

Self-avoiding walks

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Introduction

Length doubling

Implementation

Results

Conclusion



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Joint work



- ▶ Gerard Barkema (Theoretical Physics)



- ▶ Raoul Schram (student mathematics/physics)

Introduction

Length doubling

Implementation

Results

Conclusion



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Contents

Introduction self-avoiding walks

New method: length doubling

Implementation

Results

Conclusion

Introduction

Length doubling

Implementation

Results

Conclusion



Curiosity-driven walks



Introduction

Length doubling

Implementation

Results

Conclusion

Source: my-new-york.com, nyc-architecture.com



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Definition self-avoiding walks

- ▶ A **self-avoiding walk** (SAW) is a walk on a regular lattice that never returns to a position already visited.
- ▶ We start in the origin.
- ▶ The length of a walk is the number of steps, N .

Introduction

Length doubling

Implementation

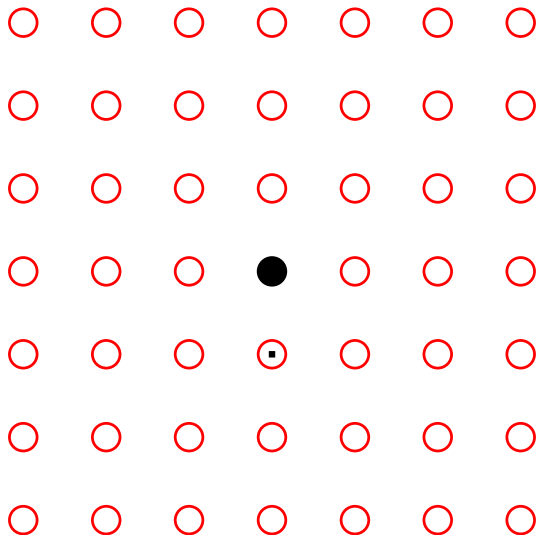
Results

Conclusion



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A self-avoiding walk of length 0 in 2D



Introduction

Length doubling

Implementation

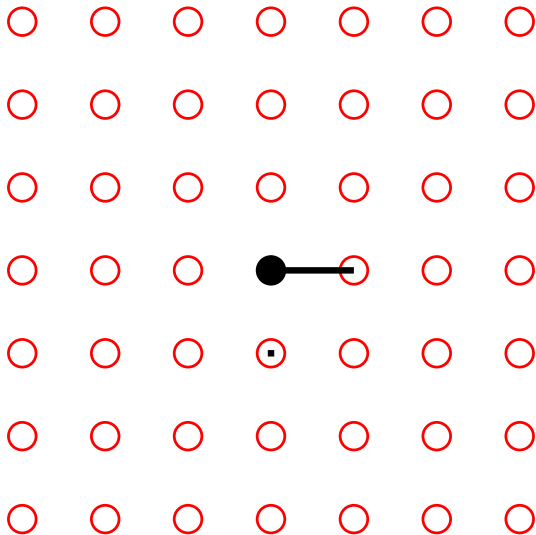
Results

Conclusion



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A self-avoiding walk of length 1 in 2D



Introduction

Length doubling

Implementation

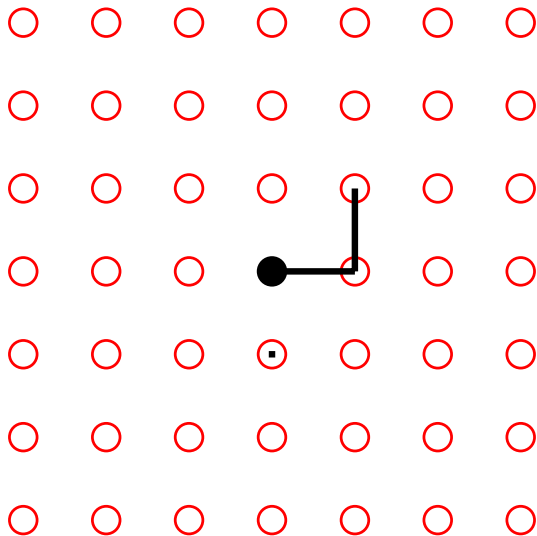
Results

Conclusion



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A self-avoiding walk of length 2 in 2D



Introduction

Length doubling

Implementation

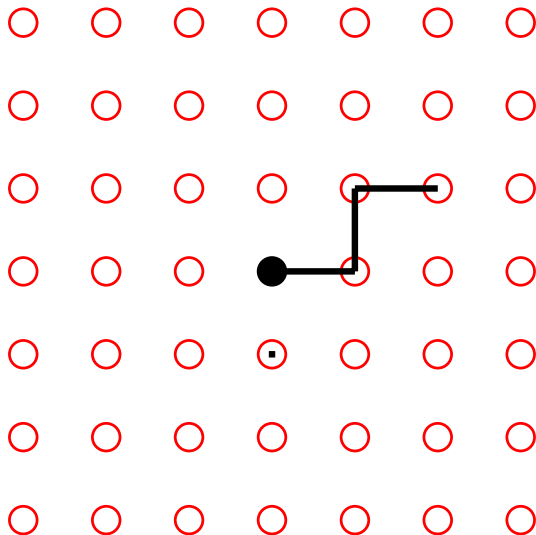
Results

Conclusion



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A self-avoiding walk of length 3 in 2D



Introduction

Length doubling

Implementation

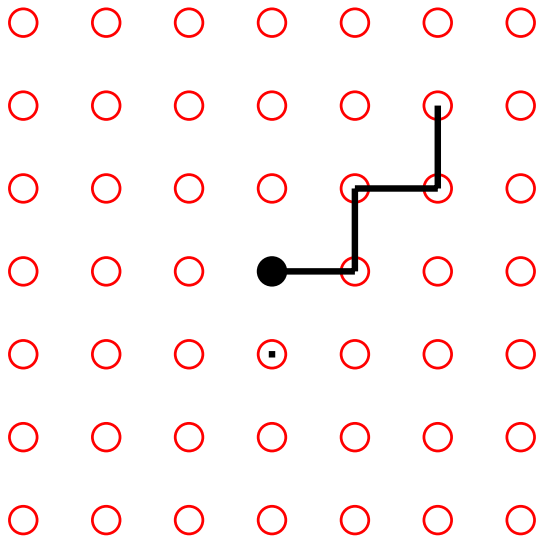
Results

Conclusion



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A self-avoiding walk of length 4 in 2D



Introduction

Length doubling

Implementation

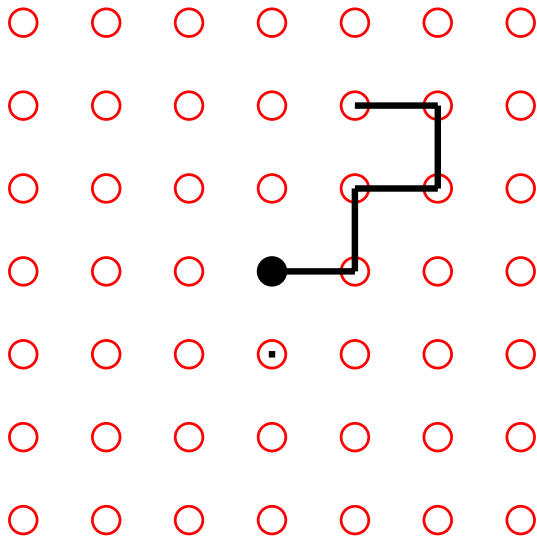
Results

Conclusion



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A self-avoiding walk of length 5 in 2D



Introduction

Length doubling

Implementation

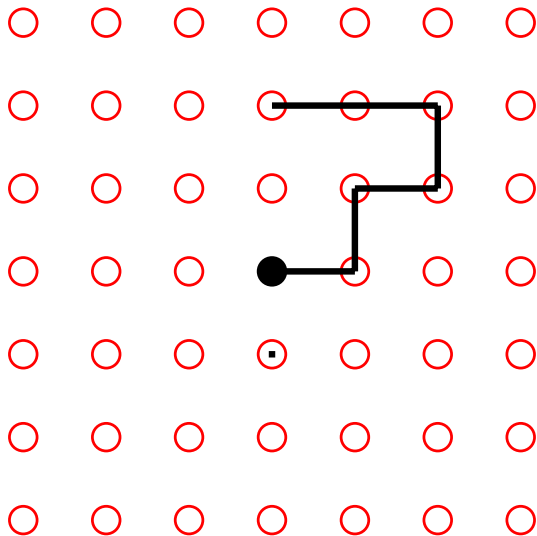
Results

Conclusion



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A self-avoiding walk of length 6 in 2D



Introduction

Length doubling

Implementation

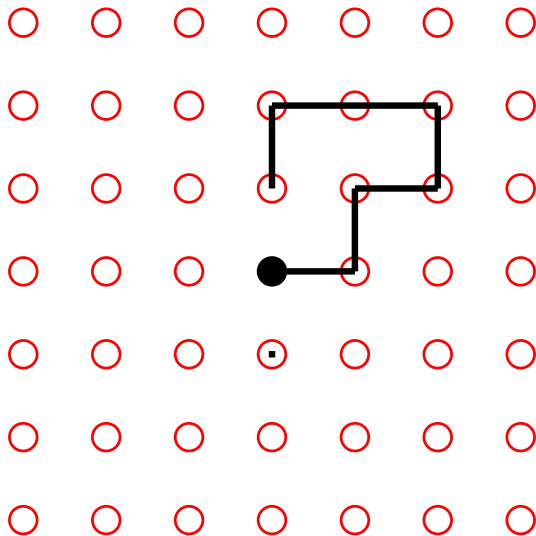
Results

Conclusion



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A self-avoiding walk of length 7 in 2D



Introduction

Length doubling

Implementation

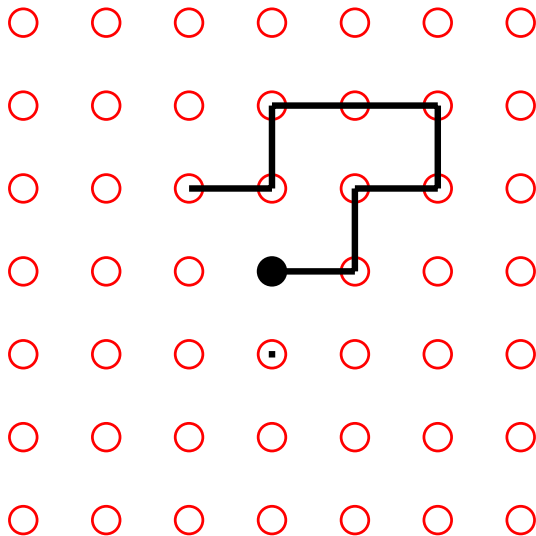
Results

Conclusion



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A self-avoiding walk of length 8 in 2D



Introduction

Length doubling

Implementation

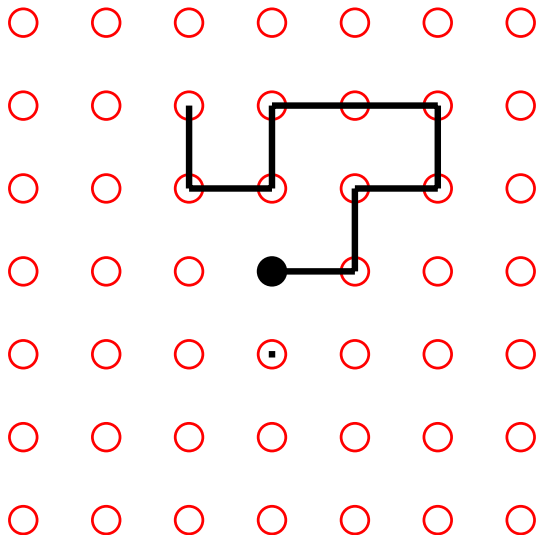
Results

Conclusion



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A self-avoiding walk of length 9 in 2D



Introduction

Length doubling

Implementation

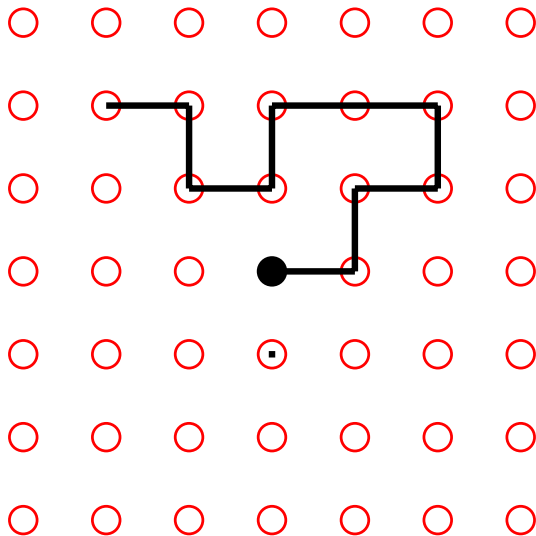
Results

Conclusion



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A self-avoiding walk of length 10 in 2D



Introduction

Length doubling

Implementation

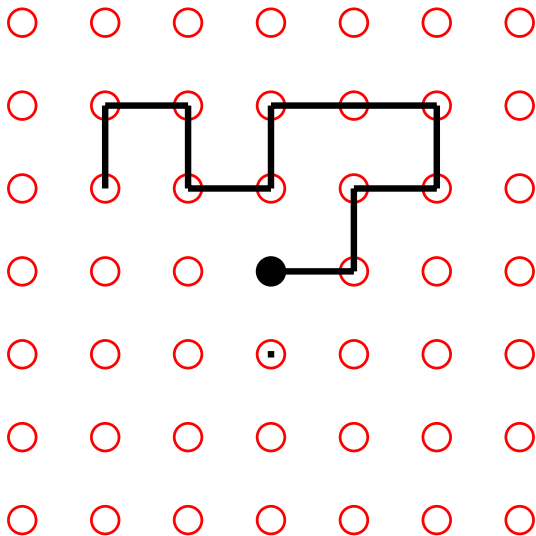
Results

Conclusion



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A self-avoiding walk of length 11 in 2D



Introduction

Length doubling

Implementation

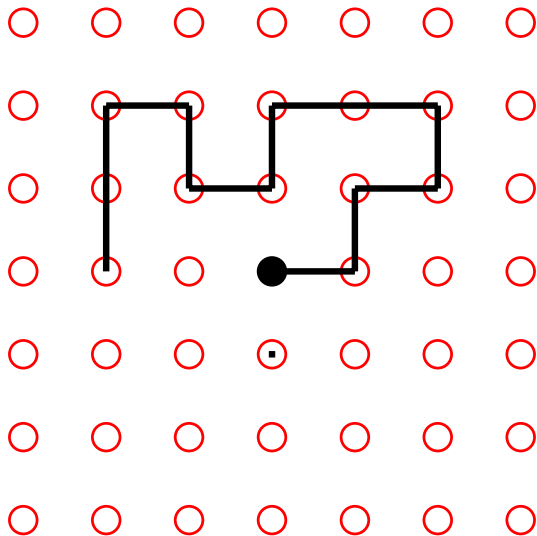
Results

Conclusion



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A self-avoiding walk of length 12 in 2D



Introduction

Length doubling

Implementation

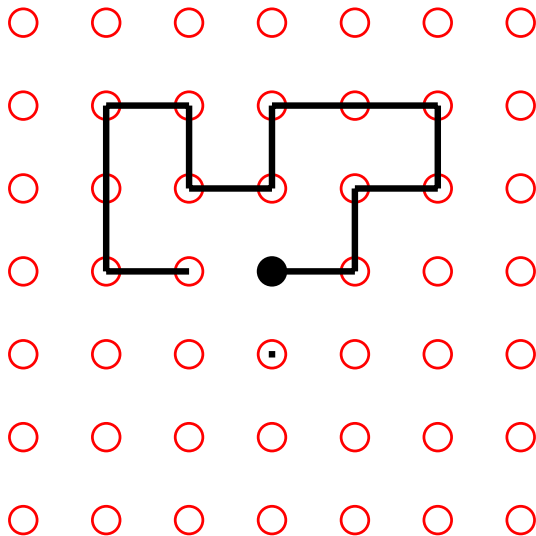
Results

Conclusion



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A self-avoiding walk of length 13 in 2D



Introduction

Length doubling

Implementation

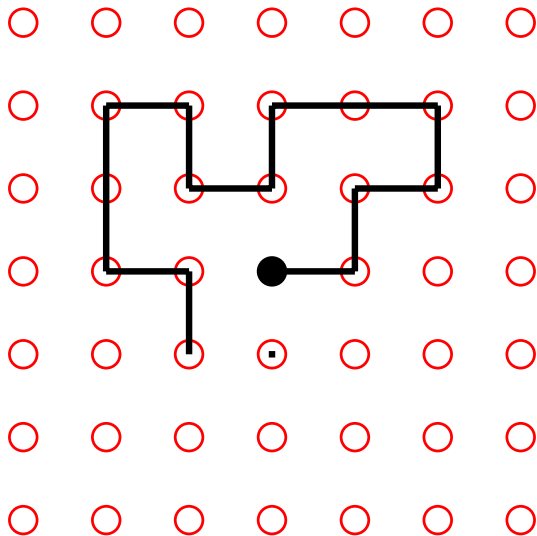
Results

Conclusion



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A self-avoiding walk of length 14 in 2D



Introduction

Length doubling

Implementation

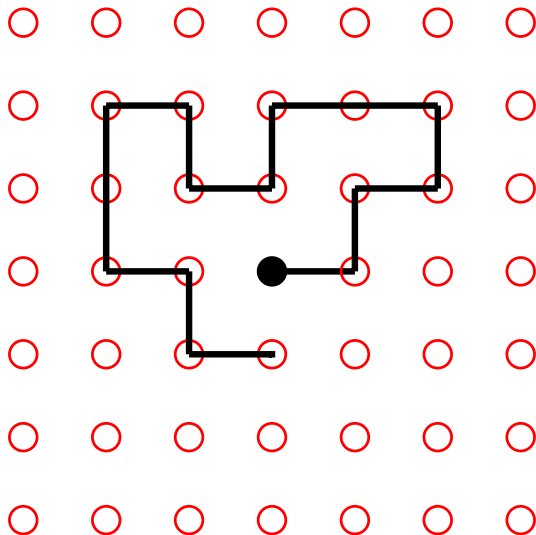
Results

Conclusion



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A self-avoiding walk of length 15 in 2D



Introduction

Length doubling

Implementation

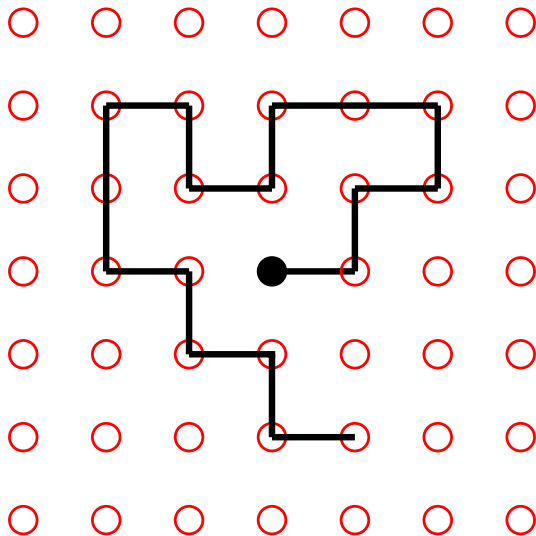
Results

Conclusion



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A self-avoiding walk of length 17 in 2D



Introduction

Length doubling

Implementation

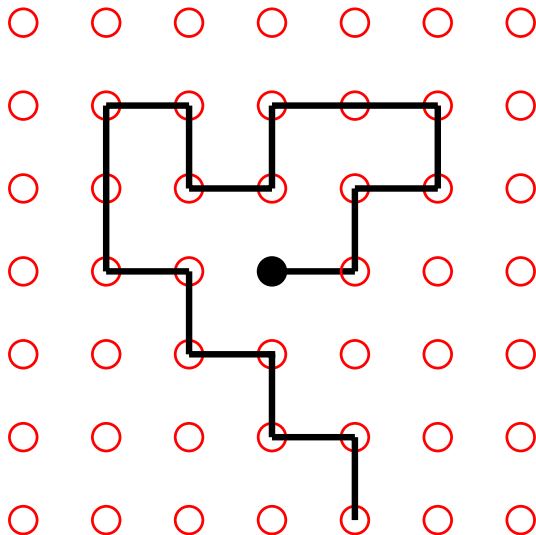
Results

Conclusion



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A self-avoiding walk of length 18 in 2D



Introduction

Length doubling

Implementation

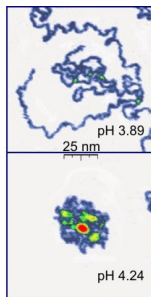
Results

Conclusion



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Why are self-avoiding walks useful?



(Roiter and Minko 2007)

Poly(2-vinylpyridine) observed by Atomic Force Microscope.

- ▶ The walk models a **polymer**, a long molecule, based on a carbon chain $C-C-C-C \dots C$.
- ▶ A prime motivation is the DNA polymer.
- ▶ Self-avoiding because 2 carbon atoms cannot exist at the same location (the **excluded-volume** property)



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Introduction

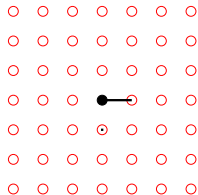
Length doubling

Implementation

Results

Conclusion

How many self-avoiding walks are there?



- ▶ In 2D: $Z_1 = 4$ walks.

Introduction

Length doubling

Implementation

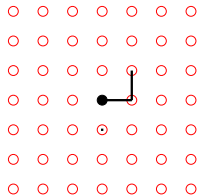
Results

Conclusion



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How many self-avoiding walks of length 2?



- ▶ $Z_2 = 4 \times 3 = 12$ walks.

Introduction

Length doubling

Implementation

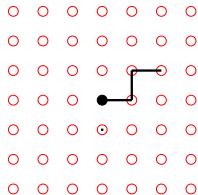
Results

Conclusion



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How many self-avoiding walks of length 3?



- ▶ $Z_3 = 4 \times 3 \times 3 = 36$ walks.

Introduction

Length doubling

Implementation

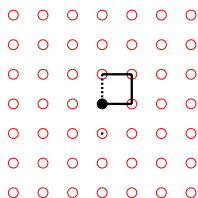
Results

Conclusion



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How many self-avoiding walks of length 4?



- ▶ There are $4 \times 3 \times 3 \times 3 = 108$ possible walks, not all self-avoiding.
- ▶ In 8 cases, we return to the origin. So $Z_4 = 108 - 8 = 100$.
- ▶ Question: can you give an upper bound for Z_8 ?

Introduction

Length doubling

Implementation

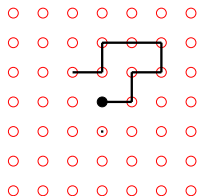
Results

Conclusion



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How many self-avoiding walks of length 8?



- ▶ There are $4 \times 3^7 = 8748$ possible walks, not all self-avoiding. So $Z_8 \leq 8748$.
- ▶ In general:

$$2^N \leq Z_N \leq 4 \times 3^{N-1}.$$

Introduction

Length doubling

Implementation

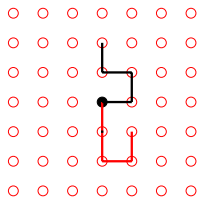
Results

Conclusion



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How many self-avoiding walks of length 8?



- ▶ We can **concatenate** two self-avoiding walks of length 4:

$$Z_8 \leq Z_4^2 = 10000.$$

- ▶ A sharper upper bound: the first **red step** cannot be the reverse of the last black step:

$$Z_8 \leq \frac{3}{4}Z_4^2 = 7500.$$

- ▶ $Z_8 = 5916$.

Introduction

Length doubling

Implementation

Results

Conclusion



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Recursive 2D SAW algorithm

SAW(i, N)

i = number of steps made, $0 \leq i \leq N$

N = desired length of the walk.

$(x_0, y_0), (x_1, y_1), \dots, (x_{i-1}, y_{i-1})$ is self-avoiding.

if not visited (x_i, y_i) **then**

if $i = N$ **then**

 print " $(x_0, y_0), \dots, (x_N, y_N)$ is a SAW"

else

 visited(x_i, y_i) = **true**;

$x_{i+1} = x_i + 1$; $y_{i+1} = y_i$; **SAW**($i + 1, N$);

$x_{i+1} = x_i - 1$; $y_{i+1} = y_i$; **SAW**($i + 1, N$);

$x_{i+1} = x_i$; $y_{i+1} = y_i + 1$; **SAW**($i + 1, N$);

$x_{i+1} = x_i$; $y_{i+1} = y_i - 1$; **SAW**($i + 1, N$);

 visited(x_i, y_i) = **false**;

Introduction

Length doubling

Implementation

Results

Conclusion



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Bound for Z_{M+N}

- ▶ A self-avoiding walk of length $M + N$ can be **cut** into walks of lengths M and N , so

$$Z_{M+N} \leq Z_M \cdot Z_N.$$

- ▶ For $M = N$, we get $Z_{2N} \leq (Z_N)^2$.
- ▶ So $Z_N \geq (Z_{2N})^{1/2}$ for all N , giving

$$Z_1 \geq (Z_2)^{1/2} \geq (Z_4)^{1/4} \geq (Z_8)^{1/8} \geq \dots$$

Introduction

Length doubling

Implementation

Results

Conclusion



Convergence in 2D

- ▶ In the limit case for the 2D square lattice:

$$\lim_{N \rightarrow \infty} (Z_N)^{1/N} = \mu \approx 2.638, \quad \text{so } Z_N \sim \mu^N$$

- ▶ $Z_{71} = 4, 190, 893, 020, 903, 935, 054, 619, 120, 005, 916$ (Jensen 2004).
- ▶ For 2D hexagonal lattice, $\mu = \sqrt{2 + \sqrt{2}} \approx 1.848$ (Duminil-Copin and Smirnov 2010).

Introduction

Length doubling

Implementation

Results

Conclusion



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The world is 3D

- ▶ Clisby, Liang, Slade (2007):
 $Z_{30} = 270, 569, 905, 525, 454, 674, 614$
- ▶ Nathan Clisby's animation of a self-avoiding walk of length $N = 1,048,575$.

Introduction

Length doubling

Implementation

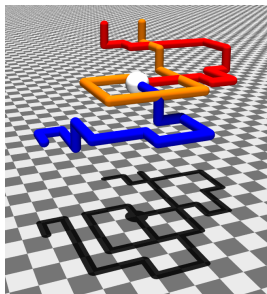
Results

Conclusion



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Three self-avoiding walks of length 18 in 3D



- ▶ Self-avoiding walks of length 18:
red, orange, blue.
- ▶ How many pairs of self-avoiding walks can be glued together to give a self-avoiding walk of length 36?

Introduction

Length doubling

Implementation

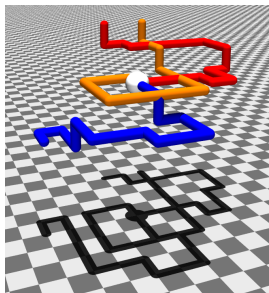
Results

Conclusion



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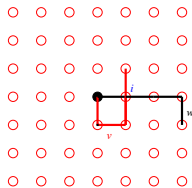
Counting method based on intersection sets



- ▶ Intersections $a = (2, 0, 0)$, $b = (2, 3, 1)$: red/orange.
- ▶ Intersection $c = (0, -2, 0)$: blue/orange.
- ▶ There are 3 pairs of walks v/w with $v \neq w$.
- ▶ There are 3 intersections: remove the corresponding pair.
- ▶ Correct for over-removal: red/orange was removed twice, so $3-3+1 = 1$ pair remains, blue/red.



Counting pairs of walks



- ▶ $A_i =$ set of pairs of self-avoiding walks (v, w) of length N that both pass through lattice point i .
- ▶ The lattice points have been numbered (excluding 0).
- ▶ The set $\bigcup_{i=1}^n A_i$ contains all pairs that intersect.

Introduction

Length doubling

Implementation

Results

Conclusion



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Length doubling

- ▶ There is a **bijection** between:
 - the self-avoiding walks of length $2N$
 - the non-intersecting pairs of walks of length Nbecause we can concatenate two walks.

- ▶ So we have:

$$Z_{2N} = Z_N^2 - \left| \bigcup_i A_i \right|.$$

- ▶ We can compute Z_{2N} **efficiently** by looking only at walks of length N .

Introduction

Length doubling

Implementation

Results

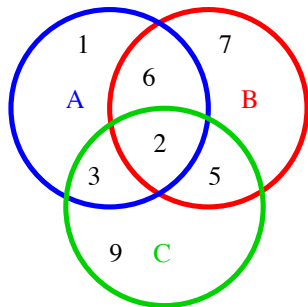
Conclusion



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Principle of inclusion–exclusion

$$\left| \bigcup_{i=1}^n A_i \right| = \sum_i |A_i| - \sum_{i < j} |A_i \cap A_j| + \sum_{i < j < k} |A_i \cap A_j \cap A_k| + \dots \\ \dots + (-1)^{n+1} |A_1 \cap A_2 \cap \dots \cap A_n|,$$



Introduction

Length doubling

Implementation

Results

Conclusion



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Length-doubling formula

- ▶ We obtain

$$Z_{2N} = Z_N^2 + \sum_{S \neq \emptyset} (-1)^{|S|} Z_N^2(S).$$

- ▶ $Z_N(S)$ is the number of self-avoiding walks of length N that pass through a subset S of lattice sites.

Introduction

Length doubling

Implementation

Results

Conclusion



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Computational complexity

- ▶ To compute $Z_N(S)$, we create **all walks** of length N .
- ▶ For each walk, we create **all 2^N subsets** of its N lattice sites and add 1 to their counter in a global data structure.
- ▶ Overall complexity

$$\mathcal{O}(2^N \cdot Z_N) = \mathcal{O}(2^N \mu^N) = \mathcal{O}((2\mu)^N).$$

Much less than $\mathcal{O}(\mu^{2N}) = \mathcal{O}((\mu^2)^N)$, provided $\mu > 2$.

- ▶ 3D cubic lattice: $\mu = 4.68$, for $2N = 36$ savings of factor $(\mu/2)^{18} \approx 4.4 \times 10^6$.

Introduction

Length doubling

Implementation

Results

Conclusion



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Tree data structure

- ▶ Walk $\{1, 7, 12, 49\}$ is stored along a path in the tree, where 1 is a child of the root and 49 is a leaf.
- ▶ The tree is **defoliated**, one layer of nodes with the same site number at a time.
- ▶ A layer s can be **included** so that $s \in S$, or **excluded**.
- ▶ Good site numbering (by increasing distance from 0) gives narrower trees.



Introduction

Length doubling

Implementation

Results

Conclusion



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Exploiting 48-fold symmetry of cubic lattice

- ▶ 8 reflections, such as $(x, y, z) \rightarrow (-x, y, z)$.
- ▶ 6 rotations, such as $(x, y, z) \rightarrow (y, z, x)$.
- ▶ Hence symmetry group of 48 operations.
- ▶ We use this through the **numbering** of the lattice.
- ▶ All ≤ 48 symmetrically equivalent lattice points get site numbers in the same range $[48t, 48t + 47]$.
- ▶ Hence, $s \equiv s' \Leftrightarrow \lfloor s/48 \rfloor = \lfloor s'/48 \rfloor$.

Introduction

Length doubling

Implementation

Results

Conclusion



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Split the computations

- ▶ Split computations for sets S into two:
 1. Sets $S = \{s_1, \dots, s_k\}$ with $s_1 < s_2 < \dots < s_k$, where $s_i \not\equiv s_k$ for all $i < k$.
 2. All other sets, i.e., those with at least one $s_i \equiv s_k$, where $i < k$.
- ▶ Case 1: only one highest site s_k from each equivalence class needs to be handled, **saving a factor of up to 48**.
- ▶ We choose s_k with $48|s_k$: no equivalent $s_i < s_k$ in its walk, so no need to check equivalences.
- ▶ Case 2: **fewer walks**, since walk must pass through at least one other equivalent of the highest site.

Introduction

Length doubling

Implementation

Results

Conclusion



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National supercomputer



- ▶ National supercomputer Huygens named after Christiaan Huygens (1629–1695).
- ▶ Located at SARA in Amsterdam.
- ▶ It has 3456 **cores**, with 2 cores per processor.
- ▶ Each core has a clock speed of 4.7 GHz.

Introduction

Length doubling

Implementation

Results

Conclusion



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Computing time



- ▶ Total computing speed 60 Teraflop/s = 60×10^{12} floating-point operations per second. Total electricity consumption 552 kW (excluding cooling).
- ▶ We used up to 192 cores, during 10 days, in total **50,000 CPU hours** in Oct/Nov 2010.
- ▶ Estimated electricity bill: 5000 euro.

Introduction

Length doubling

Implementation

Results

Conclusion



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Parallelisation

$$Z_{2N} = Z_N^2 + \sum_{S \neq \emptyset} (-1)^{|S|} Z_N^2(S).$$

- ▶ We can split the work by **size** of the set S , computing one correction term for each size $|S|$.
- ▶ We can also split by the **highest site** s_k occurring in a set S .
- ▶ Or a larger **subset** $T \subset S$ that must occur.
- ▶ We used separate jobs, communicating with sockets, thus masquerading as a parallel program (and preventing some I/O as well).
- ▶ Fault tolerance is important, so various checks of results.

Introduction

Length doubling

Implementation

Results

Conclusion



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Number of self-avoiding walks in 3D

N	Z_N	Year	Author
1	6		
2	30		
3	150		
4	726		
5	3 534		
6	16 926	1947	Orr, Univ. Glasgow
7	81 390		
8	387 966		
9	1 853 886	1959	Fisher, Sykes, King's College London
10	8 809 878		
11	41 934 150		
12	198 842 742		
13	943 974 510		
14	4 468 911 678		
15	21 175 146 054		
16	100 121 875 974		
17	473 730 252 102		
18	2 237 723 684 094		

Introduction

Length doubling

Implementation

Results

Conclusion



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Number of self-avoiding walks in 3D

N	Z_N	Year	Author
19	10 576 033 219 614		
20	49 917 327 838 734	1987	Guttmann, Univ. Melbourne
21	235 710 090 502 158	1989	Guttmann
22	1 111 781 983 442 406		
23	5 245 988 215 191 414	1992	MacDonald et al, Nova Scotia
24	24 730 180 885 580 790		
25	116 618 841 700 433 358		
26	549 493 796 867 100 942	2000	MacDonald et al
27	2 589 874 864 863 200 574		
28	12 198 184 788 179 866 902		
29	57 466 913 094 951 837 030		
30	270 569 905 525 454 674 614	2007	Clisby, Liang, Slade, Univ Melbourne
31	1 274 191 064 726 416 905 966		
32	5 997 359 460 809 616 886 494		
33	28 233 744 272 563 685 150 118		
34	132 853 629 626 823 234 210 582		
35	625 248 129 452 557 974 777 990		
36	2 941 370 856 334 701 726 560 670	2011	Schram, Barken Bisseling

Introduction

Length doubling

Implementation

Results

Conclusion



Exact enumeration of self-avoiding walks

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[doi:10.1088/1742-5468/2011/06/P06019](https://doi.org/10.1088/1742-5468/2011/06/P06019)

Abstract. A prototypical problem on which techniques for exact enumeration are tested and compared is the enumeration of self-avoiding walks. Here, we show an advance in the methodology of enumeration, making the process thousands or millions of times faster. This allowed us to enumerate self-avoiding walks on the simple cubic lattice up to a length of 36 steps.

Keywords: loop models and polymers, critical exponents and amplitudes (theory), exact results

Introduction

Length doubling

Implementation

Results

Conclusion



Possible application

- ▶ Biopolymers like DNA, proteins are the **fundamentals** of life.
- ▶ Polymers are of great **industrial importance**: plastics (DSM), synthetic fibres (Akzo).
- ▶ Insight into polymer behaviour:
 - viscosity
 - mean squared distance

$$P_N/Z_N \sim N^{2\nu}.$$

The value $\nu \approx 0.588$ can be computed with the simplest possible lattice model, SAWs on a cubic lattice.

Introduction

Length doubling

Implementation

Results

Conclusion



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Conclusion and outlook

- ▶ Our new enumeration method, **length doubling**, reduces the asymptotic complexity of counting self-avoiding walks from 4.68^N to 3.06^N .
- ▶ We improved the current **world record** from 30 to 36 steps, using symmetry, parallel computing, and a special lattice numbering scheme.
- ▶ Length doubling can be used for all kinds of problems:
 - body-centred cubic lattice
 - 4D hypercubic lattice
 - self-avoiding polygons
- ▶ Software package **Sawdoubler** to be released soon.

Introduction

Length doubling

Implementation

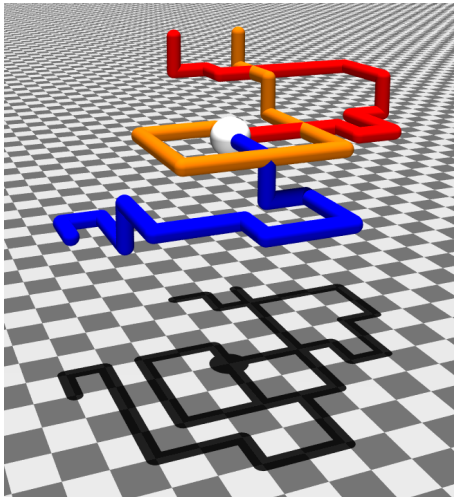
Results

Conclusion



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Thanks



Thank you!

Introduction

Length doubling

Implementation

Results

Conclusion



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