Title: Adventures with Monte Carlo Simulations of the Self-Avoiding Walk

Date: Dec 12, 2012 02:00 PM

URL: http://www.pirsa.org/12120025

Abstract: <span>The Rosenbluth Method is a classical kinetic growth Monte Carlo algorithm for growing a self-avoiding walk by appending steps to its endpoint.

#### This algorithm

can be generalised by the implementation of more general elementary moves (for example, BFACF elementary moves) to realise kinetic growth algorithms for lattice polygons. 

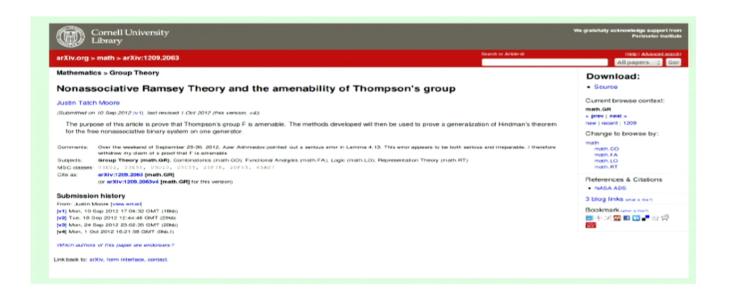
This generalises the counting principle that underlies the Rosenbluth method and the result is a widely applicable class of algorithms which may be used for microcanonical sampling in discrete models. In addition to self-avoiding walks, several applications of kinetic growth and canonical Monte Carlo algorithms will be presented, including the sampling of trivial words in abstract groups, as well as knotted lattice polygons and discrete lattice spin systems such as the Potts model.

This is work was done in collaboration with Andrew Rechnitzer of the Mathematics Department at the University of British Columbia.</span>

Pirsa: 12120025 Page 1/49

# I: Thompson F-group II: The prototype problem III: Polygons

### **Thompson F-group**





E.J. Janse van Rensburg Mathematics and Statistics, York Un

Adventures with MC methods for self-avoiding walks

Pirsa: 12120025 Page 2/49

### **Thompson F-group**

# Some years ago, in 2010: On the website MathOverflow

"Last year [2009] a paper on the ArXiV (Akhmedov) claimed that Thompson's group F is not amenable, while another paper, published in the journal "Infinite dimensional analysis, quantum probability, and related topics" (vol. 12, p173-191) by Shavgulidze claimed the exact opposite, that F is amenable."



Pirsa: 12120025 Page 3/49

### **Thompson F-group**

### On the website MathOverflow

"Last year [2009] a paper on the ArXiV (Akhmedov) claimed that Thompson's group F is not amenable, while another paper, published in the journal "Infinite dimensional analysis, quantum probability, and related topics" (vol. 12, p173-191) by Shavgulidze claimed the exact opposite, that F is amenable."

#### On the other hand...

"I am told ...[Akhmedov's] paper was correct except for a lemma... Shavgulidze's paper(s) was much more readable [than Akhmedov's]. It has "Lemma 5" whose proof was found wrong by Matt Brin.... There are very nice notes of Matt Brin's seminar on Shavgulidze's proof." [Justin Moore]

200

E.J. Janse van Rensburg Mathematics and Statistics, York Un

Adventures with MC methods for self-avoiding walks

Pirsa: 12120025 Page 4/49

# I: Thompson F-group II: The prototype problem III: Polygons

### **Thompson F-group**

Finitely presented group G on m generators  $T = \{a, b, \dots, z\}$ .

Example: Abelian group on 2 generators

$$T = \{a, b\}$$
$$G = \langle a, b | [a, b] \rangle$$

A word w is trivial if  $w \equiv e$ 



Pirsa: 12120025 Page 5/49

# I: Thompson F-group II: The prototype problem III: Polygons

### **Thompson F-group**

Finitely presented group G on m generators  $T = \{a, b, \dots, z\}$ .

### Example: Abelian group on 2 generators

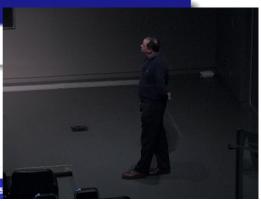
$$T = \{a, b\}$$

$$G = \langle a, b | [a, b] \rangle$$

 $S_n = \{ \text{Set of freely reduced trivial words of length } n \}$ 

# Theorem (Grigorchuk-Cohen)

cogrowth(G) = 2m - 1 if and only if G is amenable.



. Janse van Rensburg Mathematics and Statistics, York Un

Adventures with MC methods

Pirsa: 12120025 Page 6/49

### **Thompson F-group**

Finitely presented group G on m generators  $T = \{a, b, \dots, z\}$ .

### Example: Abelian group on 2 generators

$$T = \{a, b\}$$

$$G = \langle a, b | [a, b] \rangle$$

 $S_n = \{ \text{Set of freely reduced trivial words of length } n \}$ 

# Theorem (Grigorchuk-Cohen)

cogrowth(G) = 2m - 1 if and only if G is amenable.

If G is amenable:

$$|S_n| = (2m-1)^{n+o(n)}$$

Determine the growth rate of  $|S_n|$ .



### **Thompson F-group**

Thompson's group F on m generators  $S = \{a, b, c, d, f, \ldots\}$ .

### F-group on 2 generators

$$F = \langle a, b | [ab^{-1}, a^{-1}ba], [ab^{-1}, a^{-2}ba^{2}] \rangle$$

### F-group on 4 generators

$$F = \langle a, b, c, d | a^{-1}bac^{-1}, a^{-1}cad^{-1}, [ab^{-1}, c], [ab^{-1}, d] \rangle$$

# F-group on 5 generators

$$F = \langle a, b, c, d, f | a^{-1}bac^{-1}, a^{-1}cad^{-1}, ab^{-1} = f, [f, c], [f, d] \rangle$$

Trivial words are classes of lattice paths or polygons



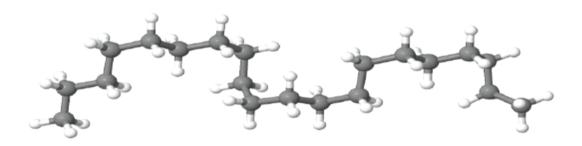
E.J. Janse van Rensburg Wathematics and Statistics, York Un

Adventures with MC methods for self-avoiding walks

Pirsa: 12120025

# **Basic Problem: Polymer Entropy**

Conformations of a Polymer Molecule:

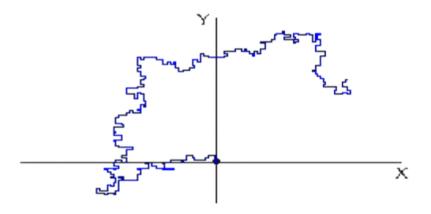


- Jmol
- Problem: Determine the Conformational Entropy
- Models: Self-avoiding walks and polygons

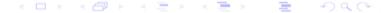


### **Polymer Physics**

# Polymer conformations – the self-avoiding walk

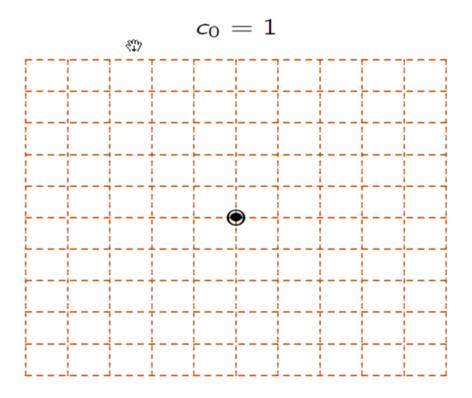


 $c_n = \# \{ Self-avoiding walks of length n \}$ 



E.J. Janse van Rensburg Mathematics and Statistics, York Un

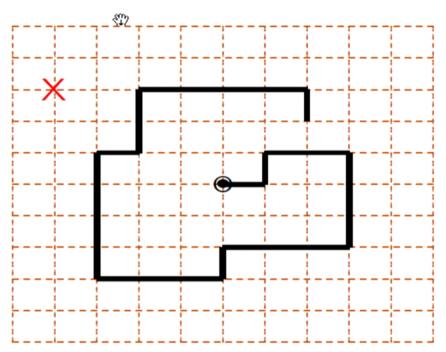
# The prototype problem: Self-avoiding walk



E.J. Janse van Rensburg Mathematics and Statistics, York Uni

# The prototype problem

Non-Markovian.

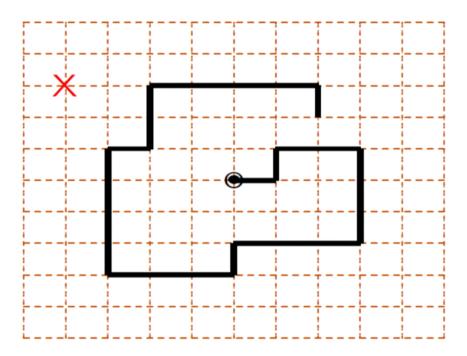




E.J. Janse van Rensburg Mathematics and Statistics, York Un

# The prototype problem

Non-Markovian.





E.J. Janse van Rensburg Mathematics and Statistics, York Un

### **Self-Avoiding Walk**

# The most basic question

- What is  $c_n$ ?
- $c_{71} = 4190893020903935054619120005916$ . (Jensen 2004)
- Moore's law and better algorithms will give more terms...
- ...but CPU time grows exponentially



E.J. Janse van Rensburg Mathematics and Statistics, York Uni

### **Self-Avoiding Walk**

# The most basic question

- What is  $c_n$ ?
- $c_{71} = 4190893020903935054619120005916$ . (Jensen 2004)
- Moore's law and better algorithms will give more terms...
- ...but CPU time grows exponentially
- Approximate Estimates?
- Monte Carlo sampling of walks?



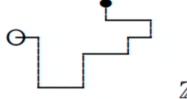
Adventures with MC methods for self-avoiding walks

E.J. Janse van Rensburg Mathematics and Statistics, York Un

### The prototype problem

# Submultiplicativity of self-avoiding walks

c<sub>n</sub> choices



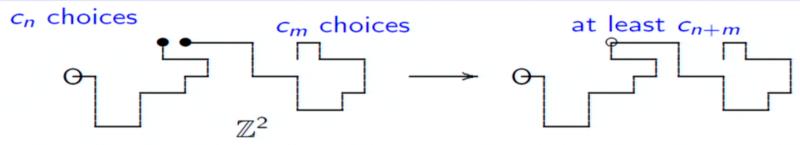
 $\mathbb{Z}^2$ 

200

E.J. Janse van Rensburg Mathematics and Statistics, York Un

### The prototype problem

# Submultiplicativity of self-avoiding walks



- $c_n c_m \geq c_{n+m}$
- The Growth Constant:  $\lim_{n\to\infty} c_n^{1/n} = \mu \Rightarrow c_n = \mu^{n+o(n)}$
- Scaling arguments (Entropic Exponent:  $\gamma \ (=\frac{43}{32} \text{ in } 2\text{-d}))$

$$c_n \simeq C n^{\gamma-1} \mu^n$$

•  $\mu \approx 2.6$  (2 dimensions)

Adventures with MC methods for self-avoiding walks

Pirsa: 12120025

### **MC Algorithms**

# Monte Carlo Sampling:

- Elementary moves
- A rule for implementing elementary moves (eg the Metropolis algorithm)



### **Monte Carlo and Polymers**

# Marshall and Arianna Rosenbluth

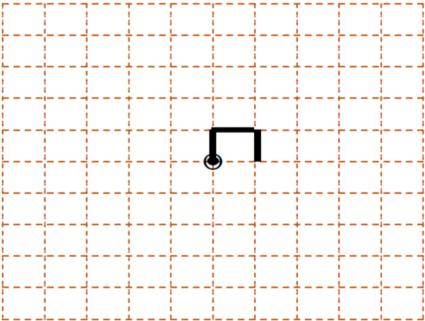


- Recruited by Edward Teller to work at Los Alamos
- Expert in Scattering, Plasma Physics, H-bomb development
- Metropolis Algorithm
- Hammersley and Morton: A static algorithm for walks



E.J. Janse van Kensburg Mathematics and Statistics, York Un

$$P_3 = \frac{1}{12} \times \frac{1}{3} = \frac{1}{36}$$



- Create walks by stepping from the origin
- Each step is chosen uniformly from those available
- Assign a weight to each walk  $\omega$ :

$$W(\omega) = \frac{1}{P(\omega)}$$



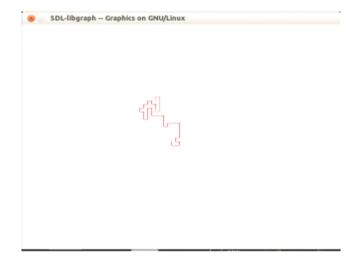
- Create walks by stepping from the origin
- Each step is chosen uniformly from those available
- Assign a weight to each walk  $\omega$ :

$$W(\omega) = \frac{1}{P(\omega)}$$

- If the walk is trapped, assign weight zero and start over
- Average weight at length n [Rosenbluth Counting theorem]:

$$\langle W \rangle_n = \sum_{|\omega|=n} P(\omega) W(\omega) = \sum_{|\omega|=n} \mathbf{1} = c_n.$$





Adventures with MC methods for self-avoiding walks

Pirsa: 12120025 Page 23/49

# Rosenbluth Algorithm

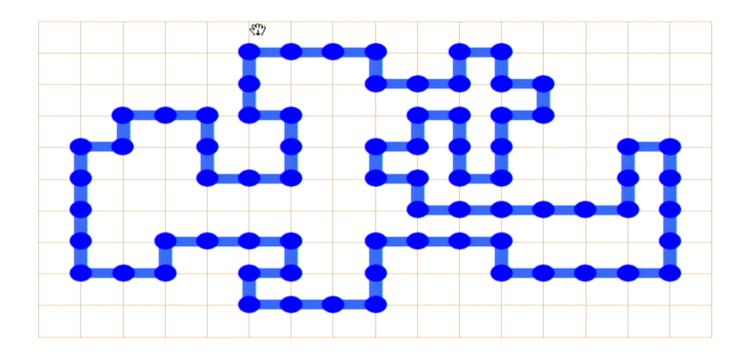
# Knotted Polygons of Minimal Length

		70	
n	$c_n$	$\langle W_n \rangle$	Completed Walks
1	4	4	100%
2	12	12	100%
3	36	36	100%
4	100	100.0	100%
5	284	284.0	100%
6	780	780.2	100%
7	2172	2172.9	100%
8	5916	5918.5	99.7%
9	16268	16276.8	99.5%
10	44100	44123.1	99.0%



E.J. Janse van Rensburg Mathematics and Statistics, York Ur

# **Lattice Polygons**

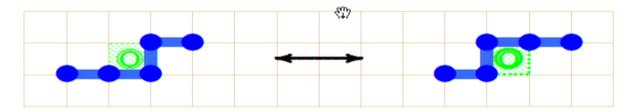


→ □ > → □ > → = > → = > 
●

E.J. Janse van Rensburg Mathematics and Statistics, York Un

### **BFACF** elementary moves

### Neutral BFACF moves



# Positive/Negative BFACF moves



Berg-Foester 1981 and Aragaõ de Carvalho-Caracciolo-Fröhlich 1983



### **BFACF** elementary moves

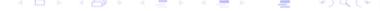
### Neutral BFACF moves



# Positive/Negative BFACF moves



Berg-Foester 1981 and Aragaõ de Carvalho-Caracciolo-Fröhlich 1983



E.J. Janse van Kensburg Mathematics and Statistics, York Un

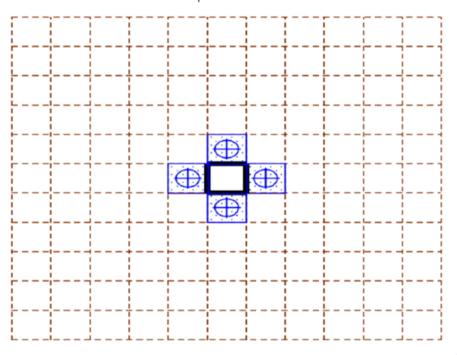
Adventures with MC methods for self-avoiding walks

Pirsa: 12120025

# **GARM** for Polygons

P = 1 (Choose one of 4 moves)

$$a_{+} = 4$$

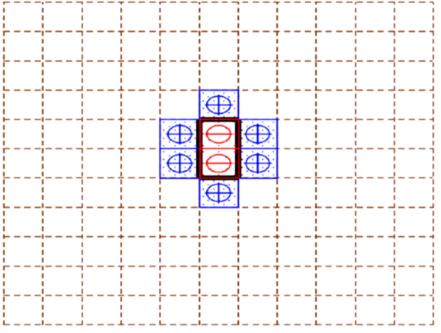


E.J. Janse van Rensburg Mathematics and Statistics, York Ur

# **GARM** for Polygons

$$P = \frac{1}{4} = \frac{1}{a_+}$$

$$a_{+} = 6, a_{-} = 2$$

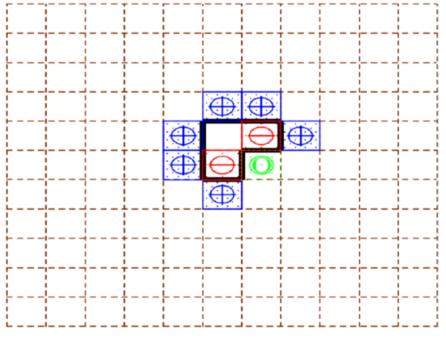




### **GARM** for Polygons

$$P = \frac{1}{4} \times \frac{1}{6}$$

$$a_{+} = 6, a_{-} = 2, a_{0} = 1$$





### **BFACF** elementary moves

BFACF elementary moves for self-avoiding lattice polygons:

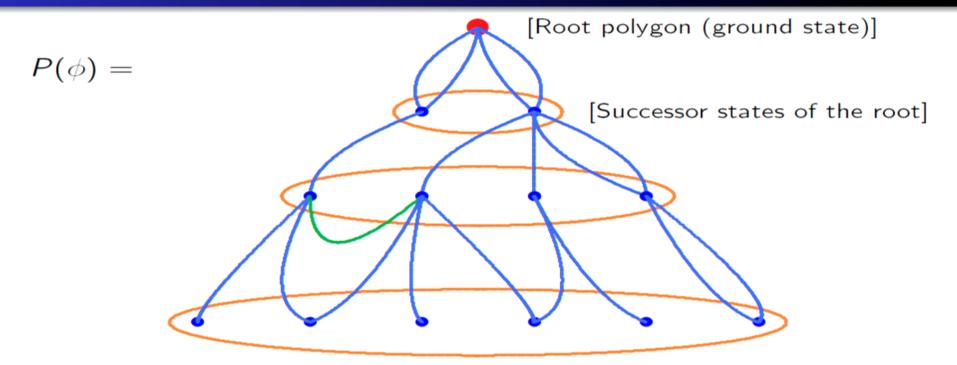
- Irreducible in the square lattice
- Not irreducible in the cubic lattice

# Theorem (JvR and Whittington 1991)

The irreducibility classes of the BFACF moves for unrooted polygons in the cubic lattice coincide with the knot types of the polygons as closed simple curves in  $\mathbb{R}^3$ .



### **GARM**





E.J. Janse van Rensburg Mathematics and Statistics, York Univ

### **GARM Sampling**

• The average weight of sequences ending in  $\phi_\ell = \tau$  is

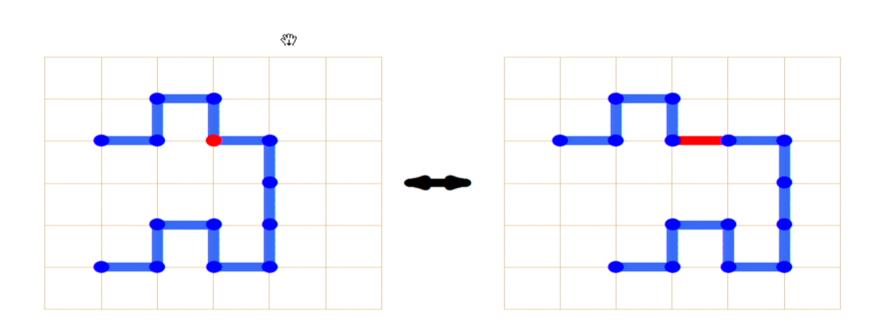
$$\langle W_{\tau} \rangle = \sum_{\phi \to \tau} W(\phi) P(\phi | \phi_0) = \sum_{\phi \to \tau} \prod_{i=0}^{|\phi|-1} \frac{1}{a_{-}(\phi_{i+1}) + a_0(\phi_{i+1})}.$$

• Time reverse the above. Start in state  $\tau$  and end in state  $\phi_0$ .

I: Thompson F-group
II: The prototype problem
III: Polygons

BFACF and GARM Spin Systems and Knotted Polygons Thompson's Group F

# **GARM Sampling of Self-avoiding Walks**



E.J. Janse van Rensburg Mathematics and Statistics, York Un

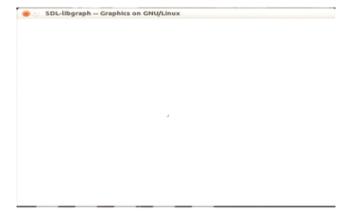
Adventures with MC methods for self-avoiding walks

Pirsa: 12120025 Page 34/49

I: Thompson F-group
II: The prototype problem
III: Polygons

BFACF and GARM
Spin Systems and Knotted Polygons
Thompson's Group F

# **GARM Sampling of Self-avoiding Walks**



Adventures with MC methods for self-avoiding walks

Pirsa: 12120025

### $2 \times 2$ Ising Model

Microcanonical sampling of spin states: GARM

$$a_{+} = 4$$
  
 $a_{-} = 0$ 

$$a_{+} = 3$$
 $a_{-} = 1$ 

$$a_{+} = 2$$

$$a_{+} = 2$$
  $a_{+} = 1$   
 $a_{-} = 2$   $a_{-} = 3$ 

$$a_{+} = 0$$
  
 $a_{-} = 4$ 

$$\sigma: \begin{bmatrix} 0 & 0 \\ 0 & 0 \end{bmatrix} \longrightarrow$$

$$\begin{bmatrix} 0 & 0 \\ 1 & 0 \end{bmatrix} \rightarrow$$

$$\begin{bmatrix} 0 & 0 \\ 1 & 1 \end{bmatrix} \longrightarrow$$

$$E = 2$$

$$\begin{bmatrix} 1 & 0 \\ 1 & 1 \end{bmatrix} \rightarrow$$

$$\begin{bmatrix} 1 & 1 \\ 1 & 1 \end{bmatrix}$$

## $2 \times 2$ Ising Model

Microcanonical sampling of spin states: GARM

$$a_{+} = 4$$

$$a_{-} = 0$$

$$a_{-} = 1$$

$$a_{+} = 2$$

$$a_{-} = 3$$

$$a_{-} = 3$$

$$a_{-} = 4$$

$$\sigma: \begin{bmatrix} 0 & 0 \\ 0 & 0 \end{bmatrix} \longrightarrow \begin{bmatrix} 0 & 0 \\ 1 & 0 \end{bmatrix} \longrightarrow \begin{bmatrix} 0 & 0 \\ 1 & 1 \end{bmatrix} \longrightarrow \begin{bmatrix} 1 & 1 \\ 1 & 1 \end{bmatrix}$$

$$E = 0$$

$$E = 2$$

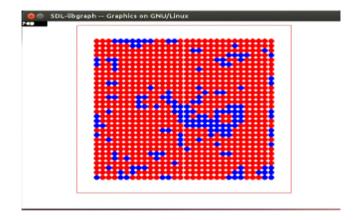
$$E = 2$$

$$E = 2$$

$$E = 0$$

E.J. Janse van Rensburg Mathematics and Statistics, York Uni

# GARM Sampling of the Ising model

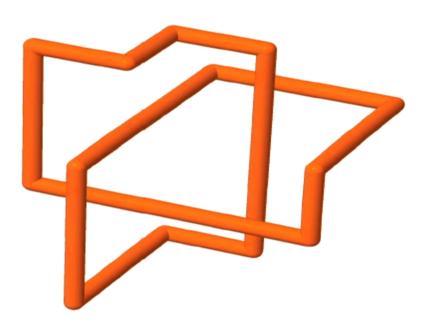




Adventures with MC methods for self-avoiding walks

Pirsa: 12120025 Page 38/49

# **Knotted Polygons**



Minimal conformation is not unique.



E.J. Janse van Kensburg Mathematics and Statistics, York Uni

## **GAS Sampling of Lattice Polygons**

- Generalise GARM sampling by including negative moves
- $\phi = \langle \phi_0, \phi_1, \phi_2, \dots, \phi_k \rangle$  with  $\ell_j = |\phi_j|$
- ullet Introduce a set of parameters  $eta_j$  along a sequence  $\phi$

Pr[Pos. move] = 
$$\frac{\beta_{\ell_j} a_{+}(\phi_j)}{a_{-}(\phi_j) + a_{0}(\phi_j) + \beta_{\ell_j} a_{+}(\phi_j)}$$



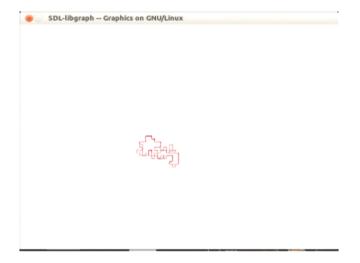
## **GAS Sampling of Lattice Polygons**

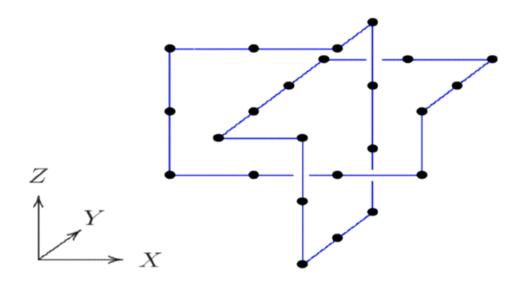
Assign a weight to each sequence  $\phi$ :

$$W(\phi) = \left[ \frac{a_{-}(\phi_{0}) + a_{0}(\phi_{0}) + \beta_{\ell_{0}} a_{+}(\phi_{0})}{a_{-}(\phi_{L}) + a_{0}(\phi_{L}) + \beta_{\ell_{L}} a_{+}(\phi_{L})} \right] \prod_{j=0}^{|\phi|-1} \beta_{\ell_{j}}^{\sigma(\phi_{j},\phi_{j+1})}$$



# **GAS Sampling of Polygons**





Knot type: Trefoil  $(3_1)$  $p_n(3_1) = \#\{\text{Cubic lattice polygons of knot type } 3_1 \text{ and length } n\}$ 



E.J. Janse van Rensburg Mathematics and Statistics, York Uni

 $p_n(K) = \#\{\text{Lattice polygons of knot type } K \text{ and length } n\}$ 

Scaling arguments:

$$p_n(K) \simeq A_K n^{2-\alpha+N_K} \mu_0^n$$

where  $N_K =$  Number of prime components in K



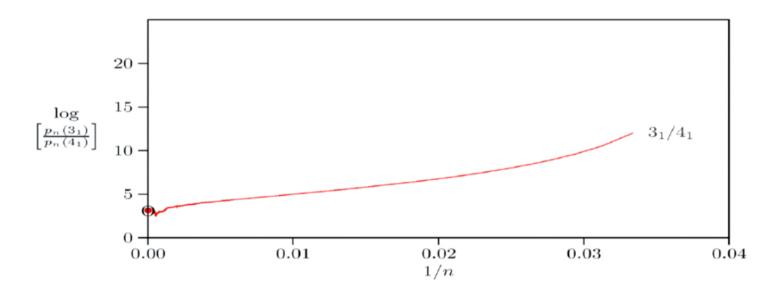
 $p_n(K) = \#\{\text{Lattice polygons of knot type } K \text{ and length } n\}$ 

Scaling arguments:

$$p_n(K) \simeq A_K n^{2-\alpha+N_K} \mu_0^n$$

where  $N_K =$  Number of prime components in K





Asymptotically, about 22-27 trefoils for every figure eight knot. Similar values on the fcc and bcc lattice.

Universal? [See also Baiesi + Orlandini 2012]

- 4 ロ ト 4 昼 ト 4 毫 ト - 夏 - りへの

## Thompson's group F

Elementary moves in analogy with BFACF elementary moves.

Conjugation: With a generator g:

$$ba^{-1}a^{-1}b^{-1}aab^{-1}a^{-1}ba \to \mathbf{g} \ ba^{-1}a^{-1}b^{-1}aab^{-1}a^{-1}ba \mathbf{g}^{-1}.$$



## Thompson's group F

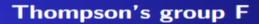
Conjugation and Left-insertions are uniquely reversible and irreducible on the state  $\mathfrak{P}$ ace of freely reduced trivial words S.

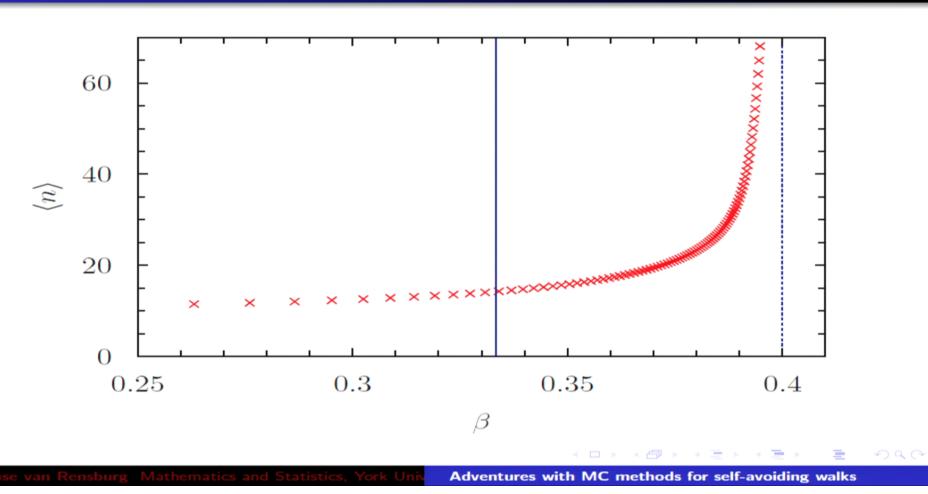
Metropolis-style sampling from a Boltzmann distribution on S.





BFACF and GARM Spin Systems and Knotted Polygons Thompson's Group F





Pirsa: 12120025