

BENFORD'S LAW LECTURE

• HISTORY

- Newcomb: 1880s: log-tables
- Benford: 1930s: lots of data, physics paper next to it

• DEFINITIONS

- $X > 0$, write $X = M_{10}(X) \cdot 10^{k(X)}$ where $k(X)$ is an integer and $1 \leq M_{10}(X) < 10$.

Call $M_{10}(X)$ the mantissa (Phys says significant)
See Scientific notation

- Data set satisfies Benford's Law if

$$\text{Prob}(\text{first digit base 10 is } d) = \log_{10} \left(\frac{d+1}{d} \right)$$

↳ similar result other bases

- Scale invariance of data sets

↳ look at powers of 2 - issues!

- More generally, strongly Benford if

$$\text{Prob}(M_{10}(X) \leq s) = \log_{10} s$$

BEN FORD'S LAW LECTURE

QUESTION: What systems satisfy Benford?

Financial transactions (IRS)

Metaphorical data (cities)

Fibonacci numbers

3X+1 iterates

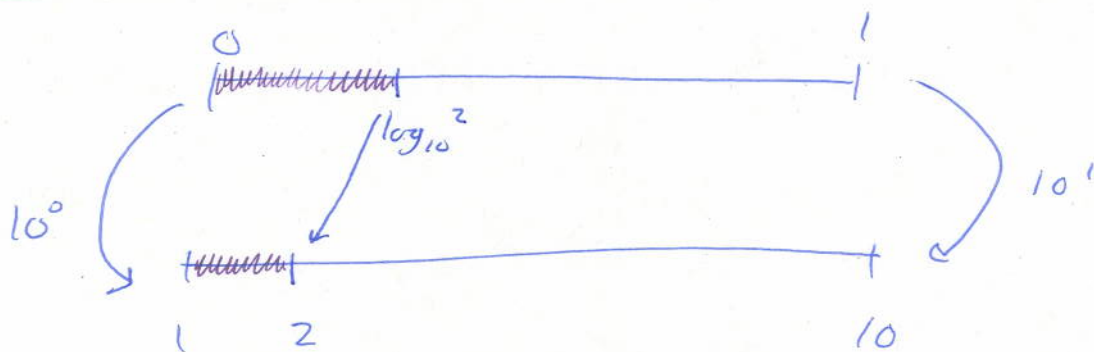
Analysations

NEW VIEWPOINT

↳ Clearly don't care about $k(x)$ if studying leading digits

$$Y_n = \log_{10} X_n \text{ mod } 1 = \log_{10} M_{10}(X)$$

Fundamental Equivalence: $\{Y_n\}$ is equidistributed (uniformly distributed) if and only if X_n is strongly Benford



What does uniformly distributed mean?

$$\lim_{N \rightarrow \infty} \frac{\#\{n \leq N : a \leq Y_n \leq b\}}{N} \rightarrow b - a$$

for any $[a, b] \subset [0, 1]$.
- Benford 2 -

BENFORD'S LAW LECTURE

Reduced Benford to uniformly distributed logarithm of mantissa: how do we show this?

Kronecker's Thm: If α is irrational then $y_n = n\alpha \bmod 1$ is equidistributed.

Proof involves lot of nice adu math (Fourier Series) ^{Sines/Cosines} _{have mod 1 constraints}

Clear need of irrational: $\alpha = \sqrt{5}$ and cycle: $\frac{1}{5}, \frac{2}{5}, \frac{3}{5}, \frac{4}{5}, 0, \frac{1}{5}, \dots$

Beyond scope of class to prove, but can at least show dense: given any $x \in [0,1]$ and any small $\epsilon > 0$ can find an n st $n\alpha \bmod 1$ is within ϵ of x .

Uses Pigeonhole's Box Principle:

↳ Pidgeon gun, fire $n+1$ pidgeons into n boxes, then at least one box gets two pidgeons.

Proof of Claim

Choose Q st $1/Q < \epsilon/2$ (wiggle room!)

look at Q boxes $(0, 1/Q), (1/Q, 2/Q), \dots, ((Q-1)/Q, 1)$

Consider $Q+1$ numbers $\alpha \bmod 1, 2\alpha \bmod 1, \dots, (Q+1)\alpha \bmod 1$

At least two in same box, say $n_1\alpha \bmod 1, n_2\alpha \bmod 1$

Get $|n_1\alpha \bmod 1 - n_2\alpha \bmod 1| < 1/Q$ as in same box

So $|(n_1 - n_2)\alpha \bmod 1| < 1/Q$, so



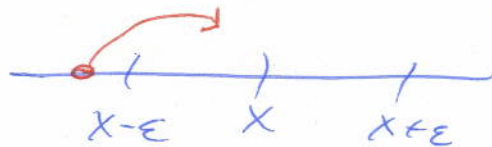
BENFORD'S LAW CONTINUED

Proof of Claim (cont)

Now just keep walking down

Move at most $\frac{1}{Q} < \epsilon$ every $n_1 - n_2$ steps

Must land within ϵ of x



↳ to miss requires step size $> 2\epsilon$

Notes

- Pidgeon hole appears on many math competitions
- See in closure in group theory
- Applications to estimating irrationals with rationals

↳ had $|(n_1 - n_2)\alpha \bmod 1| < \frac{1}{Q}$

So is an integer p such that

$$|(n_1 - n_2)\alpha - p| < \frac{1}{Q}$$

Let $q = n_1 - n_2$; note $1 \leq q < Q$. Then

$$|\alpha - \frac{p}{q}| < \frac{1}{qQ} < \frac{1}{q^2}$$

↳ little work: infinitely often rational within $\frac{1}{q^2}$

↳ measure cost by size of denom

↳ much better than expect: $\frac{314159}{100000}$ "expensive"

↳ "worst" number is golden mean, $\frac{1+\sqrt{5}}{2}$;

hardest to approx with rationals!

BENFORD LECTURE CONT

EXAMPLES OF BENFORD

• Long Street?

No, limit doesn't exist. Stop at 2.10^k just saw a lot of 6s, stop at 10^{k+1} - 1 just had a long block without 6. Percentage oscillates b/w 1/9 and 5/9.}

• Powers of 2?

Yes, though strange as no leading 9s in first 30

$$X_n = 2^n, Y_n = \log_{10}(2^n) \bmod 1 = n \log_{10} 2 \bmod 1$$

↳ Just need to show $\log_{10} 2$ irrational

↳ assume not: $\log_{10} 2 = p/q$ in lowest terms

$$\Rightarrow 2 = 10^{p/q}$$


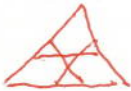

$$\Rightarrow 2^q = 10^p = 2^p 5^p$$

$$\Rightarrow 2^{q-p} = 5^p \Rightarrow q-p = p = 0$$

↳ why so few lines? 1GB = 1024 MB: $2^{10} = 1024 \approx 10^3$

Almost periodic

IRS cares about rates of convergence

Nice geometric irrationality proofs:   

BENFORD LECTURE: CONT

• EXAMPLE: FIBONACCI NUMBERS

$$F_{n+2} = F_{n+1} + F_n, \quad F_0 = 0, F_1 = 1, \dots$$

Seq now determined, but what is F_n ?

Remarkably a closed form expression exists!

METHOD OF DIVINE INSPIRATION

Guess $F_n = r^n$ and see what happens

$$\hookrightarrow r^{n+2} = r^{n+1} + r^n$$

$$r^{n+2} - r^{n+1} - r^n = 0$$

$$r^n (r^2 - r - 1) = 0; \quad r^n = 0 \text{ gives trivial soln}$$

$$r^2 - r - 1 = 0 \rightarrow r = \frac{1 \pm \sqrt{5}}{2} = r_1, r_2$$

characteristic polynomial

\hookrightarrow see r^n solves recurrence for either value

\hookrightarrow little algebra: $a r_1^n + b r_2^n$ also a soln for any a, b :

$$\begin{aligned} \hookrightarrow a r_1^{n+2} + b r_2^{n+2} &= a (r_1^{n+1} + r_1^n) + b (r_2^{n+1} + r_2^n) \\ &= (a r_1^{n+1} + b r_2^{n+1}) + (a r_1^n + b r_2^n) \end{aligned}$$

\hookrightarrow What are a, b ? Linear algebra!

$$\begin{aligned} a r_1^0 + b r_2^0 &= 0 \\ a r_1^1 + b r_2^1 &= 1 \end{aligned} \Rightarrow \begin{pmatrix} 1 & 1 \\ r_1 & r_2 \end{pmatrix} \begin{pmatrix} a \\ b \end{pmatrix} = \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

BENFORD LECTURE: CONT

Fibonacci Numbers (Cont)

Many ways to solve: linear algebra and matrix inversion or substitution.

$$a + b = 0 \quad \Rightarrow \quad b = -a$$

$$\frac{1+\sqrt{5}}{2}a + \frac{1-\sqrt{5}}{2}b = 1 \quad \Rightarrow \quad \left(\frac{1+\sqrt{5}}{2} - \frac{1-\sqrt{5}}{2}\right)a = 1 \Rightarrow a = \frac{1}{\sqrt{5}}$$

General Soln:

$$\text{BINET'S FORMULA: } F_n = \frac{1}{\sqrt{5}} \left(\frac{1+\sqrt{5}}{2}\right)^n - \frac{1}{\sqrt{5}} \left(\frac{1-\sqrt{5}}{2}\right)^n$$

Absolutely amazing

↳ This is ALWAYS an integer, but has division by 2 and has irrational $\sqrt{5}$'s....

↳ Can obtain by generating fns (bring it over, partial fractions, geo series).

Claim: Fibonacci numbers are Benford!

If n is big, as $\frac{1+\sqrt{5}}{2} > 1$ and $|\frac{1-\sqrt{5}}{2}| < 1$, have

$$F_n \approx \frac{1}{\sqrt{5}} \left(\frac{1+\sqrt{5}}{2}\right)^n \text{ as other term very small.}$$

(Need some technical book-keeping in following arguments, which will ignore).

BENFORD'S LAW: CONT

Fibonacci Numbers are Benford

$$X_n = \frac{1}{\sqrt{5}} \left(\frac{1+\sqrt{5}}{2} \right)^n$$

$$Y_n = \log_{10} X_n \stackrel{\text{mod } 1}{=} \log_{10} \left[\frac{1}{\sqrt{5}} \left(\frac{1+\sqrt{5}}{2} \right)^n \right] \text{ mod } 1$$

$$= n \log_{10} \left(\frac{1+\sqrt{5}}{2} \right) - \frac{1}{2} \log_{10} 5 \text{ mod } 1$$

$\underbrace{\hspace{10em}}$ This is indep of n

\hookrightarrow if this part is equidistributed, so too is this $-\frac{1}{2} \log_{10} 5$.

Just need to show $\log_{10} \frac{1+\sqrt{5}}{2}$ is irrational.

If not: $\log_{10} \frac{1+\sqrt{5}}{2} = p/q$ in lowest terms

$$\frac{1+\sqrt{5}}{2} = 10^{p/q}$$

$$1+\sqrt{5} = 2 \cdot 10^{p/q}$$

$$(1+\sqrt{5})^2 = 2^2 \cdot 10^p = \text{integer}$$

\hookrightarrow expand, get integer + integer $\sqrt{5}$ = integer

\hookrightarrow impossible!

Geometric Growth is Benford! Financial data: say goes up 2% per year... Takes more time to go from \$1 to \$2 than from \$9 to \$10.

BENFORD'S LAW: CONTINUED

Difference Equations

Relation $F_{n+2} = F_{n+1} + F_n$ just one example of a linear difference eq. Can solve with "divine inspiration" (though sometimes need to tweak method if characteristic polynomial has a repeated root). Could use generating functions.

Application: Double Plus 1 in Roulette

Assume no greens, 50% chance red, 50% chance black.

Bet \$1 red: if red up \$1 else down \$1

↳ if lose bet \$2 red: if red up \$1 else down \$3 = \$1 + \$2

↳ if lose bet \$4 red: if red up \$1 else down \$7...

Eventually get red and net \$1: laffer, rinse, repeat, retire!

Okay, something must go wrong!

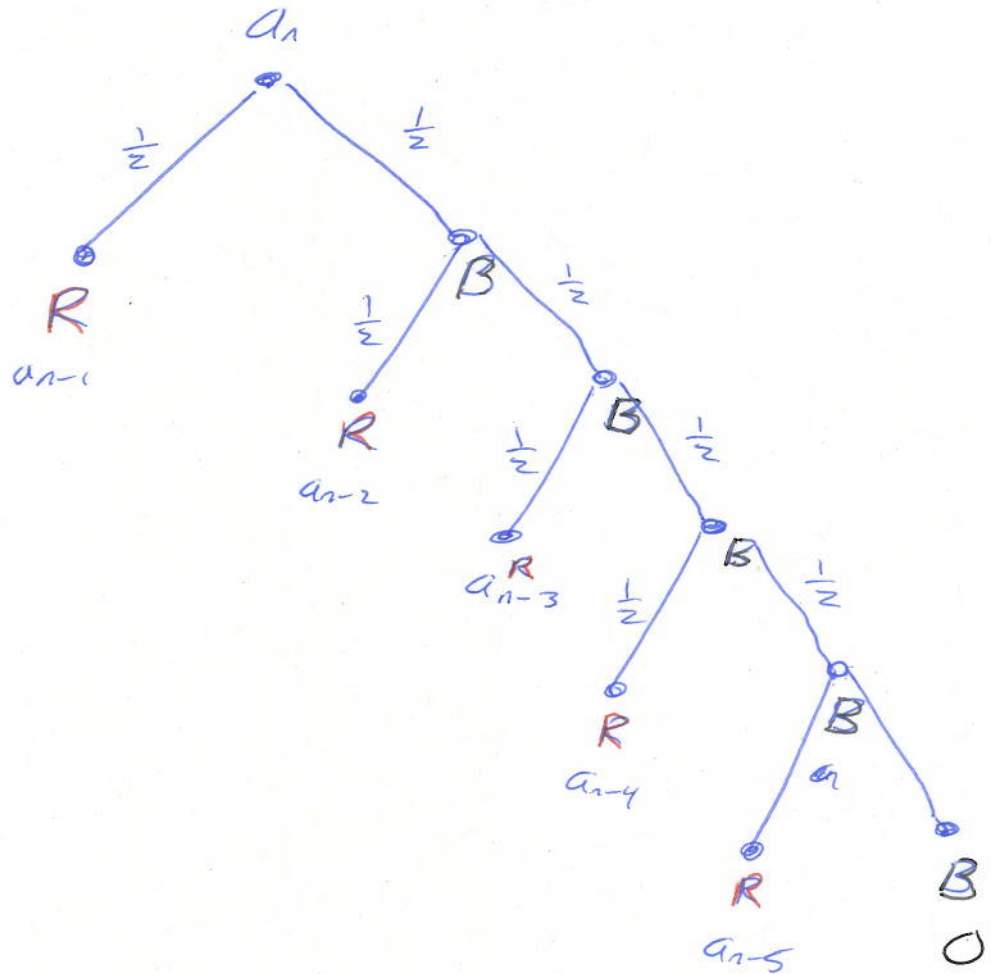
↳ Rich Uncle: always willing to bankroll, ∞ amount of money, but won't give you money

↳ House Limits: cannot keep doubling: hit table max.

BENFORD'S LAW: CONT

DOUBLE PLUS ONE

Let $a_n = \text{prob no 5 consecutive blacks in } n \text{ spins}$
 $b_n = \text{prob get 5 consecutive blacks in } n \text{ spins} = 1 - a_n$



$$a_n = \frac{1}{2} a_{n-1} + \frac{1}{4} a_{n-2} + \frac{1}{8} a_{n-3} + \frac{1}{16} a_{n-4} + \frac{1}{32} a_{n-5}$$

Guess $a_n = r^n$ and get a quintic!

No nice soln, numerically approximate

roots $\approx .983, .098 \pm i.424i, .339 \pm i.229i$

$a_n \approx 1.05 * .983^n + \dots$, $b_n \approx 1 - 1.05 * .983^n + \dots$

$b_{100} \approx 81\%$ $b_{200} \approx 96.5\%$ $b_{300} \approx 99.4\%$

BENFORD: CONT

Can approximate: Split 100 into 2 blocks of 5



Prob has 5 blacks in 5: $\frac{1}{32}$

Prob doesn't have 5 blacks: $1 - \frac{1}{32} = 1 - \frac{1}{2^5}$

Prob none of the 20 blocks has 5 blacks: $(1 - \frac{1}{2^5})^{20}$

Prob don't have 5 consec blacks anywhere $\leq (1 - \frac{1}{2^5})^{20}$

↳ could have 5 cutting across two blocks

Prob have 5 consec blocks somewhere $\geq 1 - (1 - \frac{1}{2^5})^{20}$

↳ using Prob(A happens) + Prob(A doesn't happen) = 1

Get Prob have 5 consec block in 100 is at least 47%

↳ Can get better lower bound by blocks of 6, ...

Can do block of length 10 without too much trouble

BBBBB * * * *	2 ⁵ possible	} all distinct Get 63 ⁹⁶ possible out of $2^{10} = 1024$
RBBBB B * * *	2 ⁴ possible	
* RBBBB BB * *	2 ⁴ possible	
* * RBB BB B *	2 ⁴ possible	
* * * RBBBB B *	2 ⁴ possible	
* * * * RBBBB	2 ⁴ possible	

lower bound is $\geq 1 - (1 - \frac{63}{1024})^{10} \approx 62.6\%$

IMPORTANT SKILL: GETTING SOME KIND OF ESTIMATE