History 00000000

# Benford's Law, Elliptic Divisibility Sequences, and Canonical Heights

Michelle Manes (mmanes@math.hawaii.edu)

Sage Days for Women July, 2013

History ●○○○○○○○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
History			

 (1881) Simon Newcomb publishes "Note on the frequency of use of the different digits in natural numbers." The world ignores it.

History ●○○○○○○○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
History			

- (1881) Simon Newcomb publishes "Note on the frequency of use of the different digits in natural numbers." The world ignores it.
- (1938) Frank Benford (unaware of Newcomb's work, presumably) publishes "The law of anomalous numbers."



Integer Sequences

Elliptic Divisibility Sequences

#### Statement of Benford's Law

Newcomb noticed that the early pages of the book of tables of logarithms were much dirtier than the later pages, so were presumably referenced more often.

Elliptic Divisibility Sequences

#### Statement of Benford's Law

Newcomb noticed that the early pages of the book of tables of logarithms were much dirtier than the later pages, so were presumably referenced more often.

He stated the rule this way:

Prob(first significant digit = d) = log<sub>10</sub>  $\left(1 + \frac{1}{d}\right)$ .

# **Benford's Law**

# Base 10 Predictions

digit	probability it occurs as a leading digit
1	30.1%
2	17.6%
3	12.5%
4	9.7%
5	7.9%
6	6.7%
7	5.8%
8	5.1%
9	4.6%

# Benford's Data

#### TABLE I

Percentage of Times the Natural Numbers 1 to 9 are Used as First Digits in Numbers, as Determined by 20,229 Observations

₽		First Digit						C			
Grou	Title	1	2	3	4	5	6	7	8	9	Count
Α	Rivers, Area	31.0	16.4	10.7	11.3	7.2	8.6	5.5	4.2	5.1	335
в	Population	33.9	20.4	14.2	8.1	7.2	6.2	4.1	3.7	2.2	3259
$\mathbf{C}$	Constants	41.3	14.4	4.8	8.6	10.6	5.8	1.0	2.9	10.6	104
$\mathbf{D}$	Newspapers	30.0	18.0	12.0	10.0	8.0	6.0	6.0	5.0	5.0	100
$\mathbf{E}$	Spec. Heat	24.0	18.4	16.2	14.6	10.6	4.1	3.2	4.8	4.1	1389
$\mathbf{F}$	Pressure	29.6	18.3	12.8	9.8	8.3	6.4	5.7	4.4	4.7	703
G	H.P. Lost	30.0	18.4	11.9	10.8	8.1	7.0	5.1	5.1	3.6	690
н	Mol. Wgt.	26.7	25.2	15.4	10.8	6.7	5.1	4.1	2.8	3.2	1800
I	Drainage	27.1	23.9	13.8	12.6	8.2	5.0	5.0	2.5	1.9	159
J	Atomic Wgt.	47.2	18.7	5.5	4.4	6.6	4.4	3.3	4.4	5.5	91
$\mathbf{K}$	$n^{-1}, \sqrt{n}, \cdots$	25.7	20.3	9.7	6.8	6.6	6.8	7.2	8.0	8.9	5000
$\mathbf{L}$	Design	26.8	14.8	14.3	7.5	8.3	8.4	7.0	7.3	5.6	560
м	Digest	33.4	18.5	12.4	7.5	7.1	6.5	5.5	4.9	4.2	308
Ν	Cost Data	32.4	18.8	10.1	10.1	9.8	5.5	4.7	5.5	3.1	741
0	X-Ray Volts	27.9	17.5	14.4	9.0	8.1	7.4	5.1	5.8	4.8	707
$\mathbf{P}$	Am. League	32.7	17.6	12.6	9.8	7.4	6.4	4.9	5.6	3.0	1458
Q	Black Body	31.0	17.3	14.1	8.7	6.6	7.0	5.2	4.7	5.4	1165
Ŕ	Addresses	28.9	19.2	12.6	8.8	8.5	6.4	5.6	5.0	5.0	342
$\mathbf{s}$	$n^1, n^2 \cdots n!$	25.3	16.0	12.0	10.0	8.5	8.8	6.8	7.1	5.5	900
т	Death Rate	27.0	18.6	15.7	9.4	6.7	6.5	7.2	4.8	4.1	418
Ave	erage	30.6	18.5	12.4	9.4	8.0	6.4	5.1	4.9	4.7	1011
Pro	bable Error	$\pm 0.8$	±0.4	$\pm 0.4$	$\pm 0.3$	$\pm 0.2$	$\pm 0.2$	$\pm 0.2$	$\pm 0.2$	$\pm 0.3$	-

History ○○○○●○○○○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

#### **More Data**



Benford's Law compared with: numbers from the front pages of newspapers, U.S. county populations, and the Dow Jones Industrial Average.

History ○○○○ <b>○</b> ●○○○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
Example			

Suppose the Dow Jones average is about \$1K. If the average goes up at a rate of about 20% a year, it would take five years to get from 1 to 2 as a first digit.

History ○○○○ <b>○</b> ●○○○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
Example			

Suppose the Dow Jones average is about \$1K. If the average goes up at a rate of about 20% a year, it would take five years to get from 1 to 2 as a first digit.

If we start with a first digit 5, it only requires a 20% increase to get from \$5K to \$6K, and that is achieved in one year.



Suppose the Dow Jones average is about \$1K. If the average goes up at a rate of about 20% a year, it would take five years to get from 1 to 2 as a first digit.

If we start with a first digit 5, it only requires a 20% increase to get from \$5K to \$6K, and that is achieved in one year.

When the Dow reaches \$9K, it takes only an 11% increase and just seven months to reach the \$10K mark. This again has first digit 1, so it will take another doubling (and five more years) to get back to first digit 2.

Integer Sequences

Elliptic Divisibility Sequences

#### Benford's Law and Tax Fraud (Nigrini, 1992)



History ○○○○○●○○ Formalism 00000 Integer Sequences

Elliptic Divisibility Sequences

#### Benford's Law and Tax Fraud (Nigrini, 1992)

# Most people can't fake data convincingly.

Integer Sequences

Elliptic Divisibility Sequences

#### Benford's Law and Tax Fraud (Nigrini, 1992)

Most people can't fake data convincingly.

Many states (including California) and the IRS now use fraud-detection software based on Benford's Law.

History ○○○○○○●○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
True Life Tale			

 Manager from Arizona State Treasurer was embezzling funds.

History ○○○○○○●○	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
True Life Tale			

- Manager from Arizona State Treasurer was embezzling funds.
- Most amounts were below \$100K (critical threshold for checks that would require more scrutiny).

True Life Tale

- Manager from Arizona State Treasurer was embezzling funds.
- Most amounts were below \$100K (critical threshold for checks that would require more scrutiny).
- Over 90% of the checks had a first digit 7, 8, or 9. (Trying to get close to the threshold without going over — artificially changes the data and so breaks fit with Benford's law.)

# True Life Tale

Date of Check	Amount
October 9, 1992	\$ 1,927.48
+	27,902.31
October 14, 1992	86,241.90
	72,117.46
	81,321.75
+	97,473.96
October 19, 1992	93,249.11
	89,658.17
	87,776.89
	92,105.83
	79,949.16
	87,602.93 96,879.23
	91,806.47
	84,991.67
	90,831.83
	93,766.67
	88,338.72
	94,639.49
	83,709.28
	96,412.21
	88,432.86
	71,552.16
TOTAL	\$ 1,878,687.58

History oooooooo	Formalism ●○○○○	Integer Sequences	Elliptic Divisibility Sequences

# Benford Base b

# Definition

# A sequence of positive numbers $\{x_n\}$ is *Benford* (*base b*) if

Prob(first significant digit = 
$$d$$
) = log<sub>b</sub>  $\left(1 + \frac{1}{d}\right)$ .

Integer Sequences

Elliptic Divisibility Sequences

# Problems with "Proofs" of Benford's Law

• Discrete density and summability methods.



History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
	00000		

#### Problems with "Proofs" of Benford's Law

• Discrete density and summability methods.  $F_d = \{x \in \mathbb{N} \mid \text{first digit of } x \text{ is } d\}$ . No natural density. That is,

$$\lim_{n\to\infty}\frac{F_d\cap\{1,2,\ldots,n\}}{n}$$

does not exist.

# Problems with "Proofs" of Benford's Law

- Discrete density and summability methods.
- Continuous density and summability methods. (Same problem.)

# Problems with "Proofs" of Benford's Law

- Discrete density and summability methods.
- Continuous density and summability methods. (Same problem.)
- Scale invariance.

If there is a reasonable first-digit law, it should be scale-invariant. That is, it shouldn't matter if the measurements are in feet or meters, pounds or kilograms, etc.



History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

# Definition

For each integer b > 1, define the *mantissa function* 

$$egin{aligned} M_b\colon \mathbb{R}^+ &
ightarrow [1,b)\ x\mapsto r \end{aligned}$$

where *r* is the unique number in [1, *b*) such that  $x = rb^n$  for some  $n \in \mathbb{Z}$ .

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

# Definition

For each integer b > 1, define the mantissa function

$$M_b \colon \mathbb{R}^+ o [1, b)$$
  
 $x \mapsto r$ 

where *r* is the unique number in [1, *b*) such that  $x = rb^n$  for some  $n \in \mathbb{Z}$ .

# **Examples**

• 
$$M_{10}(9) = 9 = M_{100}(9)$$
.

•  $M_2(9) = 9/8 = 1.001$  (base 2).

History oooooooo	Formalism ○○○●○	Integer Sequences	Elliptic Divisibility Sequences

# Definition

For  $E \subset [1, b)$ , let

$$\langle E \rangle_b = M_b^{-1}(E) = \bigcup_{n \in \mathbb{Z}} b^n E \subset \mathbb{R}^+.$$

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

# Definition

For  $E \subset [1, b)$ , let

$$\langle E \rangle_b = M_b^{-1}(E) = \bigcup_{n \in \mathbb{Z}} b^n E \subset \mathbb{R}^+.$$

#### Definition

 $\mathcal{M}_b = \{ \langle E \rangle_b \mid E \subset \mathbb{B}(1, b) \}$  is the  $\sigma$ -algebra on  $\mathbb{R}^+$  generated by  $M_b$ .

History oooooooo	Formalism	Integer Sequences	Elliptic Divisibility Sequences

# Definition

Let  $P_b$  be the probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$  defined by

 $P_b(\langle [\mathbf{1}, \gamma) \rangle_b) = \log_b \gamma.$ 

History oooooooo	Formalism ○○○○●	Integer Sequences	Elliptic Divisibility Sequences

# Definition

Let  $P_b$  be the probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$  defined by

 $P_b(\langle [\mathbf{1}, \gamma) \rangle_b) = \log_b \gamma.$ 

This probability measure:

History oooooooo	Formalism	Integer Sequences	Elliptic Divisibility Sequences

# Definition

Let  $P_b$  be the probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$  defined by

 $P_b(\langle [1,\gamma)\rangle_b) = \log_b \gamma.$ 

This probability measure:

• Agrees with Benford's law.

History oooooooo	Formalism	Integer Sequences	Elliptic Divisibility Sequences

# Definition

Let  $P_b$  be the probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$  defined by

 $P_b(\langle [1,\gamma)\rangle_b) = \log_b \gamma.$ 

This probability measure:

- Agrees with Benford's law.
- Is the unique scale-invariant probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$ .

History oooooooo	Formalism	Integer Sequences	Elliptic Divisibility Sequences

# Definition

Let  $P_b$  be the probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$  defined by

 $P_b(\langle [1,\gamma)\rangle_b) = \log_b \gamma.$ 

This probability measure:

- Agrees with Benford's law.
- Is the unique scale-invariant probability measure on  $(\mathbb{R}^+, \mathcal{M}_b)$ .

Proof comes down to uniqueness of Haar measure.

#### What types of sequences are Benford?

Real-world data can be a good fit or not, depending on the type of data. Data that is a good fit is "suitably random" — comes in many different scales, and is a large and randomly distributed data set, with no artificial or external limitations on the range of the numbers.

Elliptic Divisibility Sequences

#### What types of sequences are Benford?

Real-world data can be a good fit or not, depending on the type of data. Data that is a good fit is "suitably random" — comes in many different scales, and is a large and randomly distributed data set, with no artificial or external limitations on the range of the numbers.

Some numerical sequences are clearly *not* Benford distributed base-10:

Elliptic Divisibility Sequences

#### What types of sequences are Benford?

Real-world data can be a good fit or not, depending on the type of data. Data that is a good fit is "suitably random" — comes in many different scales, and is a large and randomly distributed data set, with no artificial or external limitations on the range of the numbers.

Some numerical sequences are clearly *not* Benford distributed base-10:

• 1, 2, 3, 4, 5, 6, 7, ... (uniform distribution)

## What types of sequences are Benford?

Real-world data can be a good fit or not, depending on the type of data. Data that is a good fit is "suitably random" — comes in many different scales, and is a large and randomly distributed data set, with no artificial or external limitations on the range of the numbers.

Some numerical sequences are clearly *not* Benford distributed base-10:

- 1, 2, 3, 4, 5, 6, 7, ... (uniform distribution)
- 1, 10, 100, 1000, ... (first digit is always 1)
Elliptic Divisibility Sequences

#### Some numerical sequences seem to be a good fit



History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		0000000	

#### Some numerical sequences seem to be a good fit



story	Formalism	Integer Sequences	Elliptic Divisibility Sequences
0000000		000000	

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		0000000	

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

## **Proof:**

• 
$$x = M_b(x) \cdot b^k$$
 for some  $k \in \mathbb{Z}$ .

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
0000000		0000000	

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

## Proof:

• 
$$x = M_b(x) \cdot b^k$$
 for some  $k \in \mathbb{Z}$ .

• First digit of x in base b is d iff  $d \le M_b(x) < d + 1$ .

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

# Proof:

• 
$$x = M_b(x) \cdot b^k$$
 for some  $k \in \mathbb{Z}$ .

• First digit of x in base b is d iff  $d \le M_b(x) < d + 1$ .

• 
$$\log_b d \le y < \log_b(d+1)$$
, where  $y = \log_b(M_b(x)) = \log_b x \mod 1$ .

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

# Proof:

• 
$$x = M_b(x) \cdot b^k$$
 for some  $k \in \mathbb{Z}$ .

• First digit of x in base b is d iff  $d \le M_b(x) < d + 1$ .

• 
$$\log_b d \le y < \log_b(d+1)$$
, where  $y = \log_b(M_b(x)) = \log_b x \mod 1$ .

• If the distribution is uniform (mod 1), then the probability *y* is in this range is

$$\log_b(d+1) - \log_b(d) = \log_b\left(\frac{d+1}{d}\right) = \log_b\left(1 + \frac{1}{d}\right).$$

History 000000000 Formalism 00000 Integer Sequences

Elliptic Divisibility Sequences

## Logarithms and Benford's Law

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		0000000	

## **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .



History 000000000 Formalism

Integer Sequences

Elliptic Divisibility Sequences

## Logarithms and Benford's Law

# **Fundamental Equivalence**

Data set  $\{x_i\}$  is Benford base *b* iff  $\{y_i\}$  is equidistributed mod 1, where  $y_i = \log_b x_i$ .

# **Kronecker-Weyl Theorem**

If  $\beta \notin \mathbb{Q}$  then  $n\beta \mod 1$  (resp.  $n^2\beta \mod 1$ ) is equidistributed.

Thus if  $\log_b \alpha \notin \mathbb{Q}$ , then  $\alpha^n$  (resp.  $\alpha^{n^2}$ ) is Benford.

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Seque
Powers of 2			

# Theorem

# The sequence $\{2^n\}$ for $n \ge 0$ is Benford base b for any b that is not a rational power of 2.

History

## Powers of 2

# Theorem

The sequence  $\{2^n\}$  for  $n \ge 0$  is Benford base b for any b that is not a rational power of 2.

# Proof:

- Consider the sequence of logarithms  $\{n(\log_b 2)\}$ .
- By the Kronecker-Weyl Theorem, this is uniform (mod 1) as long as log<sub>b</sub> 2 ∉ Q.
- If b is not a rational power of 2, then the sequence of logarithms is uniformly distributed (mod 1), so the original sequence is Benford base b.

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

## Theorem

# The sequence $\{F_n\}$ of Fibonacci numbers Benford base b for almost every b.

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
00000000	00000	○○○○●○○	

## Theorem

The sequence  $\{F_n\}$  of Fibonacci numbers Benford base b for almost every b.

# **Heuristic Argument:**

• Closed form for Fibonacci numbers:

$$F_n = \frac{1}{\sqrt{5}} \left[ \left( \frac{1+\sqrt{5}}{2} \right)^n - \left( \frac{1-\sqrt{5}}{2} \right)^n \right]$$

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
oooooooo	00000	○○○○○●○○	

## Theorem

The sequence  $\{F_n\}$  of Fibonacci numbers Benford base b for almost every b.

# **Heuristic Argument:**

• Closed form for Fibonacci numbers:

$$F_n = \frac{1}{\sqrt{5}} \left[ \left( \frac{1+\sqrt{5}}{2} \right)^n - \left( \frac{1-\sqrt{5}}{2} \right)^n \right]$$

•  $\left| \left( \frac{1-\sqrt{5}}{2} \right) \right| < 1$ , so the leading digits are completely determined by  $\frac{1}{\sqrt{5}} \left( \frac{1+\sqrt{5}}{2} \right)^n$ .

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

# Theorem

The sequence  $\{F_n\}$  of Fibonacci numbers Benford base b for almost every b.

# **Heuristic Argument:**

• Closed form for Fibonacci numbers:

$$F_n = \frac{1}{\sqrt{5}} \left[ \left( \frac{1+\sqrt{5}}{2} \right)^n - \left( \frac{1-\sqrt{5}}{2} \right)^n \right]$$

|(1-√5/2)| < 1, so the leading digits are completely determined by 1/√5 (1+√5/2)<sup>n</sup>.
This sequence will be Benford base-*b* for any *b* where log<sub>b</sub> (1+√5/2) ∉ Q.

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		0000000	

Consider the sequence  $\{a_n\}$  given by some initial conditions  $a_0, a_1, \ldots, a_{k-1}$  and then a recurrence relation

$$a_{n+k}=c_1a_{n+k-1}+c_2a_{n+k-2}+\cdots+c_ka_n,$$

with  $c_1, c_2, \ldots, c_k$  fixed real numbers.

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		00000000	

Consider the sequence  $\{a_n\}$  given by some initial conditions  $a_0, a_1, \ldots, a_{k-1}$  and then a recurrence relation

$$a_{n+k}=c_1a_{n+k-1}+c_2a_{n+k-2}+\cdots+c_ka_n,$$

with  $c_1, c_2, \ldots, c_k$  fixed real numbers.

Find the eigenvalues of the recurrence relation and order them so that  $|\lambda_1| \ge |\lambda_2| \ge \cdots \ge |\lambda_k|$ .

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		00000000	

Consider the sequence  $\{a_n\}$  given by some initial conditions  $a_0, a_1, \ldots, a_{k-1}$  and then a recurrence relation

$$a_{n+k}=c_1a_{n+k-1}+c_2a_{n+k-2}+\cdots+c_ka_n,$$

with  $c_1, c_2, \ldots, c_k$  fixed real numbers.

Find the eigenvalues of the recurrence relation and order them so that  $|\lambda_1| \ge |\lambda_2| \ge \cdots \ge |\lambda_k|$ .

There exist number  $u_1, u_2, ..., u_k$  (which depend on the initial conditions) so that  $a_n = u_1 \lambda_1^n + u_2 \lambda_2^n + \cdots + u_k \lambda_k^n$ .

Elliptic Divisibility Sequences

## **Linear Recurrence Sequences**

# Theorem

With a linear recurrence sequence as described, if  $\log_b |\lambda_1| \notin \mathbb{Q}$  and the initial conditions are such that  $u_1 \neq 0$ , then the sequence  $\{a_n\}$  is Benford base b.

story	Formalism	Integer Sequences	Elliptic Divisibility Sequences
		0000000	

## Theorem

With a linear recurrence sequence as described, if  $\log_b |\lambda_1| \notin \mathbb{Q}$  and the initial conditions are such that  $u_1 \neq 0$ , then the sequence  $\{a_n\}$  is Benford base b.

# Sketch of Proof:

• Rewrite the closed form as  $a_n = u_1 \lambda_1^n \left( 1 + O\left(\frac{ku\lambda_2^n}{\lambda_1^n}\right) \right)$ where  $u = \max_i |u_i| + 1$ .

# Theorem

With a linear recurrence sequence as described, if  $\log_b |\lambda_1| \notin \mathbb{Q}$  and the initial conditions are such that  $u_1 \neq 0$ , then the sequence  $\{a_n\}$  is Benford base b.

# Sketch of Proof:

- Rewrite the closed form as  $a_n = u_1 \lambda_1^n \left( 1 + O\left( \frac{k u \lambda_2^n}{\lambda_1^n} \right) \right)$ where  $u = \max_i |u_i| + 1$ .
- Some clever algebra using our assumptions to rewrite this as  $a_n = u_1 \lambda_1^n (1 + \mathcal{O}(\beta^n))$ .

# Theorem

With a linear recurrence sequence as described, if  $\log_b |\lambda_1| \notin \mathbb{Q}$  and the initial conditions are such that  $u_1 \neq 0$ , then the sequence  $\{a_n\}$  is Benford base b.

# Sketch of Proof:

- Rewrite the closed form as  $a_n = u_1 \lambda_1^n \left( 1 + O\left( \frac{k u \lambda_2^n}{\lambda_1^n} \right) \right)$ where  $u = \max_i |u_i| + 1$ .
- Some clever algebra using our assumptions to rewrite this as  $a_n = u_1 \lambda_1^n (1 + \mathcal{O}(\beta^n))$ .
- Then  $y_n = \log_b(a_n) = n \log_b \lambda_1 + \log_b u_1 + \mathcal{O}(\beta^n)$ .

# Theorem

With a linear recurrence sequence as described, if  $\log_b |\lambda_1| \notin \mathbb{Q}$  and the initial conditions are such that  $u_1 \neq 0$ , then the sequence  $\{a_n\}$  is Benford base b.

# Sketch of Proof:

- Rewrite the closed form as  $a_n = u_1 \lambda_1^n \left( 1 + O\left( \frac{k u \lambda_2^n}{\lambda_1^n} \right) \right)$ where  $u = \max_i |u_i| + 1$ .
- Some clever algebra using our assumptions to rewrite this as  $a_n = u_1 \lambda_1^n (1 + \mathcal{O}(\beta^n))$ .
- Then  $y_n = \log_b(a_n) = n \log_b \lambda_1 + \log_b u_1 + \mathcal{O}(\beta^n)$ .
- Show in the limit the error term affects a vanishingly small portion of the distribution.

# **Elliptic Divisibility Sequences**

# Definition

An *integral divisibility sequence* is a sequence of integers  $\{u_n\}$  satisfying

 $u_n \mid u_m$  whenever  $n \mid m$ .

An *elliptic divisibility sequence* is an integral divisibility sequence which satisfies the following recurrence relation for all  $m \ge n \ge 1$ :

$$u_{m+n}u_{m-n}u_{1}^{2} = u_{m+1}u_{m-1}u_{n}^{2} - u_{n+1}u_{n-1}u_{m}^{2}. \qquad (*)$$

istory	Formalism	Integer Sequences	Elliptic Divisibility Sequences
0000000			0000000000

## **Boring Elliptic Divisibility Sequences**

# • The sequences of integers, where $u_n = n$ .

story	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			0000000000

## **Boring Elliptic Divisibility Sequences**

- The sequences of integers, where  $u_n = n$ .
- The sequence  $0, 1, -1, 0, 1, -1, \ldots$

## **Boring Elliptic Divisibility Sequences**

- The sequences of integers, where  $u_n = n$ .
- The sequence 0, 1, -1, 0, 1, -1, ....
- The sequence
   1, 3, 8, 21, 55, 144, 377, 987, 2584, 6765, ... (this is every-other Fibonacci number).

Elliptic Divisibility Sequences

## Not-So-Boring Elliptic Divisibility Sequences

# • The sequences which begins 0, 1, 1, -1, 1, 2, -1, -3, -5, 7, -4, -28, 29, 59, 129, -314, -65, 1529, -3689, -8209, -16264, 833313, 113689, -620297, 2382785, 7869898, 7001471, -126742987, -398035821, 168705471, ... (This is sequence A006769 in the *On-Line Encyclopedia of Integer Sequences.*)

Elliptic Divisibility Sequences

## Not-So-Boring Elliptic Divisibility Sequences

- The sequences which begins 0, 1, 1, -1, 1, 2, -1, -3, -5, 7, -4, -28, 29, 59, 129, -314, -65, 1529, -3689, -8209, -16264, 833313, 113689, -620297, 2382785, 7869898, 7001471, -126742987, -398035821, 168705471, ... (This is sequence A006769 in the *On-Line Encyclopedia of Integer Sequences*.)
- The sequence which begins
  - 1, 1, -3, 11, 38, 249, -2357, 8767, 496036, -3769372,
  - $-299154043, -12064147359, \ldots$

History 00000000	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

lf

$$u_{m+n}u_{m-n}u_1^2 = u_{m+1}u_{m-1}u_n^2 - u_{n+1}u_{n-1}u_m^2.$$
 (\*)  
If  $u_1 = 1$ ,  $u_2, u_3 \in \mathbb{Z} \setminus \{0\}$  and  $u_4/u_2 \in \mathbb{Z} \setminus \{0\}$ , then  
 $u_n \in \mathbb{Z}$  for all *n*. Why?

History 00000000	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

$$U_{m+n}U_{m-n}U_1^2 = U_{m+1}U_{m-1}U_n^2 - U_{n+1}U_{n-1}U_m^2. \qquad (*)$$

If  $u_1 = 1$ ,  $u_2, u_3 \in \mathbb{Z} \setminus \{0\}$  and  $u_4/u_2 \in \mathbb{Z} \setminus \{0\}$ , then  $u_n \in \mathbb{Z}$  for all n. Why?

Induction.

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

$$u_{m+n}u_{m-n}u_1^2 = u_{m+1}u_{m-1}u_n^2 - u_{n+1}u_{n-1}u_m^2. \qquad (*)$$

- Induction.
- |u<sub>n</sub>| counts perfect matchings on certain graphs (Bousquet-Mélu–West, Speyer, others)

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

$$u_{m+n}u_{m-n}u_{1}^{2} = u_{m+1}u_{m-1}u_{n}^{2} - u_{n+1}u_{n-1}u_{m}^{2}. \qquad (*)$$

- Induction.
- |u<sub>n</sub>| counts perfect matchings on certain graphs (Bousquet-Mélu–West, Speyer, others)
- Laurentness of u<sub>n</sub> in terms of u<sub>1</sub>, u<sub>2</sub>, u<sub>3</sub>, u<sub>4</sub> (Fomin–Zelevinsky: cluster algebras)

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

$$u_{m+n}u_{m-n}u_{1}^{2} = u_{m+1}u_{m-1}u_{n}^{2} - u_{n+1}u_{n-1}u_{m}^{2}. \qquad (*)$$

- Induction.
- |u<sub>n</sub>| counts perfect matchings on certain graphs (Bousquet-Mélu–West, Speyer, others)
- Laurentness of u<sub>n</sub> in terms of u<sub>1</sub>, u<sub>2</sub>, u<sub>3</sub>, u<sub>4</sub> (Fomin–Zelevinsky: cluster algebras)
- $u_n$  is the denominator of a point on an elliptic curve.

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

$$u_{m+n}u_{m-n}u_{1}^{2} = u_{m+1}u_{m-1}u_{n}^{2} - u_{n+1}u_{n-1}u_{m}^{2}. \qquad (*)$$

- Induction.
- |u<sub>n</sub>| counts perfect matchings on certain graphs (Bousquet-Mélu–West, Speyer, others)
- Laurentness of u<sub>n</sub> in terms of u<sub>1</sub>, u<sub>2</sub>, u<sub>3</sub>, u<sub>4</sub> (Fomin–Zelevinsky: cluster algebras)
- $u_n$  is the denominator of a point on an elliptic curve.
| History | Formalism | Integer Sequences | Elliptic Divisibility Sequences |
|---------|-----------|-------------------|---------------------------------|
|         |           |                   | 0000000000                      |

**Example:** 
$$y^2 + y = x^3 + x^2 - 2x$$

$$u_1 = 1$$
  
 $u_2 = 1$   
 $u_3 = -3$   
 $u_4 = 11$   
 $u_5 = 38$   
 $u_6 = 249$ 

$$u_7 = -2357$$

History 00000000	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
Example: y <sup>2</sup>	v v <u>3 v</u> 2 o		

**Example:** 
$$y^2 + y = x^3 + x^2 - 2x$$

$$u_1 = 1$$
  $P = (0, 0)$   
 $u_2 = 1$   
 $u_3 = -3$   
 $u_4 = 11$   
 $u_5 = 38$   
 $u_6 = 249$ 

$$u_7 = -2357$$

History 00000000	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

# **Example:** $y^2 + y = x^3 + x^2 - 2x$

$$u_{1} = 1 \qquad P = (0,0)$$

$$u_{2} = 1 \qquad [2]P = (3,5)$$

$$u_{3} = -3 \qquad [3]P = \left(-\frac{11}{9},\frac{28}{27}\right)$$

$$u_{4} = 11 \qquad [4]P = \left(\frac{114}{121},-\frac{267}{1331}\right)$$

$$u_{5} = 38 \qquad [5]P = \left(-\frac{2739}{1444},-\frac{77033}{54872}\right)$$

$$u_{6} = 249 \qquad [6]P = \left(\frac{89566}{62001},-\frac{31944320}{15438249}\right)$$

$$u_{7} = -2357 \qquad [7]P = \left(-\frac{2182983}{5555449},-\frac{20464084173}{13094193293}\right)$$

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			0000000000

# **Example:** $y^2 + y = x^3 + x^2 - 2x$

$$u_{1} = 1 \qquad P = (0,0)$$

$$u_{2} = 1 \qquad [2]P = (3,5)$$

$$u_{3} = -3 \qquad [3]P = \left(-\frac{11}{9},\frac{28}{27}\right)$$

$$u_{4} = 11 \qquad [4]P = \left(\frac{114}{121},-\frac{267}{1331}\right)$$

$$u_{5} = 38 \qquad [5]P = \left(-\frac{2739}{1444},-\frac{77033}{54872}\right)$$

$$u_{6} = 249 \qquad [6]P = \left(\frac{89566}{62001},-\frac{31944320}{15438249}\right)$$

$$u_{7} = -2357 \qquad [7]P = \left(-\frac{2182983}{5555449},-\frac{20464084173}{13094193293}\right)$$

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			00000000000

# **Example:** $y^2 + y = x^3 + x^2 - 2x$

$$\begin{array}{ll} u_{1} = 1 & P = (0,0) \\ u_{2} = 1 & [2]P = (3,5) \\ u_{3} = -3 & [3]P = \left(-\frac{11}{3^{2}},\frac{28}{3^{3}}\right) \\ u_{4} = 11 & [4]P = \left(\frac{114}{11^{2}},-\frac{267}{11^{3}}\right) \\ u_{5} = 38 & [5]P = \left(-\frac{2739}{38^{2}},-\frac{77033}{38^{3}}\right) \\ u_{6} = 249 & [6]P = \left(\frac{89566}{249^{2}},-\frac{31944320}{249^{3}}\right) \\ u_{7} = -2357 & [7]P = \left(-\frac{2182983}{2357^{2}},-\frac{20464084173}{2357^{3}}\right) \end{array}$$

00000000 00000 00000 000000 0000000 0000	

### **Division Polynomials**

One defines elliptic functions  $\Psi_n$  on  $E: y^2 = x^3 + Ax + B$ with

 $\begin{cases} zeroes at the$ *n*-torsion points of*E*poles supported on**O** $\end{cases}$ 

Then for

$$P = (x, y) \in E,$$
  $[n]P = \left(\frac{\phi_n(P)}{\Psi_n(P)^2}, \frac{\omega_n(P)}{\Psi_n(P)^3}\right)$ 

If P is an integral point,

$$\begin{split} \Psi_1 &= 1, \qquad \Psi_2 = 2y, \qquad \Psi_3 = 3x^4 + 6Ax^2 + 12Bx - A^2, \\ \Psi_4 &= 4y(x^6 + 5Ax^4 + 20Bx^3 - 5A^2x^2 - 4ABx - 8B^2 - A^3), \ldots \end{split}$$

00000000 00000 00000 000000 0000000 0000	

### **Division Polynomials**

One defines elliptic functions  $\Psi_n$  on  $E: y^2 = x^3 + Ax + B$ with

 $\begin{cases} zeroes at the$ *n*-torsion points of*E*poles supported on**O** $\end{cases}$ 

Then for

$$P = (x, y) \in E,$$
  $[n]P = \left(\frac{\phi_n(P)}{\Psi_n(P)^2}, \frac{\omega_n(P)}{\Psi_n(P)^3}\right)$ 

If P is an integral point,

$$\begin{split} \Psi_1 &= 1, \qquad \Psi_2 = 2y, \qquad \Psi_3 = 3x^4 + 6Ax^2 + 12Bx - A^2, \\ \Psi_4 &= 4y(x^6 + 5Ax^4 + 20Bx^3 - 5A^2x^2 - 4ABx - 8B^2 - A^3), \ldots \end{split}$$

 $\Psi_n$  satisfy (\*).

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

### **Division Polynomials**

### Note:

- gcd  $(\phi_n(P), \Psi_n(P))) = 1$  in  $\mathbb{Z}[A, B, x, y]$ .
- gcd (φ<sub>n</sub>(P), Ψ<sub>n</sub>(P)) is supported on p | Δ<sub>E</sub> for P ∈ E(Q).
- So  $\Psi_n(P)$  is almost the denominator of [n]P.

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			000000000000

#### **Fundamental Correspondence**

## Theorem (Ward, 1948)

If  $u_n : \mathbb{Z} \to \mathbb{Q}$  satisfies (\*), and if  $u_1 = 1$ , then for some

 $E: y^2 = x^3 + Ax + B,$   $A, B \in \mathbb{Q}$   $P \in E(\mathbb{Q}),$ 

we have

$$u_n = \Psi_n(E, P).$$

History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			000000000000

#### **Fundamental Correspondence**

# Theorem (Ward, 1948)

If  $u_n : \mathbb{Z} \to \mathbb{Q}$  satisfies (\*), and if  $u_1 = 1$ , then for some

 $E: y^2 = x^3 + Ax + B, \qquad A, B \in \mathbb{Q} \qquad P \in E(\mathbb{Q}),$ 

we have

$$u_n = \Psi_n(E, P).$$

## Ward's Correspondence:

$$\begin{cases} \text{curve-point pairs } (E, P) \\ E : y^2 = x^3 + Ax + B, \\ A, B \in \mathbb{Q}, \quad P \in E(\mathbb{Q}) \\ P \notin E[2] \cup E[3] \end{cases} \longleftrightarrow \begin{cases} \text{elliptic divisibility} \\ \text{sequences} \\ u_n : \mathbb{Z} \to \mathbb{Q} \\ u_1 = 1, \quad u_2 u_3 \neq 0 \end{cases}$$

History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences

#### **Growth Rate**

3.3

1, 3, πí, 38 249 2357 8767 496035 3769372 299154043 12064147359 632926474117 65604679199921. 6662062874355342 720710377683595651 285131375126739646739 5206174703484724719135 36042157766246923788837209 14146372186375322613610002376. 13926071420933252466435774939177 18907140173988982482283529896228001, 23563346097423565704093874703154629107 52613843196106605131800510111110767937939 191042474643841254375755272420136901439312318. 201143562868610416717760281868105570520101027137 5095821991254990552236265353900129949461036582268645 16196160423545762519618471188475392072306453021094652577 390721759789017211388827166946590849427517620851066278956107 5986280055034962587902117411856626799800260564768380372311618644, 108902005168517871203290899980149905032338645609229377887214046958803, 4010596455533972232983940617927541889290613203449641429607220125859983231. 152506207465652277762531462142393791012856442441235840714430103762819736595413 . 5286491728223134626400431117234262142530209508718504849234889569684083125892420201, 835397059891704991632636814121353141297683871830623235928141040342038068512341019315446 10861789122218115292139551508417628820932571356531654998704845795890033629344542872385904645 13351876087649817486050732736119541016235802111163925747732171131926421411306436158323451057508131. 2042977307842020707295863142858393936350596442010700266977612272386600979584155605002856821221263113151. 666758509738582427580962194986025574476589178060749335314959464037321543378395210027048006648288905711378993 333167086588478561672098259752122036440335441580932677237086129099851559108618156882215307126455938552908231344016. 150866730291138374331025045659005244449458695650548930543174261374298387455590141700233602162964721944201442274446853073. 113760065777234882865006940654654895718896520042025048306493515052149363166271410666963494813413836495437803419621982027412929 1592531699673073213756775551363145894345299371770076359531071172026756582128668133207380379874720393868883798439657624623140677934307 44416310167318880256461428190965193979854149844320579714027500283754273952989380044808517851663079825097686172334231751637837837673262107....



History oooooooo	Formalism 00000	Integer Sequences	Elliptic Divisibility Sequences
Heuristic Argu	ument		

• It's well-known that elliptic divisibility sequences satisfy a growth condition like  $u_n \approx c^{n^2}$  where the constant *c* depends on the arithmetic height of the point *P* and on the curve *E*.



- It's well-known that elliptic divisibility sequences satisfy a growth condition like  $u_n \approx c^{n^2}$  where the constant *c* depends on the arithmetic height of the point *P* and on the curve *E*.
- Weyl's theorem tells us that {n<sup>2</sup>α} is uniform distributed (mod 1) iff α ∉ Q.



- It's well-known that elliptic divisibility sequences satisfy a growth condition like  $u_n \approx c^{n^2}$  where the constant *c* depends on the arithmetic height of the point *P* and on the curve *E*.
- Weyl's theorem tells us that {n<sup>2</sup>α} is uniform distributed (mod 1) iff α ∉ Q.
- So we should at least be able to conclude that a given EDS is Benford base *b* for almost every *b*.



- It's well-known that elliptic divisibility sequences satisfy a growth condition like  $u_n \approx c^{n^2}$  where the constant *c* depends on the arithmetic height of the point *P* and on the curve *E*.
- Weyl's theorem tells us that {n<sup>2</sup>α} is uniform distributed (mod 1) iff α ∉ Q.
- So we should at least be able to conclude that a given EDS is Benford base *b* for almost every *b*.
- But: The argument with the big-O error terms is delicate, and we need to work out some details.

Elliptic Divisibility Sequences

#### **Elliptic Divisibility Sequences are Benford?**



History	Formalism	Integer Sequences	Elliptic Divisibility Sequences
			00000000000

# Elliptic Divisibility Sequences are Benford?



Integer Sequences

Elliptic Divisibility Sequences

### **Elliptic Divisibility Sequences are Benford?**



