

Sandpiles in a Fractal Labyrinth

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The abelian sandpile model [Bak–Tang–Wiesenfeld '87, Dhar, Majumdar, ...]

Place sand grains (“chips”) on vertices of a graph (say, on the square lattice).

If # of chips at vertex $x \geq$ the degree of x , emit one chip to each neighbor of x . This is called a **toppling** at x .

Continue till the # of chips < degree on every vertex. Then we say the configuration is **stable**.

0	0	0
0	4	0
0	0	0

→

0	1	0
1	0	1
0	1	0

0	0	0	0
0	4	5	0
0	0	0	0

→

0	1	0	0
1	0	6	0
0	1	0	0

→

0	1	1	0
1	1	2	1
0	1	1	0

0	0	0	0
0	4	5	0
0	0	0	0

→

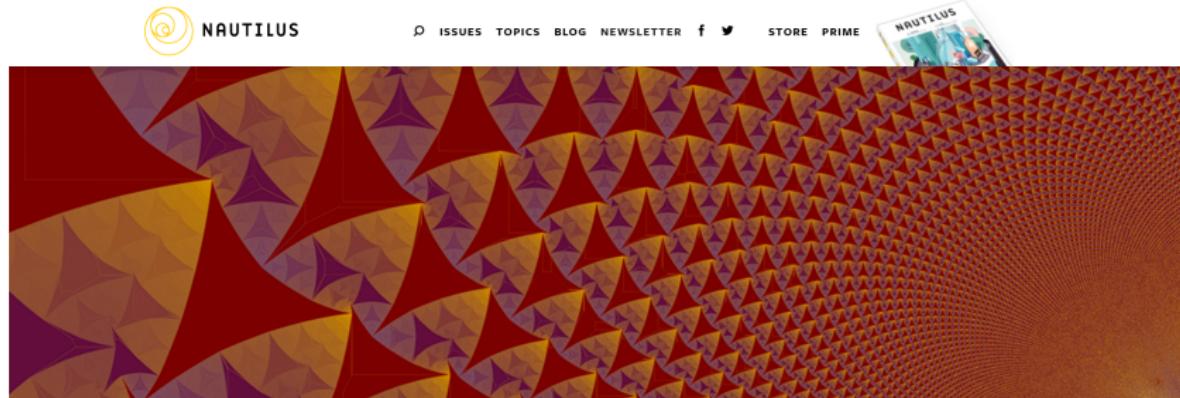
0	0	1	0
0	5	1	1
0	0	1	0

→

0	1	1	0
1	1	2	1
0	1	1	0

Why **abelian**? Because the final stable configuration does not depend on the order of topplings.

Some excellent references on sandpiles



NUMBERS | MATH

The Amazing, Autotuning Sandpile

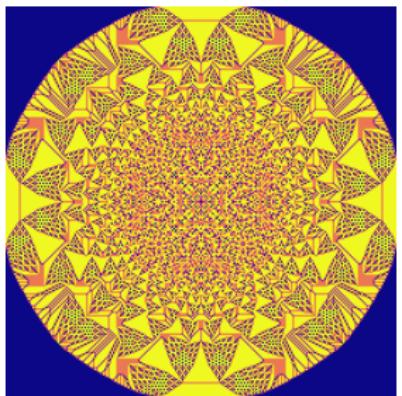
A simple mathematical model of a sandpile shows remarkably complex behavior.

BY JORDAN ELLENBERG
APRIL 2, 2015

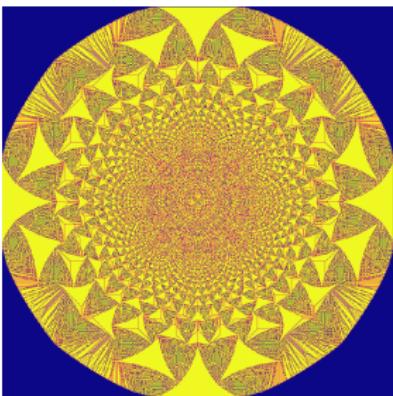
<http://nautil.us/issue/23/dominoes/the-amazing-autotuning-sandpile>

- Lionel Levine has many surveys and pictures: <http://pi.math.cornell.edu/~levine>.
- Wesley Pegden's pictures: <http://www.math.cmu.edu/~wes/sand.html>

Sandpile cluster on \mathbb{Z}^2 : Fractals in a sandpile



10^5 chips

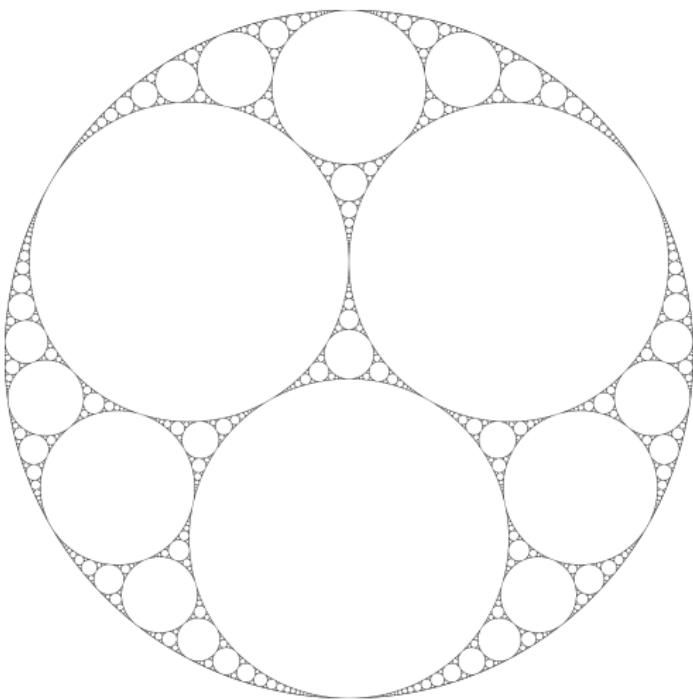


10^6 chips



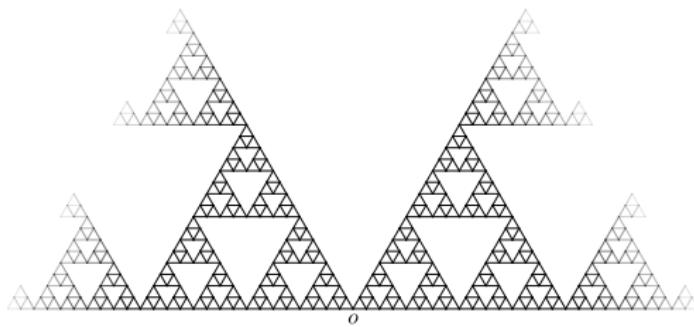
- Scaling limit of the patterns exists. [Pegden–Smart '11]
- Apollonian gaskets in the pattern. [Numerically observed since 90s, proved by Levine–Pegden–Smart '12, '14. Latter is published in *Ann. Math.* '17]
- Limiting cluster shape appears to be polygonal as opposed to an Euclidean ball, unlike other “internal” aggregation models on \mathbb{Z}^d .
*For an overview, see Levine–Peres, “Laplacian growth, sandpiles, and scaling limits.” *Bull. Amer. Math. Soc.* (2017).*

Apollonian gasket



By Time3000 [GFDL or CC BY-SA 4.0-3.0-2.5-2.0-1.0], from Wikimedia Commons
https://commons.wikimedia.org/wiki/File:Apollonian_gasket.svg

Sierpinski gasket (SG)



Problem: Study the sandpile model on SG!

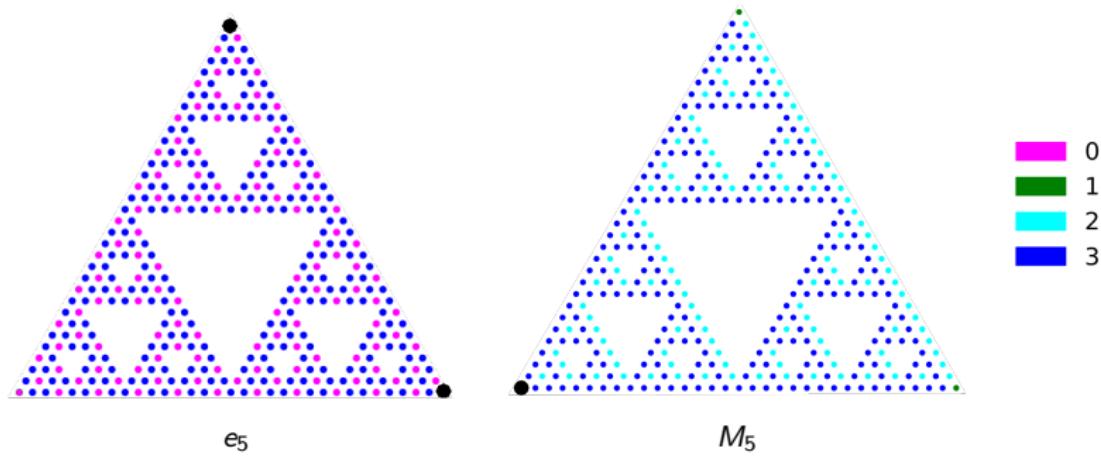
Random addition of chips & toppling (not described here)

- 90s: Daerden–Priezzhev–Vanderzande: Simulations and some exact results about the sandpile Markov chain on SG.
- 2012: Matter computed sandpile height distributions on the SG “cell graph” (or Hanoi-tower graph). [Matter PhD Thesis 2012, U. Geneve]

Deterministic single-source sandpile: Drop m chips at o and topple.

- 2013 & 14 Cornell math REU: Numerical study of sandpile patterns and growth. Made several key conjectures. [Fairchild–Haim–Setra–Strichartz–Westura '16, arXiv:1602.03424]
- March–May 2017: Jonah Kudler-Flam (Colgate '17, now UChicago PhD candidate) obtained extensive numerical results and proved a spherical shape theorem. **AutomataSG**

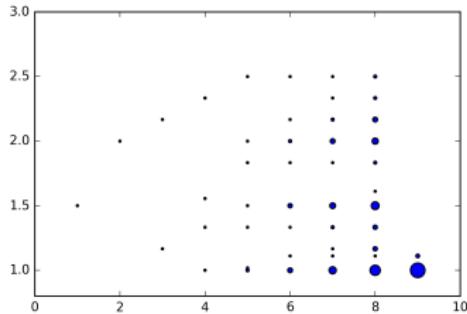
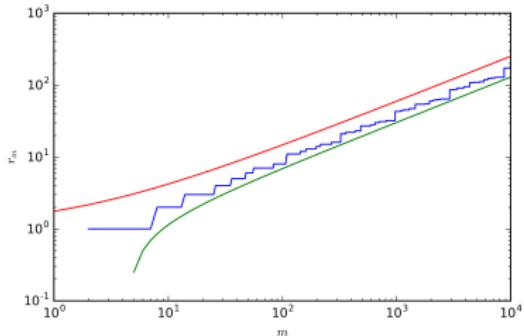
Smoking Gun #1: Self-similar sandpile configurations



- The first configuration (e_n) was shown numerically (and conjectured) to be the **identity element of the sandpile group** (a finite abelian group) for the level- n SG (with 2 sinks) by [Fairchild–Haim–Setra–Strichartz–Westura '16]
- The second configuration (M_n) turns out to be the identity element of the sandpile group for the level- n SG (with 1 sink).

Smoking Gun #2: Patterns in sandpile growth

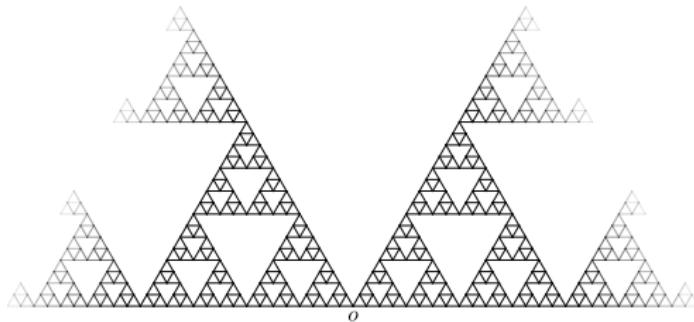
Jonah's experimental data, May '17



Radial jump data (right figure)

- Read from left to right, from bottom to top. Each dot represents a radial jump. The bigger the dot, the larger the radial increment.
- What do the scales mean?
- Jumps appear periodically. (But why no jumps between 2.5 and 3.0?)
- Picture is INCOMPLETE (limited by computing power).

Sandpile growth on SG



Deterministic single-source sandpile: Drop m chips at o and topple.

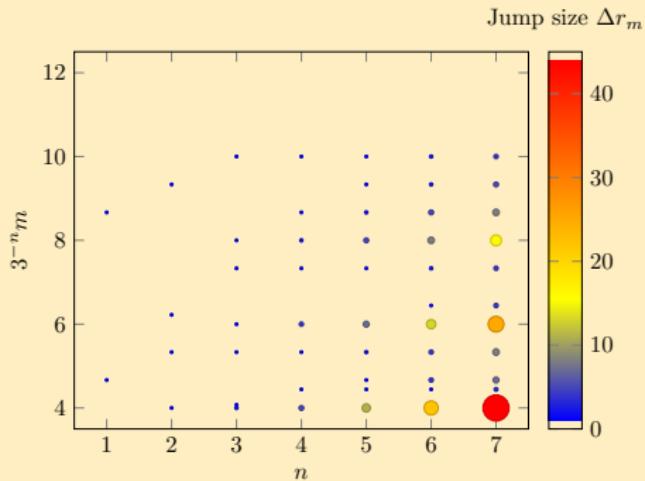
- 2013 & 14 Cornell math REU: Numerical study of sandpile patterns and growth. Made several key conjectures. [Fairchild–Haim–Setra–Strichartz–Westura '16, arXiv:1602.03424]
 - March–May 2017: Jonah Kudler-Flam (Colgate '17, now UChicago PhD candidate) obtained extensive numerical results and proved a spherical shape theorem. **AutomataSG**
 - **2018:** C. discovered an exact renormalization scheme to prove all the aforementioned “smoking guns.” **Sandpile growth on SG is an exactly solvable problem!**

These latest results will appear in

C.-Kudler-Flam, "Laplacian growth and sandpiles on the Sierpinski gasket: limit shape universality and exact solutions," arXiv:1807.xxxxx.

Radial jumps on SG follow a periodic structure

Theorem



- m = Initial # of chips at the origin; n = graph approximation level of SG.
- Major jumps at $4 \cdot 3^n$, $6 \cdot 3^n$, $8 \cdot 3^n$, $10 \cdot 3^n$. Period = $2 \cdot 3^n$.
- Intermediate jumps within each period, EXCEPT between $10 \cdot 3^n$ and $12 \cdot 3^n = 4 \cdot 3^{n+1}$.

The fundamental diagram

Proposition. For each $m \geq 12$, there exists a unique $(n, m') \in \mathbb{N}^2$ such that

$$(m \mathbb{1}_o)^\circ = \left(\begin{array}{c} \text{circle } m' \\ \text{triangle } \eta \in \mathcal{R}_n \\ \text{circle } m' \end{array} \right)^\circ \subseteq G_{n+1}.$$

It follows that $r_m = 2^n + r_{m'-2}$.

Example: $n = 3$. Record values of m at which m' jumps.

$\frac{m}{3^n}$	m	m'	$m - 2m'$	Δr_m	$\frac{m}{3^n}$	m	m'	$m - 2m'$	Δr_m
4	108	15	78	2	8	216	69	78	
$4\frac{2}{27}$	110	16	78	1	$8\frac{2}{27}$	218	70	78	
$4\frac{4}{9}$	120	19	82		$8\frac{4}{9}$	228	73	82	
$4\frac{2}{3}$	126	20	86		$8\frac{2}{3}$	234	74	86	
$5\frac{1}{3}$	144	28	88	1	$9\frac{1}{3}$	252	82	88	
6	162	42	78	1	10	270	96	78	1
$6\frac{2}{27}$	164	43	78		$10\frac{2}{27}$	272	97	78	
$6\frac{4}{9}$	174	46	82		$10\frac{4}{9}$	282	100	82	
$6\frac{2}{3}$	180	47	86		$10\frac{2}{3}$	288	101	86	
$7\frac{1}{3}$	198	55	88	1	$11\frac{1}{3}$	306	109	88	

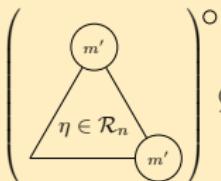
$\frac{m}{3^n}$	m	m'	$m - 2m'$	Δr_m	$\frac{m}{3^n}$	m	m'	$m - 2m'$	Δr_m	$\frac{m}{3^n}$	m	m'	$m - 2m'$	Δr_m						
2	1	0	1		8	216	69	78	1	6 $\frac{2}{3}$	1620	407	806							
8	4	0	1		8 $\frac{2}{27}$	218	70	78		7 $\frac{1}{3}$	1782	487	808	1						
n = 1																				
4	12	3	6		8 $\frac{2}{9}$	234	74	86		8 $\frac{2}{27}$	1946	610	726							
4 $\frac{2}{9}$	14	4	6	1	10	270	96	78	1	8 $\frac{2}{9}$	2052	649	754							
6	18	6	6		10 $\frac{2}{27}$	272	97	78		8 $\frac{2}{3}$	2106	650	806	2						
6 $\frac{2}{27}$	20	7	6		10 $\frac{3}{9}$	282	100	82		9 $\frac{1}{3}$	2268	730	808	1						
8	24	9	6		10 $\frac{2}{81}$	288	101	86		10	2430	852	726	1						
8 $\frac{2}{81}$	26	10	6	1	11 $\frac{1}{3}$	306	109	88		10 $\frac{2}{27}$	2432	853	726							
10	30	12	6		n = 4															
10 $\frac{2}{81}$	32	13	6		4	324	42	240	5	11 $\frac{1}{3}$	2538	892	754							
n = 2																				
4	36	6	24	1	4 $\frac{2}{21}$	326	43	240		4	2916	366	2184	22						
4 $\frac{2}{9}$	38	7	24		4 $\frac{1}{9}$	360	55	250	1	4 $\frac{2}{3}$	2918	367	2184							
4 $\frac{2}{27}$	42	8	26		4 $\frac{2}{9}$	378	56	266		4 $\frac{4}{9}$	3240	487	2266	1						
5 $\frac{1}{3}$	48	10	28	1	5 $\frac{1}{3}$	432	82	268	1	4 $\frac{2}{9}$	3402	488	2426	4						
6	54	15	24		6	486	123	240	4	5 $\frac{1}{3}$	3888	730	2428	4						
6 $\frac{2}{9}$	56	16	24	1	6 $\frac{2}{21}$	488	124	240		6	4374	1095	2184	13						
6 $\frac{2}{27}$	60	17	26		6 $\frac{2}{9}$	522	136	250		6 $\frac{2}{3}$	4376	1096	2184							
7 $\frac{1}{3}$	66	19	28		7 $\frac{1}{3}$	594	163	268	1	6 $\frac{4}{9}$	4698	1216	2266	1						
8	72	24	24		8	648	204	240	2	6 $\frac{2}{9}$	4860	1217	2426							
8 $\frac{2}{9}$	74	25	24		8 $\frac{2}{21}$	649	205	240		7 $\frac{1}{3}$	5346	1459	2428	2						
8 $\frac{2}{27}$	78	26	26		8 $\frac{2}{9}$	684	217	250		8	5832	1824	2184	8						
9 $\frac{1}{3}$	84	28	28	1	8 $\frac{2}{9}$	702	218	266	1	8 $\frac{2}{27}$	5834	1825	2184							
10	90	33	24		9 $\frac{1}{3}$	756	244	268		8 $\frac{4}{9}$	6156	1945	2266							
10 $\frac{2}{9}$	92	34	24		10	810	285	240	1	8 $\frac{2}{3}$	6318	1946	2426	5						
10 $\frac{8}{27}$	96	35	26		10 $\frac{2}{81}$	812	286	240		9 $\frac{1}{3}$	6804	2188	2428	2						
11 $\frac{1}{3}$	102	37	28		10 $\frac{2}{9}$	846	298	250		10	7290	2553	2184	2						
n = 3																				
4	108	15	78	2	11 $\frac{1}{3}$	918	325	268		n = 5										
4 $\frac{2}{27}$	110	16	78	1	n = 7										4	8748	1095	6558	44	
4 $\frac{1}{9}$	120	19	82		4	972	123	726	11	4 $\frac{2}{3}$	8750	1096	6558							
4 $\frac{2}{81}$	126	20	86		4 $\frac{2}{9}$	1080	163	754	1	4 $\frac{2}{9}$	9720	1459	6802	3						
5 $\frac{1}{3}$	144	28	88	1	4 $\frac{2}{9}$	1134	164	806	1	4 $\frac{2}{9}$	10206	1460	7286	7						
6	162	42	78	1	4 $\frac{2}{3}$	1296	244	808	2	5 $\frac{1}{3}$	11664	2188	7288	8						
6 $\frac{2}{27}$	164	43	78		6	1458	366	726	7	6	13122	3282	6558	25						
6 $\frac{4}{9}$	174	46	82		6 $\frac{2}{9}$	1460	367	726		n = 6										
6 $\frac{2}{81}$	180	47	86		6 $\frac{2}{27}$	1566	406	754		6 $\frac{2}{9}$	1620	407	806							
7 $\frac{1}{3}$	198	55	88	1	6 $\frac{2}{9}$	n = 4										4	2916	366	2184	22

Legend: $(m\mathbb{I}_\theta)^\circ = \left(\begin{array}{c} m' \\ \eta \in \mathcal{R}_n \\ m' \end{array} \right)^\circ$; # {chips in η } = $m - 2m'$.

Exact solution to the sandpile growth problem on SG

Theorem

For $n \geq 3$ and $m \in [4 \cdot 3^n, 4 \cdot 3^{n+1})$, $(m\mathbb{1}_o)^\circ = \left(\begin{array}{c} m' \\ \eta \in \mathcal{R}_n \\ m' \end{array} \right)^\circ \subseteq G_{n+1}$, where $m \mapsto m'$ is a



piecewise constant càdlàg function which has jumps indicated in the following table.

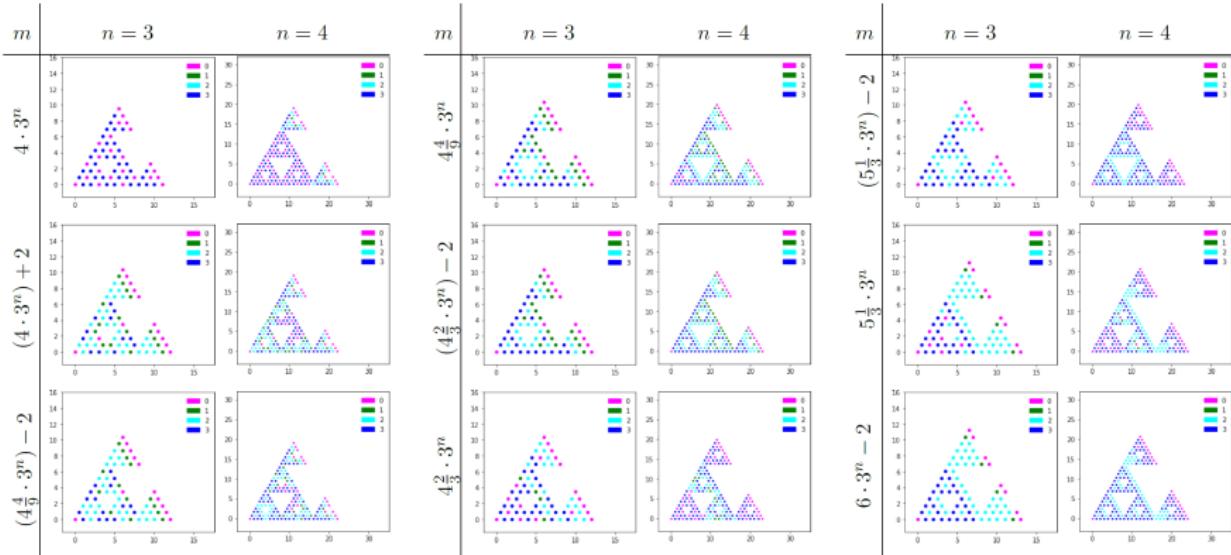
m	m'
$(4 + 2p) \cdot 3^n$	$b_n + p \cdot 3^n$
$(4 + 2p) \cdot 3^n + 2$	$(b_n + 1) + p \cdot 3^n$
$(4 \frac{4}{9} + 2p) \cdot 3^n$	$2 \cdot 3^{n-1} + 1 + p \cdot 3^n$
$(4 \frac{2}{3} + 2p) \cdot 3^n$	$2 \cdot 3^{n-1} + 2 + p \cdot 3^n$
$(5 \frac{1}{3} + 2p) \cdot 3^n$	$3^n + 1 + p \cdot 3^n$

where $p \in \{0, 1, 2, 3\}$, and $b_n = |V(G_{n-1})| = \frac{3}{2}(3^{n-1} + 1)$.

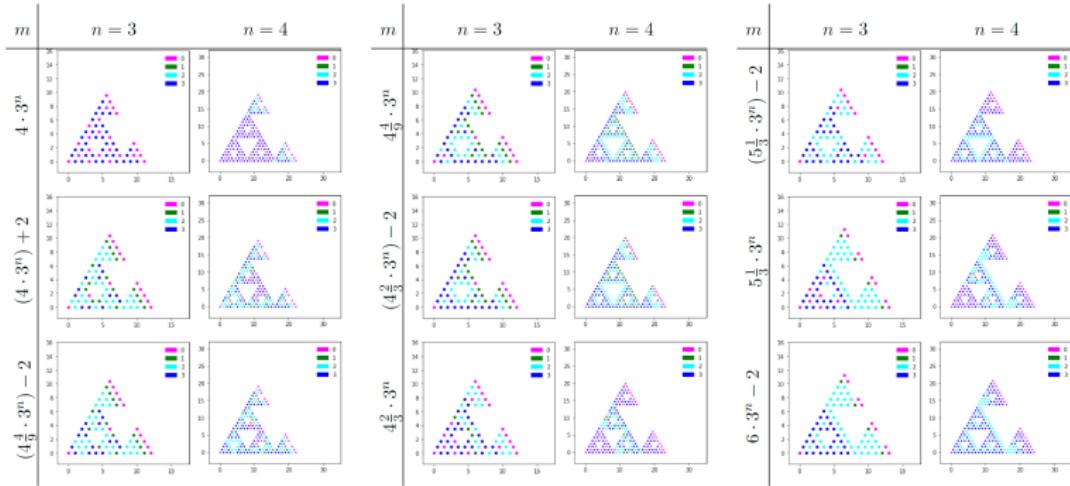
Proof. Diagrammatic analysis of “sandpile tile renormalization” at, and prior to, each jump in m' .

"Periodic table" of sandpiles on SG

The configuration restricted to G_n is a gluing of 3 smaller, well-defined sandpile tiles.
[Exceptions: $(4 \cdot 3^n) + 2$, $(4 \frac{4}{9} \cdot 3^n) - 2$.]



Sandpile growth on SG : Key motifs



For the rest of this talk I will explain why:

- ① The cluster is always an exact ball (in the graph metric).
- ② The identity element of the sandpile group is as claimed.
- ③ $(2 \cdot 3^n)$ -periodicity of the sandpile patterns.
- ④ The cluster “explodes” in that the radius increments by > 1 at periodic intervals.

Remark. Explosion does NOT appear on \mathbb{Z}^d , trees, or even some pcf fractals.

[e.g. On $SG(3)$ sandpile cluster radius always increments by 1: computation by Ilias Stitou (Colgate '19).]

Abelian sandpiles: theory

- $G = (V \cup \{s\}, E)$: locally finite connected undirected graph with a distinguished vertex s ("sink"). (In practice s may also be a set of vertices identified as sink.) Chips that fall into the sink disappear.
- $\eta : V \rightarrow \mathbb{N}_0$ denotes a sandpile configuration on G .
- If we topple a configuration η at the vertex $x \in V$, this generates a new configuration $\eta' = \eta - \Delta'_G(x, \cdot)$, where

$$\Delta'_G(x, y) = \begin{cases} \deg(x), & \text{if } x = y \in V, \\ -N_{xy}, & \text{if } x \neq y, x, y \in V. \end{cases}$$

is the **graph Laplacian** on G , and N_{xy} is the number of edges connecting x and y .

- η is **stable** if $\eta(x) < \deg(x)$ for all $x \in V$.
- Ω_G : the set of all stable configurations on G .
- Given a configuration η , let $\eta^\circ \in \Omega_G$ be the stabilization of η .
- Define the binary operation $\oplus : \Omega_G \times \Omega_G \rightarrow \Omega_G$ by

$$\eta \oplus \xi = (\eta + \xi)^\circ$$

Sandpile group and its identity element

- We define a Markov chain on Ω_G with transitions

$$\eta \rightarrow (\eta + \mathbb{1}_x)^\circ \quad \text{with probability } p(x),$$

where $p(x) > 0$ for all $x \in V$ and $\sum_{x \in V} p(x) = 1$. Using the standard Markov chain language, we say that $\eta \in \Omega_G$ is **recurrent** if starting from η , the Markov chain returns to η with probability 1.

- \mathcal{R}_G : the set of recurrent configurations on G .
- Theorem.** (\mathcal{R}_G, \oplus) forms an abelian group, called the **sandpile group** (or the **critical group** in the combinatorics literature).
- Theorem.** (\mathcal{R}_G, \oplus) is isomorphic to the quotient group $\mathbb{Z}^V / \mathbb{Z}^V \Delta'_G$.
- There are many papers on identifying the sandpile group of a given graph (by computing the Smith normal form of the graph Laplacian). It is also of interest (and nontrivial!) to find the **identity element** e of the sandpile group.

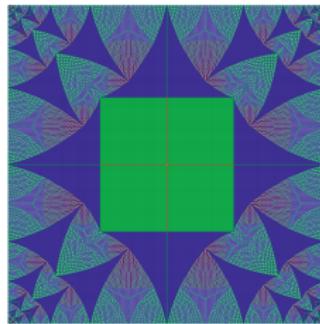


Figure: Identity element of the sandpile group for $([-n, n] \cap \mathbb{Z})^2$, with the entire boundary identified as sink.

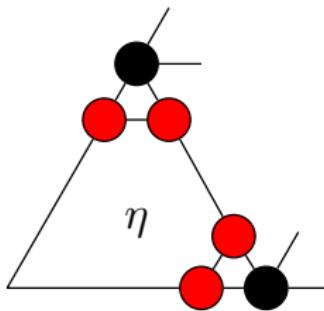
Dhar's "Multiplication by identity test"

Lemma. Let $\eta \in \mathcal{R}_G$. Then $\left(\eta + \sum_{y \in V} N_{sy} \mathbb{1}_y\right)^\circ = \eta$, and each vertex topples exactly once upon stabilization.

Proof. For each $y \in V$,

$$N_{sy} - \sum_{x \in V} \Delta'_G(x, y) = N_{sy} - \left(\sum_{\substack{x \in V \\ x \neq y}} (-N_{xy}) + \deg(y) \right) = 0.$$

This implies that on a recurrent configuration η , after we add N_{sy} chips to each vertex $y \in V$, and then topple once at every vertex, the same configuration η is returned.



Application to SG #1: The cluster is an exact ball

∂G_n = the two non-origin boundary vertices of G_n .

Proposition. For each $m \geq 12$, there exists a unique $(n, m') \in \mathbb{N}^2$ such that

$$(m \mathbb{1}_o)^\circ = \left(\begin{array}{c} \text{Diagram of a triangle with vertices } m' \\ \text{and base } \eta \in \mathcal{R}_n. \end{array} \right)^\circ \subseteq G_{n+1}$$

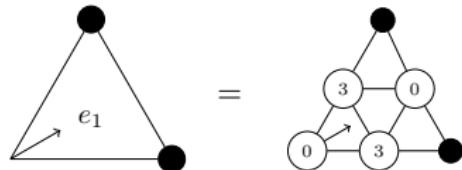
It follows that $r_m = 2^n + r_{m'-2}$.

Proof. First topple and stabilize at every vertex in $G_n \setminus \partial G_n$, and pause any excess chips on ∂G_n . This produces a recurrent config $\eta \in \mathcal{R}_n$, while leaving m' chips at each sink. Then topple all vertices in G_n simultaneously. Upon toppling each vertex in ∂G_n loses 2 chips to generate the tail. Continue until 2 (resp. 3) chips remain at each vertex in ∂G_n , if m' is even (resp. odd).

To see that the cluster is an exact ball, we verify it for all $m < 12$, then use the above procedure to establish it for all m .

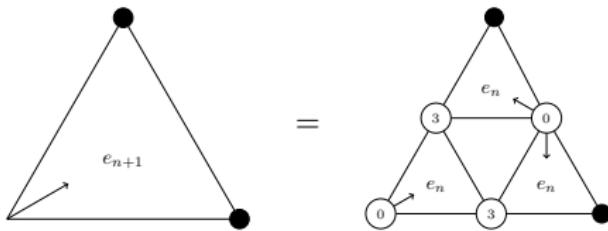
Application to SG #2: The identity element (with two sinks)

Let



, and for each $n \geq 1$, e_{n+1} is constructed by gluing three

copies of e_n according to the rule



Here each arrow emanates from the origin vertex of G_n to indicate the orientation.

Proposition. e_n is the identity element of (\mathcal{R}_n, \oplus) .

Remark. The sequence (e_n) is nested: $e_{n+1}|_{G_n} = e_n$.

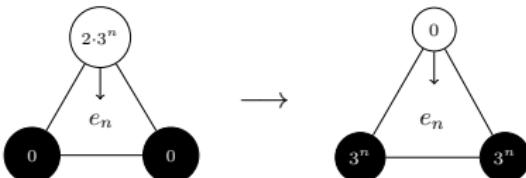
Proof that e_n is the identity element

Proposition. $e_n \oplus e_n = e_n$, and each sink receives $\frac{3}{2}(3^n - 1)$ chips upon stabilization.

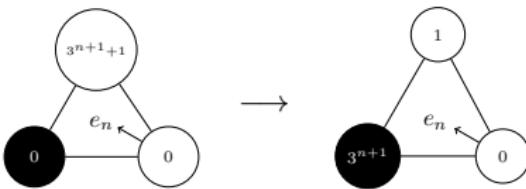
Proof. By induction on n .

- First, establish two types of toppling identities, one having two sink vertices and the other having one sink vertex.

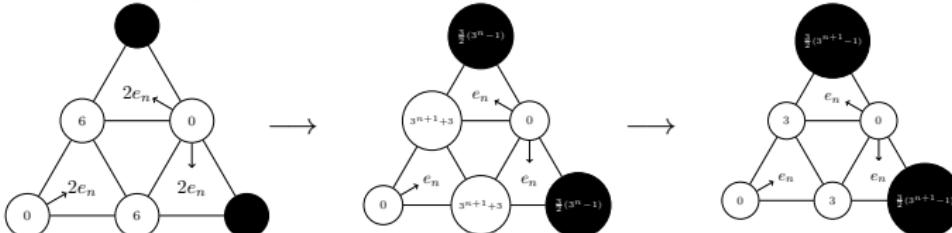
Two sinks at the bottom:



One sink at the bottom-left:



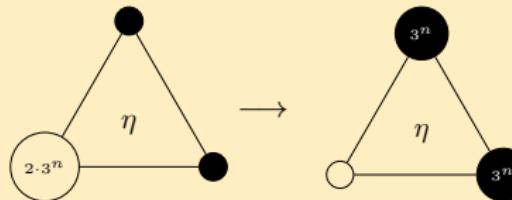
- Assuming the induction hypothesis, we then have



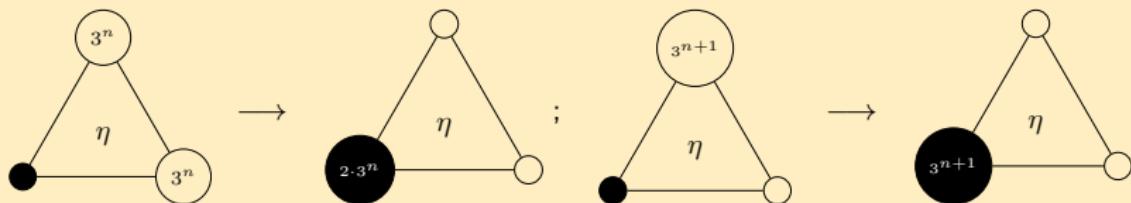
Induction step in the proof of toppling with one sink

Toppling identities, periodicity

Proposition. For every $\eta \in \mathcal{R}_n^{(s)}$,



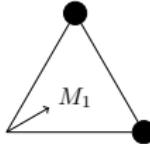
For every $\eta \in \mathcal{R}_n^{(o)}$,

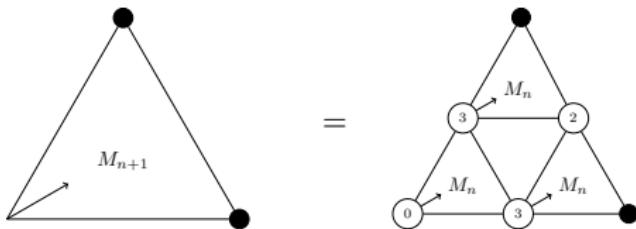


Proof. Already showed $(2 \cdot 3^n) \mathbb{1}_o \oplus e_n = e_n$. By the abelian property, $(2 \cdot 3^n) \mathbb{1}_o \oplus \eta = ((2 \cdot 3^n) \mathbb{1}_o \oplus e_n) \oplus \eta = e_n \oplus \eta = \eta$. The rest are similar.

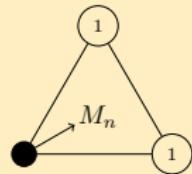
This explains the **$(2 \cdot 3^n)$ -periodicity** in the sandpile growth (and the patterns restricted to G_n).

The identity element (with one sink)

Let M_1 =  , and for each $n \geq 1$, M_{n+1} is constructed by gluing three copies of M_n according to the rule



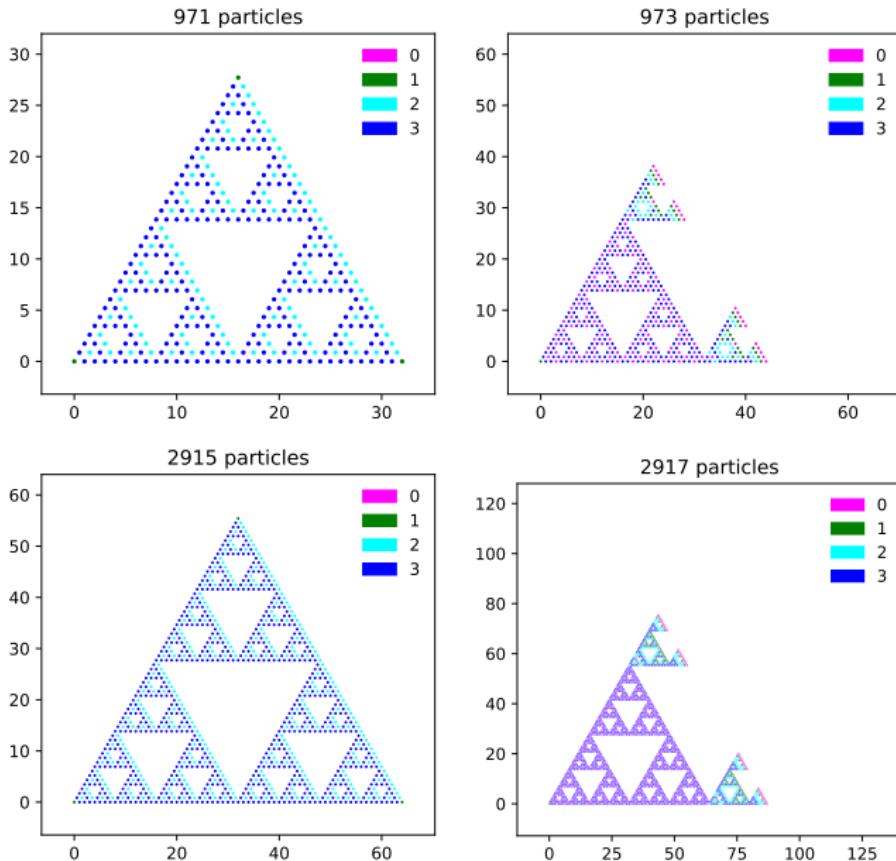
Proposition.



is the identity element w/ one sink.

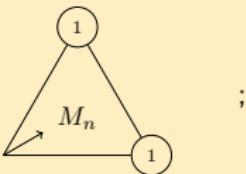
Proof. Same idea as the proof of the id element with two sinks.

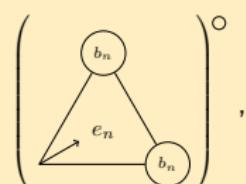
The main explosions at $4 \cdot 3^n$: transition from M_n to e_n



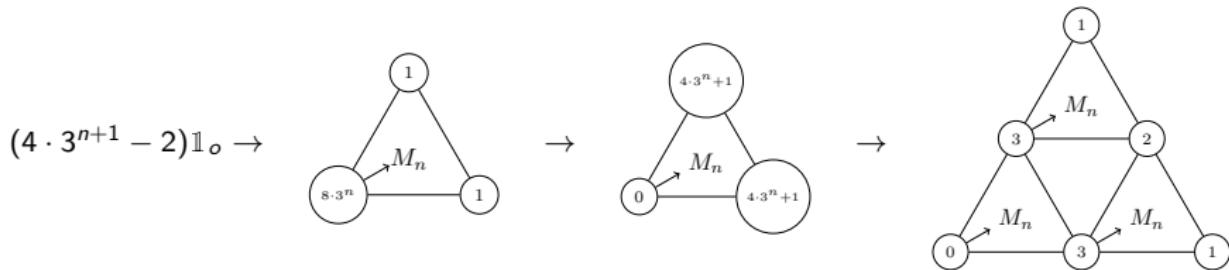
The main explosions at $4 \cdot 3^n$: transition from M_n to e_n

Proposition.

$$((4 \cdot 3^n - 2)\mathbb{1}_o)^\circ =$$

$$;$$

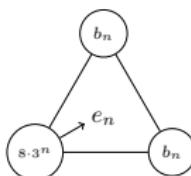
$$((4 \cdot 3^n)\mathbb{1}_o)^\circ =$$

$$\left(\begin{array}{c} b_n \\ \downarrow \\ e_n \\ b_n \end{array} \right)^\circ, \text{ where } b_n = \frac{3}{2}(3^{n-1} + 1).$$

Proof of the induction step.

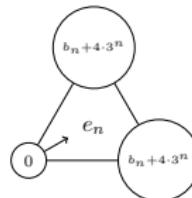


Proof (cont.).

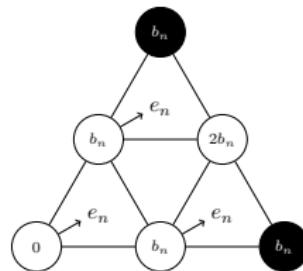
$$(4 \cdot 3^{n+1})\mathbb{1}_o \rightarrow$$



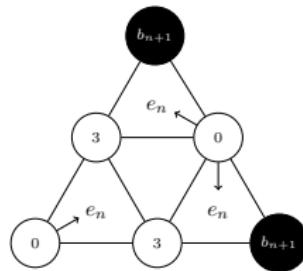
\rightarrow



\rightarrow

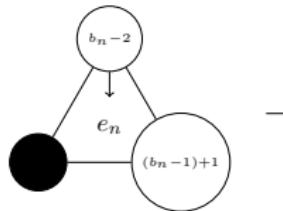


\rightarrow



.

The last step depends on the following “reflection lemma,” using the axial symmetry of SG :



Also note $b_{n+1} = b_n + 3^n$.

An axial reflection lemma (SG with one sink)

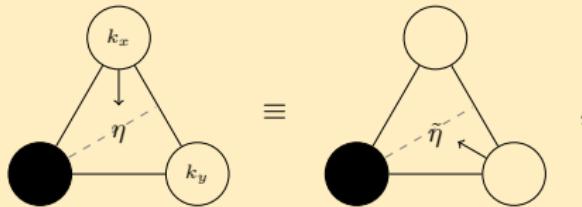
$e_n^{(o)}$ is the id element of $\mathcal{R}_n^{(o)}$; $\partial G_n = \{x, y\}$.

Lemma. Let $\eta \in \mathcal{R}_n^{(o)}$ be such that $\eta = e_n^{(o)} \oplus \alpha \mathbb{1}_x \oplus \beta \mathbb{1}_y$ for some $\alpha, \beta \in \mathbb{N}_0$. Let $k_x, k_y \in \mathbb{N}_0$ solve the system of equations

$$\begin{cases} \alpha + k_x &= \beta + p_0 \cdot 3^n + p_1 \cdot 3^{n+1} \\ \beta + k_y &= \alpha + p_0 \cdot 3^n + p_2 \cdot 3^{n+1} \end{cases}$$

for some $p_0, p_1, p_2 \in \mathbb{Z}$ (which come from the toppling identities).

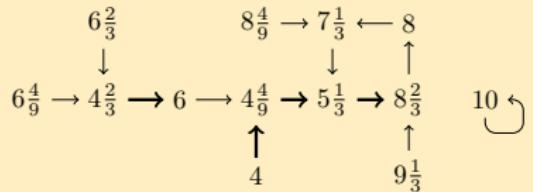
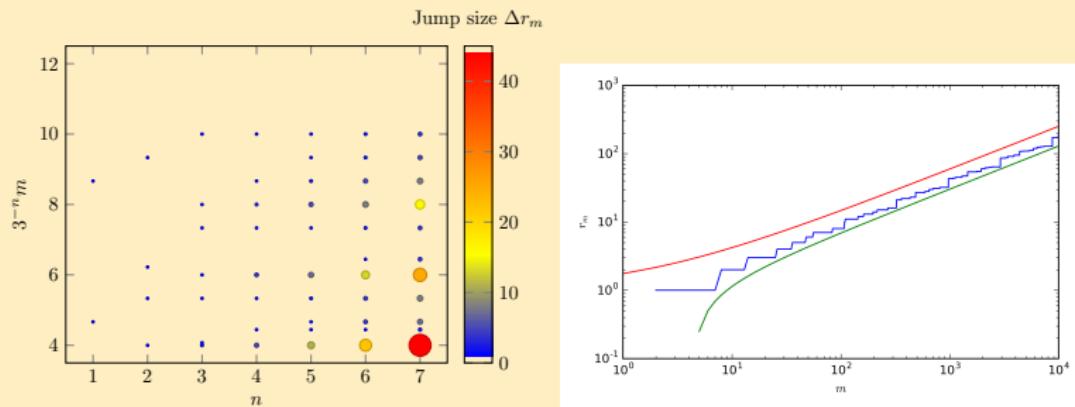
Then



where $\tilde{\eta} = e_n^{(o)} \oplus \beta \mathbb{1}_x \oplus \alpha \mathbb{1}_y$ is the reflection of η across the axis of symmetry.

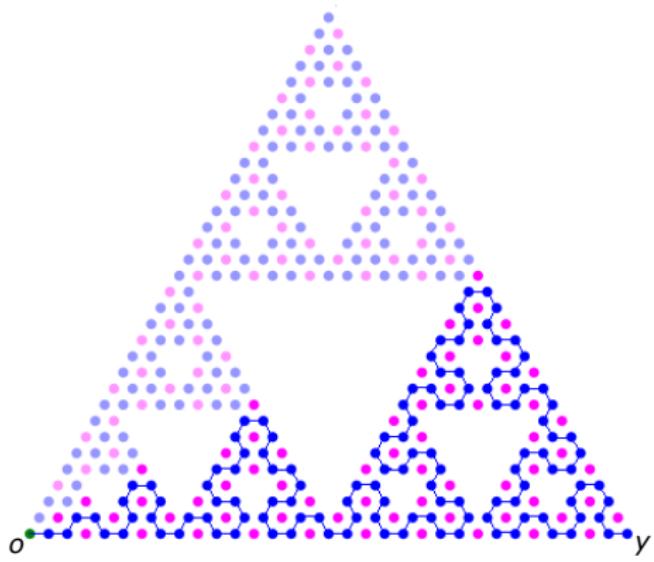
Cluster radius can be determined recursively

Theorem (C.-Kudler-Flam '17~'18)



$$\begin{aligned} a \rightarrow b: \quad r_{a \cdot 3^n} &= 2^n + r_{b \cdot 3^{n-1}} & (n \geq 3) \\ a \rightarrow b: \quad r_{a \cdot 3^n} &= 2^n + r_{b \cdot 3^{n-2}} & (n \geq 4) \end{aligned}$$

Radial asymptotics: Power law (with exponent $\log_3 2$) modulated by log-periodic oscillation (with explicit Fourier series representation) → proved using the renewal theorem.



Thank you!