figure: Walks on two automatic and so nonnormal numbers.

## Automatic numbers:

## Turtle plots look great!


(a) Ten million digits of the paperfolding sequence, rotating $60^{\circ}$.

(c) 100,000 digits of the Thue-

Morse sequence, rotating $60^{\circ}$ (a Koch snowflake).
(b) One million digits of the paperfolding sequence, rotating $120^{\circ}$ (a dragon curve).

(d) One million digits of $\pi$, rotating $60^{\circ}$.

Figure: Turtle plots on various constants with different rotating angles in base 2 -where ' 0 ' yields forward motion and ' 1 ' rotation by a fixed angle.

## Contents



PART III: Randomness

- Randomness is slippery
- Pi is not 22/7
- Continued fractions
- Is Pi random?

O
Normality

- Normality
- Normality of Pi
- BBP digit algorithms


Random-ish walks and

- Some background
- IIla. Short rambles
- Simulating densities

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## Genomes as walks:

We are all base 4 numbers (ACGT/U)

Chromosome X

$$
\begin{aligned}
c & =[1,0] \\
g & =[0,1] \\
t & =[-1,0] \\
a & =[0,-1]
\end{aligned}
$$






Chromosome 1
$c=[1,0]$
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## The X Chromosome (34K) and Chromosome One (10K).

® Chromosomes look less like $\pi$ and more like concatenation numbers?

## DNA for Storage:

## We are all base 4 numbers (ACGT/U)

News Science Biochemistry and molecular biology
Shakespeare and Martin Luther King demonstrate potential of DNA storage All 154 Shakespeare sonnets have been spelled out in DNA to demonstrate the vast potential of genetic data storage

Ian Sample, science correspondent
The Guardian, Thursday 24 January 2013
Jump to comments (...)


When written in DNA, one of Shakespeare's sonnets weighs 0.3 millionths of a millionth of a gram. Photograph: Oli Scarff/Getty


Figure: The potential for DNA storage (L) and the quadruple helix (R)

## The end

## with some fractal dessert



## The end

## with some fractal dessert



## Thank you

## Other References

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http:// carma.newcastle.edu.au/walks/
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[^0]:    ${ }^{1}$ J.E. Littlewood, A mathematician's miscellany, London: Methuen (1953); Littlewood, J. E. and Bollobás, Béla, ed., Littlewood's miscellany, Cambridge University Press, 1986.

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    Littlewood, J. E. and Bollobás, Béla, ed., Littlewood's miscellany, Cambridge University Press, 1986.

[^2]:    ${ }^{2}$ See http://www.carma.newcastle.edu.au/jon/Completion.pdf and http://www.carma.newcastle.edu.au/jon/dr-fields11.pptx.

[^3]:    ${ }^{2}$ See http://www.carma.newcastle.edu.au/jon/Completion.pdf and http://www.carma.newcastle.edu.au/jon/dr-fields11.pptx.

[^4]:    ${ }^{2}$ See http://www. carma.newcastle.edu.au/jon/Completion.pdf and http://www.carma.newcastle.edu.au/jon/dr-fields11.pptx.

[^5]:    ${ }^{3}$ Only the best get stamps. Quoted in
    www-history.mcs.st-andrews.ac.uk/Quotations/Banach.html.

[^6]:    ${ }^{4}$ Quadrature was our first interest

[^7]:    ${ }^{4}$ Quadrature was our first interest

[^8]:    

[^9]:    www.digitaltrends.com/cool-tech/the-worlds-first-plane-created-entirely-by-3d-printing-takes-flight/
    www. shapeways.com/shops/3Dfractals

