

# Self-avoiding polygons in confined geometries

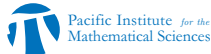
Nicholas Beaton, Jeremy Eng and Chris Soteris

Department of Mathematics and Statistics

University of Saskatchewan, Saskatoon

Retreat for Young Researchers in Stochastics

24 September 2016

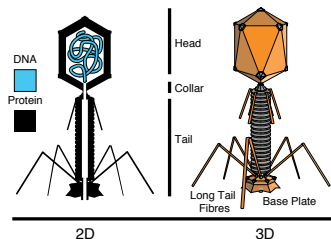


# Outline

- 1 Introduction
- 2 The model: Polygons in lattice tubes
- 3 Large forces
- 4 Hamiltonian polygons
- 5 Random sampling

# Introduction I: Motivation

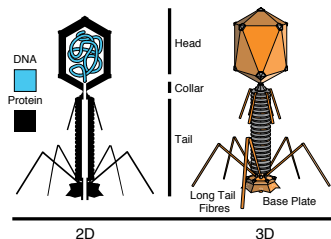
DNA molecules can be packed incredibly tightly in cell nuclei. For example, human DNA can be 2 m long but must fit inside a cell nucleus of diameter 10  $\mu\text{m}$ . Similarly, bacteriophage DNA is packed into a hard capsid until it is injected into the host cell.



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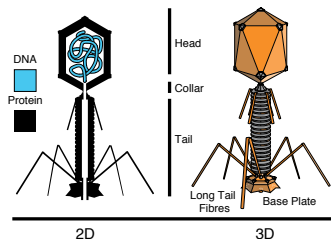


Some DNA molecules (like mitochondrial DNA) have a natural ring structure, while linear DNA can cyclise (the ends stick together) in the nucleus or after being released from confinement.

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Some DNA molecules (like mitochondrial DNA) have a natural ring structure, while linear DNA can cyclise (the ends stick together) in the nucleus or after being released from confinement.

The tight packing within a cell or capsid may result in a high level of tangling, with lots of knots and/or links. Knotting rates of up to 95% have been observed for DNA released from certain bacteriophages.<sup>1</sup>

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Moreover, it has also been observed that the knot types of randomly cyclised DNA from bacteriophages do not appear to be completely randomly distributed.<sup>2</sup> In particular, chiral knots appear more frequently than in random equilateral polygons.

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**Goal:** Investigate the thermodynamic and topological properties of a model of tightly packed polymers which incorporates the excluded volume effect.

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## Theorem (Hammersley 1957)

*The limit*

$$\lim_{n \rightarrow \infty} \frac{1}{n} \log c_n = \kappa$$

*exists and is equal to*  $\inf_{n \geq 0} \frac{1}{n} \log c_n$ .

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## Corollary

$$c_n = e^{o(n)} \mu^n.$$

$\mu$  is known exactly only for 2-dimensional honeycomb lattice. For the square  $\mathbb{Z}^2$  and cubic  $\mathbb{Z}^3$  lattices,

$$\mu_{\mathbb{Z}^2} \approx 2.63815853031$$

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Also interested in the **geometric** properties of SAWs. Various measures of size, e.g. mean squared end-to-end distance, radius of gyration, etc. are believed to obey a power law:

$$\langle d_{\text{end-end}}^2 \rangle_n \sim \text{const.} \times n^{2\nu}$$

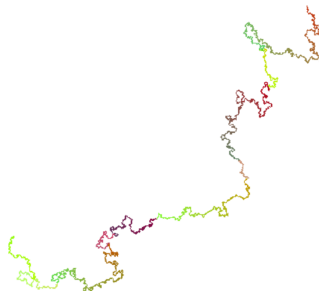
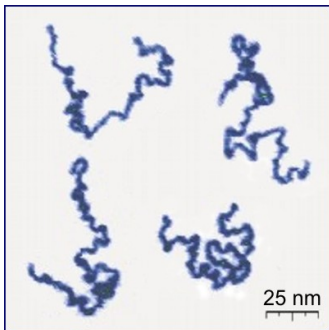
where  $\nu$  depends only on dimension. In 2D, expect  $\nu = 3/4$ , while in 3D  $\nu \approx 0.587597$ .



## Why use SAWs?

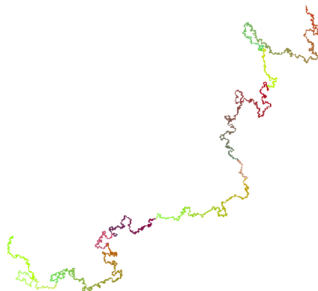
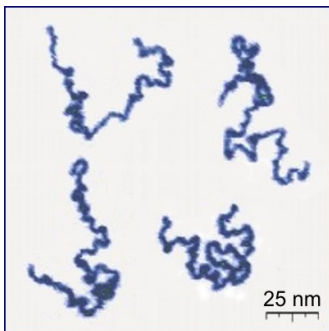
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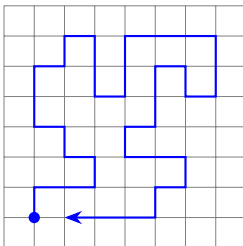
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SAWs incorporate the **excluded volume effect**.

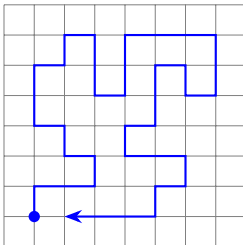


A **self-avoiding polygon** (SAP) is a simple closed loop on the edges of the lattice:



A SAP of  $n$  edges can be associated with a SAW of  $n - 1$  edges by selecting a vertex and a direction. There are  $2n$  ways to do this.

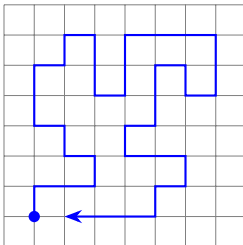
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**Theorem (Hammersley 1961)**

*The limit*

$$\lim_{n \rightarrow \infty} \frac{1}{n} \log p_n$$

*exists and is equal to  $\kappa$ , the connective constant of the lattice, where the limit is taken through even values of  $n$ .*





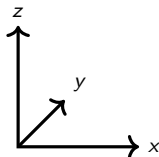
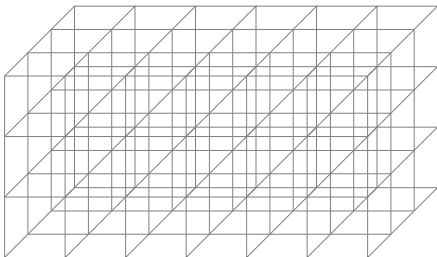


# The model: Polygons in lattice tubes

Let  $\mathbb{T}_{L,M} \equiv \mathbb{T}$  be an  $L \times M$  semi-infinite tube of  $\mathbb{Z}^3$ :

$$\mathbb{T} = \{(x, y, z) : x \geq 0, 0 \leq y \leq L, 0 \leq z \leq M\}.$$

(Assume  $L \geq M$ .)



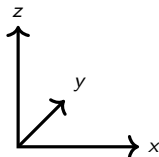
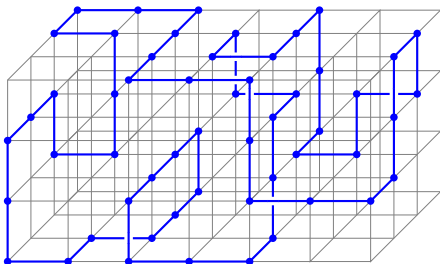
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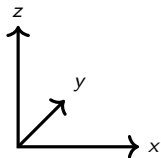
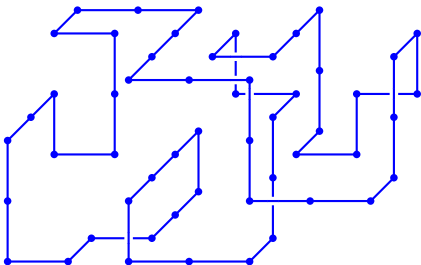
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Let  $p_{\mathbb{T},n}$  be the number of polygons in  $\mathcal{P}_{\mathbb{T}}$  of length  $n$ .

## Theorem (Soteros & Whittington 1989)

*The limit*

$$\kappa_{\mathbb{T}} = \lim_{n \rightarrow \infty} \frac{1}{n} \log p_{\mathbb{T},n}$$

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**Note:** Unlike in  $\mathbb{Z}^2$  or  $\mathbb{Z}^3$ , in general SAWs and SAPs in the tube have different growth rates. We will not consider SAWs in  $\mathbb{T}$ .

# Compressing/pulling force

To examine polygons which are tightly packed in a small space, we introduce a force. If  $\pi$  is a polygon in  $\mathbb{Z}^3$  or  $\mathbb{T}$ , let  $s(\pi)$  be its span in the  $x$ -direction.

To model a force  $f$  acting on polygons, we associate a weight of  $e^{fs(\pi)}$  with each polygon. The **partition function** of polygons of length  $n$  in  $\mathbb{T}$  is then

$$Z_{\mathbb{T},n}(f) = \sum_{\substack{\pi \in \mathbb{T} \\ |\pi|=n}} e^{fs(\pi)} = \sum_s p_{\mathbb{T},n}(s) e^{fs}$$

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## Theorem (Atapour, Soteris & Whittington 2009)

*The free energy*

$$\mathcal{F}_{\mathbb{T}}(f) = \lim_{n \rightarrow \infty} \frac{1}{n} \log Z_{\mathbb{T},n}(f)$$

*exists for all  $f$ . It is a continuous, convex function of  $f$ , and is almost-everywhere differentiable.*



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The expected span of a polygon of length  $n$  at a given  $f$  (under the Boltzmann distribution) is

$$\frac{d}{df} \log Z_{\mathbb{T},n}(f)$$

so that the expected “span density” (span per unit length) in the limit of long polygons is

$$\frac{d}{df} \mathcal{F}_{\mathbb{T}}(f).$$

# Large forces: $f \rightarrow \infty$

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Theorem (NRB, Eng & Soteros 2016)

As  $f \rightarrow \infty$ , the free energy  $\mathcal{F}_{\mathbb{T}}(f)$  is asymptotic to  $f/2$ . That is,

$$\lim_{f \rightarrow \infty} (\mathcal{F}_{\mathbb{T}}(f) - f/2) = 0.$$

**Note:** This result also holds if polygons in  $\mathbb{T}$  are replaced by all polygons in  $\mathbb{Z}^d$ .

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Lower bound is straightforward: the maximum span for a polygon of length  $n$  is  $(n-2)/2$ , and there is always at least one with this span, so

$$Z_{\mathbb{T},n}(f) \geq e^{f(n-2)/2} \quad \Rightarrow \quad F_{\mathbb{T}}(f) \geq f/2.$$

Upper bound (sketch): divide polygons of length  $n$  into  $m$  pieces of size  $r = \lfloor n/m \rfloor$  (maybe with leftover piece of length  $q < r$ ).

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If a polygon has span at least  $t$  then it has at least  $2t$  edges in the  $x$  direction. Pigeonhole principle  $\Rightarrow$  a minimum number of the  $m$  pieces contain only edges in the  $x$  direction. The number of possibilities for the other pieces is bounded above by counting self-avoiding walks.



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Let  $t = \alpha n$ . The  $f \rightarrow \infty$  limit of the free energy is connected (in a non-trivial way) with the limits  $n \rightarrow \infty$ ,  $\alpha \rightarrow 1/2$ . As  $\alpha \rightarrow 1/2$ , the “other” pieces become negligible, and the only contribution to the upper bound is by polygons with (almost) all  $x$ -steps, whose free energy  $\rightarrow f/2$ .

# Large forces: $f \rightarrow -\infty$

Things are more complicated here. First, need new definitions.



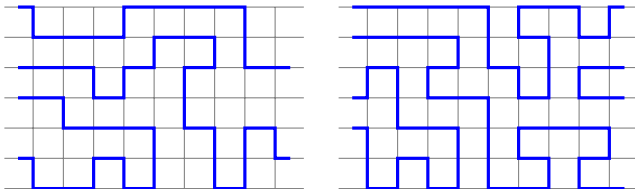




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An  **$s$ -block** of  $\mathbb{T}$  is the section of any polygon between planes  $x = k + 1/2$  and  $x = k + s + 1/2$  for some  $k$  (with at least one vertex in each plane  $x = k + 1, k + 2, \dots, k + s$ ). The **length** is the total number of occupied vertices.



An  $s$ -block is **full** if it has length  $Ws$ , ie. if it occupies every vertex.

Let  $b_{\mathbb{T},s}$  be the number of  $s$ -blocks in  $\mathbb{T}$ , and  $b_{\mathbb{T},s}^F$  the number of full  $s$ -blocks.

## Lemma

The following limits exist and are finite:

$$\beta_{\mathbb{T}} = \lim_{s \rightarrow \infty} \frac{1}{s} \log b_{\mathbb{T},s} \quad \text{and} \quad \beta_{\mathbb{T}}^F = \lim_{s \rightarrow \infty} \frac{1}{s} \log b_{\mathbb{T},s}^F.$$

### Theorem (NRB, Eng & Soteros 2016)

*The free energy  $\mathcal{F}_{\mathbb{T}}(f)$  is asymptotic to  $(f + \beta_{\mathbb{T}}^F)/W$  as  $f \rightarrow -\infty$ , ie.*

$$\lim_{f \rightarrow -\infty} (\mathcal{F}_{\mathbb{T}}(f) - f/W) = \beta_{\mathbb{T}}^F/W.$$

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A lower bound is obtained by showing that any full block can be “completed” into a polygon (by adding edges on the left and right) without changing the length or span too much.



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The upper bound is similar to the  $f \rightarrow \infty$  case, except instead of dividing the polygons up into disjoint **subwalks**, we divide them into disjoint **blocks**. As  $f \rightarrow -\infty$ , the PHP implies that most must be full.

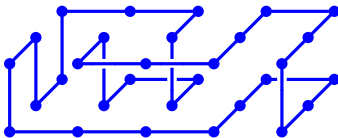
## Why blocks and not polygons?

The  $f \rightarrow -\infty$  asymptote is written in terms of  $\beta_{\mathbb{T}}^{\text{F}}$ , the growth rate for full  $s$ -blocks.  
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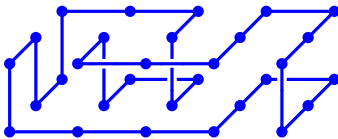
A polygon in  $\mathbb{T}$  is **Hamiltonian** if it has span  $s$  and length  $n = W(s + 1)$ . Equivalently, it occupies every vertex in a  $L \times M \times s$  box of  $\mathbb{Z}^3$ .



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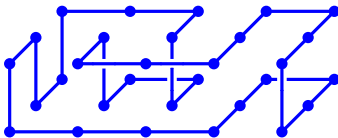


Let  $p_{\mathbb{T},n}^H$  be the number of Hamiltonian polygons in  $\mathbb{T}$  of length  $n$ . Note that  $p_{\mathbb{T},n}^H = 0$  if  $n$  is not a multiple of  $W$ .

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### Theorem (Eng 2014)

*The limit*

$$\kappa_{\mathbb{T}}^H = \lim_{n \rightarrow \infty} \frac{1}{n} \log p_{\mathbb{T},n}^H$$

*(taken through values of  $n$  which are multiples of  $W$ ) exists and is finite.*

Can split a polygon of span  $\lfloor \epsilon n \rfloor$  into a sequence of  $s$ -blocks, take  $\epsilon \rightarrow 1/W$ , and show that most blocks must be full.



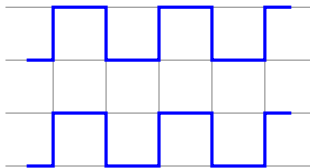






Can split a polygon of span  $\lfloor \epsilon n \rfloor$  into a sequence of  $s$ -blocks, take  $\epsilon \rightarrow 1/W$ , and show that most blocks must be full.

But while every Hamiltonian polygon is comprised of full blocks, many full blocks cannot form part of a Hamiltonian polygon.



Hamiltonian polygons only exist when  $n$  is a multiple of  $W$ . For other  $n$ , there are “minimum span” polygons.

But we don't even know if they have a well-defined growth rate!

### Conjecture

*The growth rates of Hamiltonian polygons and full  $s$ -blocks (counted by length instead of span) are the same, ie.*

$$\kappa_{\text{T}}^{\text{H}} = \frac{\beta_{\text{T}}^{\text{F}}}{W}.$$

Theorem (Soteros 1998; Atapour, Soteros & Whittington 2009)

*For any  $L \times M$  tube  $\mathbb{T}$  with  $L \geq 2$ ,  $M \geq 1$ , and for any finite  $f$ , the probability of a random  $n$ -step polygon in  $\mathbb{T}$  (sampled from the Boltzmann distribution) being knotted approaches 1 as  $n \rightarrow \infty$ .*

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## Knots

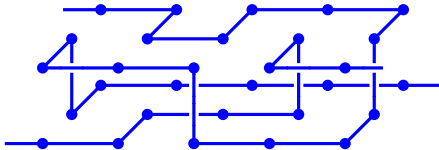
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Like the result in  $\mathbb{Z}^3$ , both proofs use a **pattern theorem**: there are patterns which guarantee knotting, and which are found in all but exponentially few long polygons.



# Transfer matrices

Define a **transfer matrix**  $M_{\mathbb{T}}$  for 1-blocks:  $M_{\mathbb{T}}(i, j) = 1$  iff 1-block  $j$  can follow 1-block  $i$  in a polygon.

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But the transfer matrices **cannot** be used to characterise all knotted or unknotted polygons.

## Random sampling via the transfer matrix

The transfer matrices can be used to generate random polygons of a given span, built up one 1-block at a time. Idea (adapted from [Alm & Janson 1990]):

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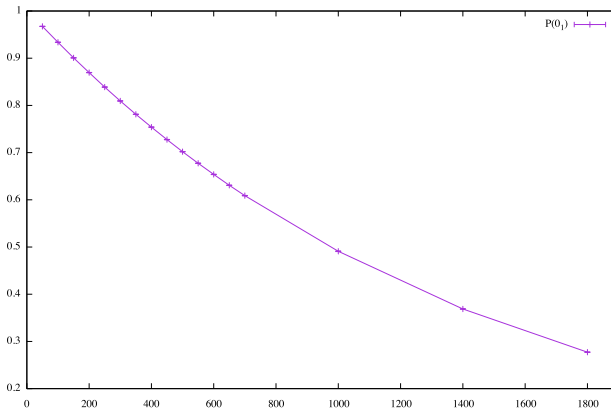
To accommodate this, we **re-weight** each sample by a factor of

$$\frac{N(b_0) \xi_{\mathbb{T}}^{\text{F}}(b_1) N_{\text{end}}(b_{s-1})}{\xi_{\mathbb{T}}^{\text{F}}(b_{s-1})}.$$



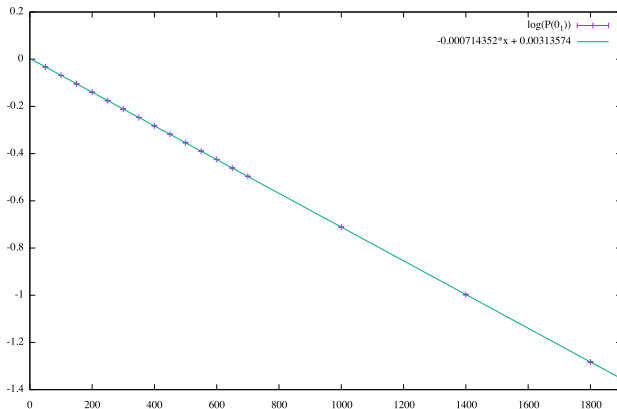
# (Some) results

Probability of unknot ( $0_1$ ) for Hamiltonian polygons in  $3 \times 1$  tube (horizontal axis is span):



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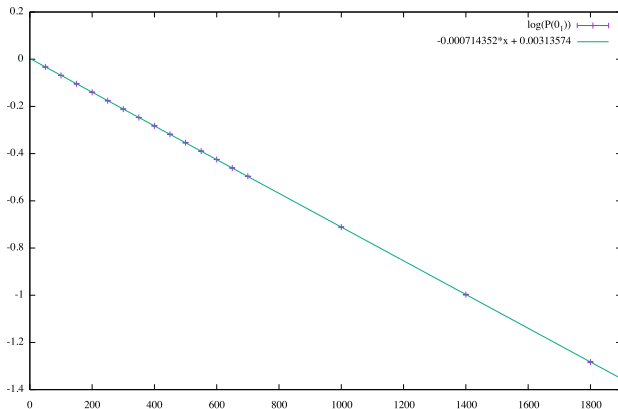


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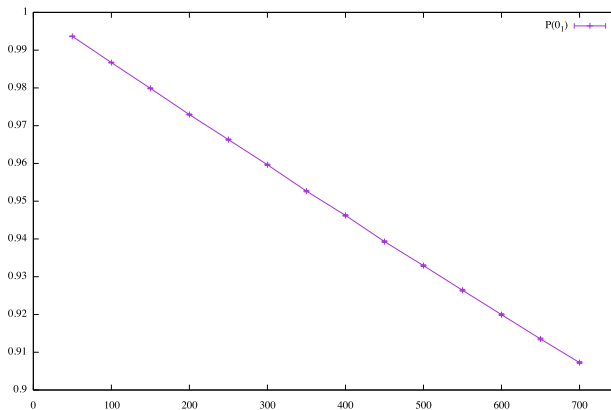


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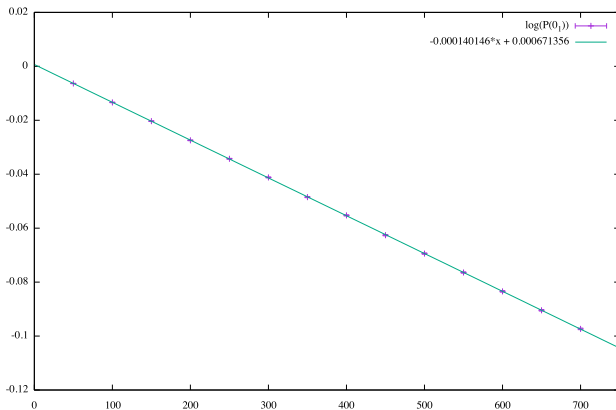
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In  $\mathbb{Z}^3$ , it has been estimated  $P(0_1) \sim \exp(-4.15 \times 10^{-6} n)$ .

Probability of unknot ( $0_1$ ) for all polygons in  $3 \times 1$  tube:



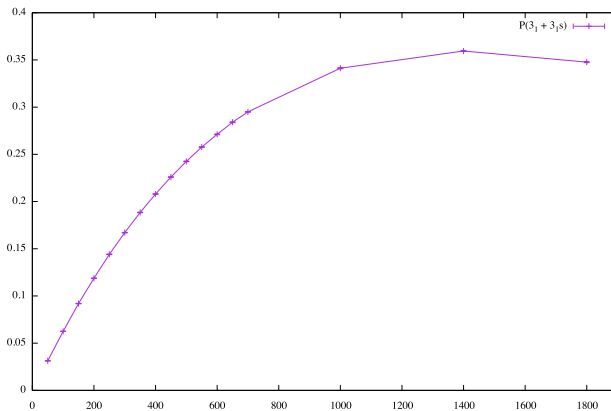
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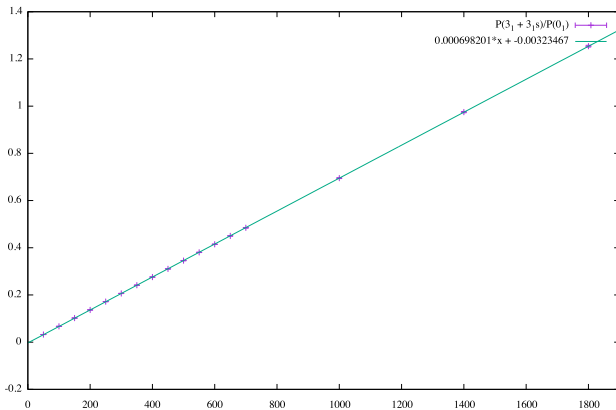
By taking the log, we see that

$$P(0_1) \sim \exp(-1.40 \times 10^{-4} s)$$

Probability of trefoil ( $3_1^\pm$ ) for Hamiltonian polygons in  $3 \times 1$  tube:



Probability of trefoil ( $3_1^\pm$ ) for Hamiltonian polygons in  $3 \times 1$  tube:



By taking  $P(3_1^\pm)/P(0_1)$ , we see that

$$P(3_1^\pm) \sim 6.98 \times 10^{-4} sP(0_1) \sim 8.73 \times 10^{-5} n \exp(-4.15 \times 10^{-6} n).$$

This relationship seems to hold for any prime knot type (with different constants).

Further analysis (in progress) appears to confirm the expectation that if knot type  $K$  is the connected sum of  $k$  prime knots, then

$$P(K) \sim \text{const.} \times n^k P(0_1).$$

Similar results also hold for non-Hamiltonian polygons in  $\mathbb{T}$ . However, the transfer matrix is much bigger, so it is harder to get good estimates from the data.



## Ongoing work

- Determine how knotting probability behaves for larger tube sizes
- The “knotted part” of a polygon in  $\mathbb{T}$  tends to be very small – look at the distribution of its location/size
- Include the force  $f$  in the simulations, and examine how knotting probability etc. changes with force
- Examine writhe, twisting, etc. and how they affect knotting
- In cases where the transfer matrix is too big to be used, develop new method (Markov chain?) for sampling Hamiltonian polygons

[arXiv:1604.07465](https://arxiv.org/abs/1604.07465) – NRB, Jeremy Eng and Chris Soteris, Polygons in restricted geometries subjected to infinite forces. To appear in *Journal of Physics A: Mathematical and Theoretical*.

More work in preparation.

Thank you!