# Continued fractions of algebraic numbers some statistical tests 

(preliminary report - work in progress)
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## Abstract

I study the frequency of occurence of blocks of partial quotients in the continued fractions of certain algebraic numbers (and $\pi$ ), with the aim of determining whether they conform to the expected frequencies known to hold for almost all irrational numbers.

## Classical theory

* Regular continued fractions are symbolic dynamics of the Gauss map:

$$
g(x)=1 / x-\lfloor 1 / x\rfloor \quad \text { for } \quad x \in(0,1]
$$

where the digit $x_{k}$ (partial quotient) output at the $k$ th iteration is $\lfloor 1 / x\rfloor$
$\star$ We write $x=\left[x_{1}, x_{2}, x_{3}, \ldots\right]$, where $x_{k} \in\{1,2,3, \ldots\}$

* The continued fraction is finite iff $x$ is rational
* For almost all $x$, the digit $i$ occurs with relative frequency $\mu(i) \equiv \log _{2}\left[\frac{(i+1)^{2}}{i(i+2)}\right]$
* The continued fraction is eventually periodic iff $x$ is a quadratic irrational


## Gauss map

$$
g(x)=1 / x-\lfloor 1 / x\rfloor \quad \text { for } \quad x \in(0,1]
$$



## More theory

* I want to extend this theory to look at occurrences of finite blocks of digits $i=\left(i_{1}, i_{2}, \ldots, i_{m}\right), i_{j} \geqslant 1$
* [8, p226] gives a formula for relative frequency of the $m$-block $i$ which holds as $n \rightarrow \infty$ for almost all irrationals:
$\operatorname{card}\left\{\kappa:\left(x_{\kappa}, \ldots, x_{\kappa+m-1}\right)=i, 1 \leqslant \kappa \leqslant n\right\} / n=$

$$
\log _{2}\left[\frac{1+v(i)}{1+u(i)}\right]+o\left(n^{-1 / 2} \log ^{(3+\epsilon) / 2}(n)\right)
$$

where

$$
\begin{aligned}
& u(i)= \begin{cases}\frac{p_{m}+p_{m-1}}{q_{m}+q_{m-1}} & \text { if } m \text { is odd } \\
\frac{p_{m}}{q_{m}} & \text { if } m \text { is even }\end{cases} \\
& v(i)= \begin{cases}\frac{p_{m}}{q_{m}} & \text { if } m \text { is odd } \\
\frac{p_{m}+p_{m-1}}{q_{m}+q_{m-1}} & \text { if } m \text { is even }\end{cases}
\end{aligned}
$$

with $[i]=p_{m} / q_{m}$ for the $m$-block $i$.

* For blocks of length 2 and 3, we have explicitly:

$$
\mu(i)=\log _{2}\left[\frac{\left(1+i_{1} i_{2}\right)\left(2+i_{1}+i_{2}+i_{1} i_{2}\right)}{\left(1+i_{1}+i_{1} i_{2}\right)\left(1+i_{2}+i_{1} i_{2}\right)}\right]
$$

and

$$
\mu(i)=\log _{2}\left[\frac{\left(1+i_{1}+i_{3}+i_{2} i_{3}+i_{1} i_{2} i_{3}\right)\left(1+i_{1}+i_{3}+i_{1} i_{2}+i_{1} i_{2} i_{3}\right)}{\left(i_{1}+i_{3}+i_{1} i_{2} i_{3}\right)\left(2+i_{1}+i_{2}+i_{3}+i_{2} i_{3}+i_{1} i_{2}+i_{1} i_{2} i_{3}\right)}\right]
$$

* For length 4,

$$
\mu(i)=\log _{2}\left[\frac{\left(2+i_{3}+i_{4}+i_{1}+i_{2}\left(1+i_{3}\left(1+i_{4}\right)\right)\left(1+i_{1}\right)+i_{4}\left(i_{3}+i_{1}\right)\right)\left(1+\left(i_{2}+i_{4}\right) i_{1}+i_{3} i_{4}\left(1+i_{2} i_{1}\right)\right)}{\left(1+i_{2}\left(1+i_{3} i_{4}\right)\left(1+i_{1}\right)+i_{4}\left(1+i_{3}+i_{1}\right)\right)\left(1+\left(1+i_{2}+i_{4}\right) i_{1}+i_{3}\left(1+i_{4}\right)\left(1+i_{2} i_{1}\right)\right)}\right]
$$

## Numerical values for the frequencies

For 2-blocks:

|  | 1 | 2 | 3 | 4 | 5 | 6 |
| ---: | ---: | ---: | ---: | ---: | ---: | ---: |
| 1 | 0.15200 | 0.07038 | 0.04064 | 0.02647 | 0.01861 | 0.01380 |
| 2 | 0.07038 | 0.02914 | 0.01594 | 0.01005 | 0.00691 | 0.00505 |
| 3 | 0.04064 | 0.01594 | 0.00851 | 0.00529 | 0.00361 | 0.00262 |
| 4 | 0.02647 | 0.01005 | 0.00529 | 0.00326 | 0.00221 | 0.00160 |
| 5 | 0.01861 | 0.00691 | 0.00361 | 0.00221 | 0.00150 | 0.00108 |
| 6 | 0.01380 | 0.00505 | 0.00262 | 0.00160 | 0.00108 | 0.00078 |

## More theory

* Note that $\mu(i)$ is unchanged if we reverse the block $i$, whatever the length. I do not know what other symmetries exist
* If a particular $x$ has all blocks occurring with these expected frequencies, we call $x$ normal
* Note that because of the rapid decay of correlations (approximately $(-0.3)^{n}$ at lag $n$ ), there is not much point in studying very long blocks ( $n>5$, say). For long blocks, the two ends are effectively independent. This makes an empirical study such as the present one feasible.
* Of course, we can never prove abnormality (if it exists) merely by a statistical analysis of a finite portion of the infinite continued fraction. However, we might hope to find evidence of abnormality, which can then be proven by other methods


## Literature survey

* [1] examines the first 200 digits of the real root of $x^{3}-8 x-10$; in particular it explains the occurrence of several very large digits
* [2] examines the frequency of digits amongst the first 1000 of several cubic irrationals
* [3] examines the frequency of digits amongst the first 200000 of several algebraic irrationals
* None of the above papers find any evidence of abnormality amongst the numbers examined
* In [7], we have the result $\operatorname{Pr}\left[x_{n}=r \& x_{n+k}=s\right]=$ $\operatorname{Pr}\left[x_{n}=r\right] \operatorname{Pr}\left[x_{n+k}=s\right]\left(1+O\left(q^{k}\right)\right)$, where $q \approx-0.303663$ is the Gauss-Kuzmin-Wirsing constant. This, however, is too weak a result to allow explicit statistical tests
* No papers look at the distribution of blocks of length greater than 1


## Explicit examples of abnormal numbers

* all quadratic irrationals, e.g. $2^{1 / 2}=1+[2,2,2,2, \ldots]$
$\star \mathrm{I}_{1}(2) / \mathrm{I}_{0}(2)=[1,2,3,4, \ldots]$ (ratio of modified Bessel functions)
$\star \mathrm{I}_{1+a / d}(2 / d) / \mathrm{I}_{a / d}(2 / d)=[a+d, a+2 d, a+3 d, \ldots]$
$\star \tanh (1)=[1,3,5,7, \ldots]$
$\star \exp (1 / n)=[1, n-1,1,1,3 n-1,1,1,5 n-1, \ldots] ; n=1,2,3 \ldots$
$\star \exp (2)=7+[2,1,1,3,18,5,1,1,6,30,8,1,1,9,42,11,1,1,12,54, \ldots]$
* $\exp (2 /(2 n+1)) ; n=1,2,3 \ldots$
$\star \sum_{k=1}^{\infty} 2^{-\lfloor k \phi\rfloor}=\left[2^{0}, 2^{1}, 2^{1}, 2^{3}, 2^{5}, 2^{8}, 2^{13}, \ldots\right] ; \phi=(\sqrt{5}-1) / 2$


## Other theory

* It is known that for almost all $x$, the mean of the digits does not exist. However, the mean of the log and mean of the reciprocal do exist and are approximately 0.98784905683381078769204 and 1.7454056624073468 respectively. All my examples give results consistent with these.
* Similarly for the mean of $\left(x_{j}\right)^{-k}, k=2,3,4, \ldots, 10$


## Method

* I calculate a few million digits for several cubic irrationals and a few other irrationals
* I count exactly the observed frequency of all blocks of lengths 1,2,3,4,5. I use non-overlapping blocks (thanks to Gesine Reinert for this suggestion)
* I calculate a Pearson $\chi^{2}$ test statistic which measures the deviation of the observed frequencies from the expected frequencies
* Because the number of degrees of freedom $\nu$ is so large (typically several thousand), a normal approximation is sufficiently accurate. The transformation is $Z \equiv \sqrt{2 \chi^{2}}-\sqrt{2 \nu-1}$. Under the assumption of normality (of the of of $x$ !), $Z$ is distributed $N(0,1)$
* I plot this $Z$ for blocks of length 1 (red), 2 (green), 3 (dark blue), 4 (light blue), 5 (violet) as a function of the number of digits computed. We are looking for large deviations (say, $>3$ ) away from zero as a sign of abnormality
* The rare events have to handled with care. I used this prescription: for each event $i$, I calculate its expected frequency. If this is less than 5 , I classify this as a rare event, and I lump together all rare events into one bin. If it is greater than 5 , I calculate the usual contribution to $\chi^{2}$ (i.e. (observed-expected) $)^{2}$ expected). There is also a tail correction term to $\chi^{2}$, namely those events which were never observed to occur
* There are probably better ways of doing this!
* I also do likelihood ratio tests, where the test statistic is $2 \sum$ observed $\log \frac{\text { observed }}{\text { expected }}$ However, this is probably not very different, since when $x$ (observed) is close to $y$ (expected), $2 \sum x \log (x / y) \approx \sum(x-y)^{2} / y$

Pearson $\chi^{2}$ results: $2^{1 / 3}$ and $3^{1 / 3}$

cbrt 3


Pearson $\chi^{2}$ results: $4^{1 / 3}$ and $5^{1 / 3}$
cbrt4

cbrt5


Pearson $\chi^{2}$ results: $6^{1 / 3}$ and $7^{1 / 3}$
cbrt6

cbrt7


Pearson $\chi^{2}$ results: $9^{1 / 3}$ and $2^{1 / 3}+3^{1 / 2}$


$$
c b r t 2+s q r t 3
$$



(the last example is famous for having several abnormally large digits)

Pearson $\chi^{2}$ results: $(\sqrt{5}-1) / 2+\sqrt{2}-1$ and $\pi$


Likelihood ratio results: $2^{1 / 3}$ and $3^{1 / 3}$


Likelihood ratio results: $4^{1 / 3}$ and $5^{1 / 3}$
cbrt4

cbrt5


Likelihood ratio results: $6^{1 / 3}$ and $7^{1 / 3}$
cbrt6
cbrt 7



Likelihood ratio results: $9^{1 / 3}$ and $2^{1 / 3}+3^{1 / 2}$

cbrt $2+s q r t 3$


Likelihood ratio results: $2 \cos (2 \pi / 7)$ and largest root of

$$
x^{3}-8 x-10
$$


(the last example is famous for having several abnormally large digits)

## Autocorrelation of digits

* We would expect the the autocorrelation function (acf) of any analytic function of the digits that has a finite mean (for example, the $\log$ or the reciprocal) would decay like $q^{k}$ at lag $k$, where $q \approx-0.3$ is Wirsing's constant
* This is investigated in the following graphs. I plot $\log _{10}$ of the absolute value of the acf as a function of lag. The green line has the Wirsing slope


## acf estimation difficulties

* For the $\operatorname{AR}(1)$ process $x(t+1)=\alpha x(t)+\epsilon,|\alpha|<1$, the exact acf at lag $k$ is $\rho(k)=\alpha^{k}$
* But the usual acf estimator $r$ for a sample of size $n$ has variance

$$
\operatorname{var}\left[r_{n}(k)\right]=\frac{1}{n}\left[\frac{\left(1+\alpha^{2}\right)\left(1+\alpha^{2 k}\right)}{1-\alpha^{2}}-2 k \alpha^{2 k}\right]
$$

* More generally, for a process whose acf decays for large $k$ in the same power-law fashion, we have approximate variance $\operatorname{var}\left[r_{n}(k)\right]=\frac{1}{n}\left[\frac{1+\alpha^{2}}{1-\alpha^{2}}\right]$ for large $k$.
* I expect my process to conform to this behaviour, and if it does, putting in the numbers gives an estimator of $k=6$ for the largest $k$ for which the acf estimates are meaningful
autocorrelation of logs of digits: $2^{1 / 3}$ and $3^{1 / 3}$
cbrt 2


autocorrelation of logs of digits: $4^{1 / 3}$ and $5^{1 / 3}$
cbrt4

cbrt5

autocorrelation of logs of digits: $6^{1 / 3}$ and $7^{1 / 3}$
cbrt6

cbrt 7

autocorrelation of logs of digits: $9^{1 / 3}$ and $2^{1 / 3}+3^{1 / 2}$

autocorrelation of logs of digits: $2 \cos (2 \pi / 7)$ and largest root of $x^{3}-8 x-10$




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