# Counting polyominoes on the twisted cylinder 

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## Polyominoes (or lattice animals)

A polyomino is a connected subset of squares of the integer grid.
$\square 1$ monomino: $A_{1}=1 \quad \square \square 2$ dominoes: $A_{2}=2$
$\square \square \square \square \square$ triominoes: $A_{3}=6$


19 tetrominoes:

$$
A_{4}=19
$$

$A_{n}:=$ the number of $n$-ominoes

| $n$ | $A_{n}$ |
| ---: | ---: |
| 1 | 1 |
| 2 | 2 |
| 3 | 6 |
| 4 | 19 |
| 5 | 63 |
| 6 | 216 |
| 7 | 760 |
| 8 | 2,725 |
| 9 | 9,910 |
| 10 | 36,446 |
| 11 | 135,268 |
| 12 | 505,861 |
| 13 | $1,903,890$ |
| 14 | $7,204,874$ |
| 15 | $27,394,666$ |
| 16 | $104,592,937$ |
| 17 | $400,795,844$ |
| 18 | $1,540,820,542$ |
| 19 | $5,940,738,676$ |
| 20 | $22,964,779,660$ |
| 21 | $88,983,512,783$ |
| 22 | $345,532,572,678$ |
| 23 | $1,344,372,335,524$ |
| 24 | $5,239,988,770,268$ |
| 25 | $20,457,802,016,011$ |
| 26 | $79,992,676,367,108$ |
| 27 | $313,224,032,098,244$ |
| 28 | $1,228,088,671,826,973$ |


| $n$ | $A_{n}=$ polyominoes with $n$ cells |
| :---: | ---: |
| 29 | $4,820,975,409,710,116$ |
| 30 | $18,946,775,782,611,174$ |
| 31 | $74,541,651,404,935,148$ |
| 32 | $293,560,133,910,477,776$ |
| 33 | $1,157,186,142,148,293,638$ |
| 34 | $4,565,553,929,115,769,162$ |
| 35 | $18,027,932,215,016,128,134$ |
| 36 | $71,242,712,815,411,950,635$ |
| 37 | $281,746,550,485,032,531,911$ |
| 38 | $1,115,021,869,572,604,692,100$ |
| 39 | $4,415,695,134,978,868,448,596$ |
| 40 | $17,498,111,172,838,312,982,542$ |
| 41 | $69,381,900,728,932,743,048,483$ |
| 42 | $275,265,412,856,343,074,274,146$ |
| 43 | $1,092,687,308,874,612,006,972,082$ |
| 44 | $4,339,784,013,643,393,384,603,906$ |
| 45 | $17,244,800,728,846,724,289,191,074$ |
| 46 | $68,557,762,666,345,165,410,168,738$ |
| 47 | $272,680,844,424,943,840,614,538,634$ |
| 48 | $1,085,035,285,182,087,705,685,323,738$ |
| 49 | $4,319,331,509,344,565,487,555,270,660$ |
| 50 | $17,201,460,881,287,871,798,942,420,736$ |
| 51 | $68,530,413,174,845,561,618,160,604,928$ |
| 52 | $273,126,660,016,519,143,293,320,026,256$ |
| 53 | $1,088,933,685,559,350,300,820,095,990,030$ |
| 54 | $4,342,997,469,623,933,155,942,753,899,000$ |
| 55 | $17,326,987,021,737,904,384,935,434,351,490$ |
| 56 | $69,150,714,562,532,896,936,574,425,480,218$ |


| $n$ | $A_{n}$ 三 | $n$ | $A_{n}=$ polyominoes with $n$ cells |
| :---: | :---: | :---: | :---: |
| 1 | 1 1ミ | 29 | ミ4，820，975，409，710，116 |
| 2 | 2 | 30 | ミ18，946，775，782，611，174 |
| 3 | ¢ | 31 | ミ $74,541,651,404,935,148$ |
| 4 | \％ | 32 | ミ293，560，133，910，477，776 |
| 5 | ミ163 | 33 | 圭，157，186，142，148，293，638 |
| 6 | ミ16 | 34 | ミ $4,565,553,929,115,769,162$ |
| 7 | ミ 760 | 35 | 这8，027，932，215，016，128，134 |
| 8 | 这，725 | 36 | ミ $71,242,712,815,411,950,635$ |
| 9 | ミ9，910 | 37 | ミ $281,746,550,485,032,531,911$ |
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## Enumeration and counting of polyominoes

- Ron Read [1962]
- ...
- the transfer matrix method:
A. R. Conway and A. J. Guttman [1995],
I. Jensen [2001], D. E. Knuth [2001].
- I. Jensen [2003] computed $A_{56}$, using parallel computers.


## The asymptotic growth of $A_{n}$

$$
\lim _{n \rightarrow \infty} \sqrt[n]{A_{n}}=: \lambda \text { exists. [D. A. Klarner 1967] }
$$

$\lambda=$ Klarner's constant .

$$
3.874 \leq \lambda \leq 4.65
$$

Lower bound comes from "extrapolation" from the known values $A_{1}, \ldots, A_{56}$
("pseudo-renewal sequences" [Rands and Welsh 1981])
$\lambda$ is estimated to be $\approx 4.06$.
Does $\lim _{n \rightarrow \infty} \frac{A_{n+1}}{A_{n}}$ exist? $A_{n} \sim$ const $\cdot \lambda^{n} n^{-1}$ ?

Best previous lower bound on Klarner's constant:

$$
3.874 \leq \lambda \leq 4.65
$$

We improve the lower bound to

$$
\lambda \geq 3.9801
$$

by counting polyominoes on a twisted cylinder.

A twisted cylinder of width $W$

identify point $(i, j)$ with $(i+1, j+W)$ on the integer grid $\mathbb{Z} \times \mathbb{Z}$

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## A twisted cylinder of width $W$


identify point $(i, j)$ with $(i+1, j+W)$ on the integer grid $\mathbb{Z} \times \mathbb{Z}$
$A_{n}^{W}:=$ the number of $n$-ominoes on a twisted cylinder of width $W$

The plane contains more polyominoes than the twisted cylinder:
$A_{n} \geq A_{n}^{W}$

UNWRAP: one-to-many
$\mathbb{Z} \times \mathbb{Z}$


The plane contains more polyominoes than the twisted cylinder:


$$
\begin{gathered}
A_{n} \geq A_{n}^{W} \\
\lambda^{W}:=\lim _{n \rightarrow \infty} \frac{A_{n+1}^{W}}{A_{n}^{W}}
\end{gathered}
$$

$\lambda^{W}$ is a lower bound on Klarner's constant $\lambda$.


Klarner's constant $\lambda \geq \lambda^{W}>3.9801$.

## The transfer matrix method a.k.a. dynamic programming



Build up the cylinder one cell at a time.
Retain information about connectivity of partial polyomino $=$ "state" of partial polyomino

## The state of a partial polyomino



## Adding a cell

Every state has two successor states: succ ${ }_{0}$ and succ $_{1}$.


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Every state has two successor states: succ ${ }_{0}$ and succ $_{1}$.

succ $_{0}$ does not always exist.

$$
s=\langle\{1,2\},\{4\}\rangle
$$



$$
\operatorname{succ}_{0}(s)=\emptyset
$$

This cell is disconnected from the boundary.

## The transfer equations

$\mathbf{x}_{s}^{(i)}:=$ The number of partial polyominoes

- with $i$ occupied cells
- in state $s$

$$
\mathbf{x}_{\langle\{W\}\rangle}^{(n)}=A_{n}^{W}
$$

Recursion:

$$
\mathbf{x}_{s}^{(i+1)}=\sum_{s^{\prime}: s=\operatorname{succ}_{0}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i+1)}+\sum_{s^{\prime}: s=\operatorname{succ}_{1}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i)}(*)
$$

## No cyclic dependency

$$
\mathbf{x}_{s}^{(i+1)}=\sum_{s^{\prime}: s=\operatorname{succ}_{0}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i+1)}+\sum_{s^{\prime}: s=\operatorname{succ}_{1}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i)}(*)
$$

$\mathbf{x}^{(i+1)}$ depends on itself, but there is no cycle in the chain

$$
\begin{aligned}
& s, \operatorname{succ}_{0}(s), \operatorname{succ}_{0}\left(\operatorname{succ}_{0}(s)\right) \\
& \qquad \operatorname{succ}_{0}\left(\operatorname{succ}_{0}\left(\operatorname{succ}_{0}(s)\right)\right), \ldots
\end{aligned}
$$

Example:
$W=3$

## SuCC $_{0}$

SUCC $_{1}$


$$
\begin{equation*}
\mathbf{x}_{s}^{(i+1)}:=\sum_{s^{\prime}: s=\operatorname{succ}_{0}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i+1)}+\sum_{s^{\prime}: s=\operatorname{succ}_{1}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i)} \tag{*}
\end{equation*}
$$


$A_{n}^{W}=\mathbf{x}_{\langle\{W\}\rangle}^{(n)}=$ the number of paths from $u_{\langle\{1\}\rangle}^{(1)}$ to $u_{\langle\{W\}\rangle}^{(n)}$

## Convergence of the iteration

$$
\lambda^{W}=\lim _{n \rightarrow \infty} \frac{A_{n+1}^{W}}{A_{n}^{W}}=\lim _{n \rightarrow \infty} \frac{\mathbf{x}_{s}^{(n+1)}}{\mathbf{x}_{s}^{(n)}},
$$

for any state $s$.
$\lambda^{W}$ is the Perron-Frobenius eigenvalue of the iteration

$$
\mathbf{x}^{(n)} \mapsto \mathbf{x}^{(n+1)},
$$

and $\mathbf{x}^{(n)}$ converges to the corresponding eigenvector.

## Convergence of the iteration

$$
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and $\mathbf{x}^{(n)}$ converges to the corresponding eigenvector.
[ Some states are not successors of any state. ]

Some states are not successors of any state


Some states are not successors of any state


## Forward and backward recursion

The forward iteration:

$$
\begin{equation*}
\mathbf{x}_{s}^{(i+1)}:=\sum_{s^{\prime}: s=\operatorname{succ}_{0}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i+1)}+\sum_{s^{\prime}: s=\operatorname{succ}_{1}\left(s^{\prime}\right)} \mathbf{x}_{s^{\prime}}^{(i)} \tag{*}
\end{equation*}
$$

The backward iteration:

$$
\mathbf{y}_{s}^{(i-1)}:=\mathbf{y}_{\text {succ }_{0}(s)}^{(i-1)}+\mathbf{y}_{\text {succ }_{1}(s)}^{(i)}
$$

(Omit $\mathbf{y}_{\text {succo }_{0}(s)}^{(i-1)}$ if $\operatorname{succ}_{0}(s)$ does not exist.)

$$
\mathbf{y}_{s}^{(i-1)}:=\mathbf{y}_{\text {succ }_{0}(s)}^{(i-1)}+\mathbf{y}_{\text {succ }_{1}(s)}^{(i)}
$$


$A_{n}^{W}=\mathbf{y}_{\langle\{1\}\rangle}^{(-n)}=$ the number of paths from $u_{\langle\{1\}\rangle}^{(1)}$ to $u_{\langle\{W\}\rangle}^{(n)}$

## Convergence of the iteration

$$
\lambda^{W}=\lim _{n \rightarrow \infty} \frac{\mathbf{y}_{s}^{(-(n+1))}}{\mathbf{y}_{s}^{((-n)}}, \text { for any state } s .
$$

$\lambda^{W}$ is the Perron-Frobenius eigenvalue of the iteration

$$
\mathbf{y}^{(-n)} \mapsto \mathbf{y}^{(-(n+1))},
$$

and $\mathbf{y}^{(-n)}$ converges to the corresponding eigenvector.

## Convergence of the iteration

$$
\lambda^{W}=\lim _{n \rightarrow \infty} \frac{\mathbf{y}_{s}^{(-(n+1))}}{\mathbf{y}_{s}^{((-n)}}, \text { for any state } s .
$$

Lemma:

$$
\min _{s} \frac{\mathbf{y}_{s}^{(-(n+1))}}{\mathbf{y}_{s}^{(-n)}} \leq \lambda^{W} \leq \max _{s} \frac{\mathbf{y}_{s}^{(-(n+1))}}{\mathbf{y}_{s}^{(-n)}}
$$

$\Longrightarrow$ bounds on $\lambda^{W}$ from two successive iterates.

## The program

succ $_{0}$, succ $_{1}$ are stored in two arrays.
initialize $y_{2}$ old $[s]:=1$ for all $s$ (for example)
while not convergence
for $s:=1$ to $M$
if $\operatorname{succ} 0[s] \neq 0$
then y_new $[s]:=y \_o l d[\operatorname{succ} 1[s]]+y \_n e w[\operatorname{succ} 0[s]]$
else y_new $[s]:=y \_o l d[\operatorname{succ} 1[s]]$
y_old $:=$ y_new
"state" $s$ is an integer between 1 and $M=M_{W+1}$

## How to represent states

A state is a family of disjoint subsets of $\{1,2, \ldots, W\}$ with two properties:


- non-crossing:

The pattern

$$
\ldots \text { А.... В...А........ }
$$

is forbidden.

- Adjacent occupied cells belong to the same block.


## How to represent states

$\mathbf{y}$ is a vector whose entries are indexed by states $s$. Use a bijection between states and Motzkin paths.

$n$ steps $0, \pm 1$; nonnegative; start and end at 0 .

$$
\begin{aligned}
& \text { Motzkin numbers } M_{n}=\frac{3^{n}}{n^{3 / 2}} \cdot \sqrt{\frac{27}{4 \pi}} \cdot(1+O(1 / n)) \\
& M_{1}, M_{2}, \ldots=1,2,4,9,21,51,127,323,835,2188, \ldots
\end{aligned}
$$

states $\leftrightarrow$ Motzkin paths of length $W+1$ [suggested by Stefan Felsner]

- A A A - B - C C - A A - A A

states $\leftrightarrow$ Motzkin paths of length $W+1$ [suggested by Stefan Felsner]

$W+1$
even levels: free cells
states $\leftrightarrow$ Motzkin paths of length $W+1$ [suggested by Stefan Felsner]

- Cells of one component lie on the same odd level.
states $\leftrightarrow$ Motzkin paths of length $W+1$ [suggested by Stefan Felsner]

- Cells of one component lie on the same odd level.
- Cells of successive components on the same level are separated by a valley.


## Ranking/unranking of Motzkin paths


$\mapsto 9+4+0+1+0=14$

Motzkin path $P \mapsto$ integer between 1 and $M_{n}$
$=$ rank of $P$ in lexicographic order

```
state \(s=\langle\{1,7\},\{4,5\},\{10,11,12\}\rangle\)
```



## Computing successors



## Computing successors



## The program

Preprocessing: store $\operatorname{succ}_{0}$, succ $_{1}$ in two arrays.
initialize y_old $[s]:=1$ for all $s$
while not convergence
for $s:=1$ to $M$
if $\operatorname{succ} 0[s] \neq 0$
then $y \_n e w[s]:=y \_o l d[\operatorname{succ} 1[s]]+y \_n e w[\operatorname{succ} 0[s]]$
else y_new $[s]:=y \_o l d[\operatorname{succ} 1[s]]$
y_old $:=$ y_new
storage: 4 arrays

storage: 4 arrays

$W=22: M \approx 10^{9}$
18 Gigabytes of main memory (32 available)

240 iterations
6 hours runtime

16 bytes

## Open Questions?

$$
\lambda^{W+1}>\lambda^{W} ?
$$

## (may be easy)

$$
\lim _{W \rightarrow \infty} \lambda^{W}=\lambda ?
$$

