

# Exploring Random-Graph Ensembles with Worms

Wolfhard Janke

Computational Quantum Field Theory  
Institut für Theoretische Physik  
Universität Leipzig, Germany

NORDITA Workshop *Random Graphs and Networks*  
NORDITA, Stockholm, 01 November 2010



# Outline

1 Motivation

2 Theory

3 Worm update

4 Numerical tests

5 Results

6 Summary



# Outline

1 Motivation

2 Theory

3 Worm update

4 Numerical tests

5 Results

6 Summary

# Outline

- 1 Motivation
- 2 Theory
- 3 Worm update
- 4 Numerical tests
- 5 Results
- 6 Summary

# Outline

- 1 Motivation
- 2 Theory
- 3 Worm update
- 4 Numerical tests
- 5 Results
- 6 Summary



# Outline

- 1 Motivation
- 2 Theory
- 3 Worm update
- 4 Numerical tests
- 5 Results
- 6 Summary

# Outline

- 1 Motivation
- 2 Theory
- 3 Worm update
- 4 Numerical tests
- 5 Results
- 6 Summary

# Motivation

- Geometrical picture of phase transitions and critical phenomena in terms of clusters or boundaries of clusters  
= loops in 2d

WJ & A.M.J. Schakel, Nucl. Phys. B **700** (2004) 385; Phys. Rev. E **71** (2005) 036703;  
Phys. Rev. Lett. **95** (2005) 135702



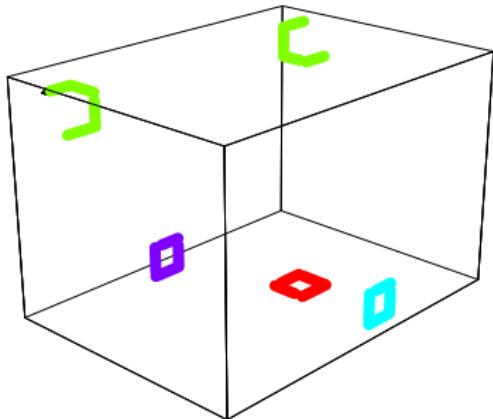
$100 \times 100$  Ising model: black = spin “up”, white = spin “down”



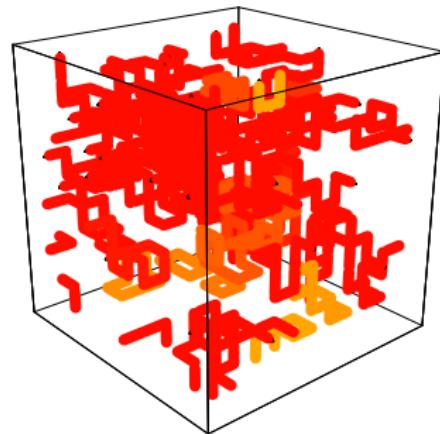
CRITICAL

$$T = 1.02 T_c$$

## Vortex loops in 3D $|\phi|^4$ theory



$$T < T_c$$



$$T > T_c$$

F. Winter, WJ, A.M.J. Schakel, Phys. Rev. E 77 (2008) 061108

# Motivation

- Geometrical picture of phase transitions and critical phenomena in terms of clusters or boundaries of clusters  
= loops in 2d
- Or vice versa, e.g., polymer or surface properties in terms of field theories or spin models
- At criticality, thermodynamic critical exponents can be related to the fractal dimension of the geometrical objects
- Worm update: Combines naturally loops (= energetic sector) and (open) chains (= magnetic sector)



# Theory I: Basic scaling properties of loop gases

Distribution of line length  $n$ , similar to percolation:

$$\ell_n \sim n^{-d/D-1} e^{-\theta n}, \quad \theta \propto (K - K_c)^{1/\sigma}.$$

**Given:** Tuning parameter  $K$  and dimension  $d$  (here  $d = 2$ )

**Measured:** Fractal dimension  $D$  and exponent  $\sigma$ , governing approach to criticality at  $K_c$

**At criticality:** Radius of gyration  $R_g$ , end-to-end distance  $R_e$  (for open chains):

$$\langle R_g^2 \rangle \propto \langle R_e^2 \rangle \sim n^{2/D}$$



Fractal dimension  $D$  for 2d models:

$$D = 1 + 1/2\bar{\kappa}$$

(SLE classification, Coulomb gas, conformal field theory)

2d Ising:  $\bar{\kappa} = 4/3 \longrightarrow D = 11/8 = 1.375$

Parameter  $\sigma$ :

$$\sigma = \frac{1}{\nu D}$$

2d Ising:  $\nu = 1 \longrightarrow \sigma = 8/11 = 0.727272\dots$



## Theory II: High-temperature expansion of the Ising model

- Leads automatically to a loop gas with fugacity parameter  $K = \tanh \beta$  (in arbitrary  $d$ )
- Contains in general intersection points (“knots”)
- Pure loop gas on **2d honeycomb lattice** with coordination number  $z = 3$  as used here:

$$Z_{\text{loop}} = \sum_{\mathcal{G}} K^b N^l$$

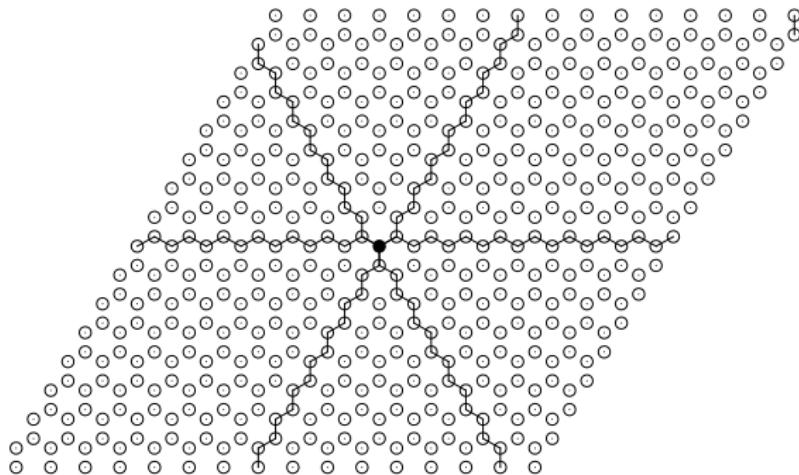
$b$ : number of occupied bonds,  $l$ : number of loops,  
 $N$ : number of loop colors for  $O(N)$  model ( $N = 1$  for Ising)

- Critical parameter:

$$K_c = \left[ 2 + (2 - N)^{1/2} \right]^{-1/2} = 1/\sqrt{3} \quad (N = 1)$$



## Compact honeycomb lattice with periodicity in three directions



C Q T

# Monte Carlo Simulations: Worm update

## Qualitative description:

- Move one end of (open) chain through background of loops
- Connects loop and chain sector by reopening existing loops or creating new ones by self-closing or a “back bite”, leaving a loop behind

## Quantitative update prescription ( $R_e > 1$ ):

- choose randomly either endpoint of the chain
- choose randomly any of the links attached
- update  $b_I \longrightarrow b'_I = 1 - b_I$  with acceptance probability

$$P_{\text{accept}} = \min \left( 1, K^{1-2b_I} \right)$$

(in effect:  $P_{\text{accept}} = K < 1$  for bond creation, and bond deletion always accepted)

If  $R_e = 1$ , mixed loop/chain configuration can be turned into a pure loop gas – possible **switch between magnetic and energetic sector**:

We always attempt to close the chain and, if accepted, proceed by randomly choosing a new link among all links of the lattice. The bond variable on that link is accepted/rejected as usual.

Slightly different from Prokof'ev/Svistunov's original proposal [PRL 87 (2001) 160601], but close to Wolff's version [NPB 810 (2009) 491].



## Numerical tests

Critical slowing down greatly reduced.

Correlation function  $G(x_1, x_i)$ : Comparison with exact enumeration on a  $5 \times 5$  square lattice with periodic boundary conditions:

- Overall agreement better than 0.01%
- For example, on-axis distance 2 and 3:  
 $0.708\,385(23), 0.708\,342(38)$  vs  $0.708\,394\dots$   
 $0.999\,987(33), 0.999\,927(54) = G/G_{\text{exact}}$



# Exploiting duality

honeycomb lattice  $\longleftrightarrow$  **duality**  $\longrightarrow$  triangular (hexagonal) lattice

$$K = \tanh \beta = e^{-2\tilde{\beta}}$$

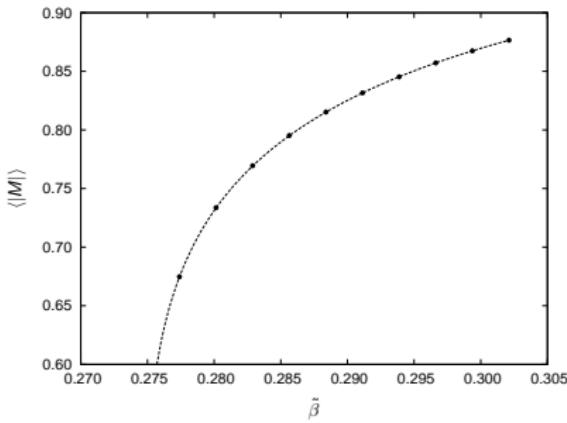
$\beta$  on honeycomb lattice ( $K_c = 1/\sqrt{3}$ )

$\tilde{\beta}$  on triangular (hexagonal) lattice ( $\tilde{\beta}_c = \frac{1}{4} \ln 3$ )

high temperature  $T \longleftrightarrow$  **duality**  $\longrightarrow$  low temperature  $\tilde{T}$



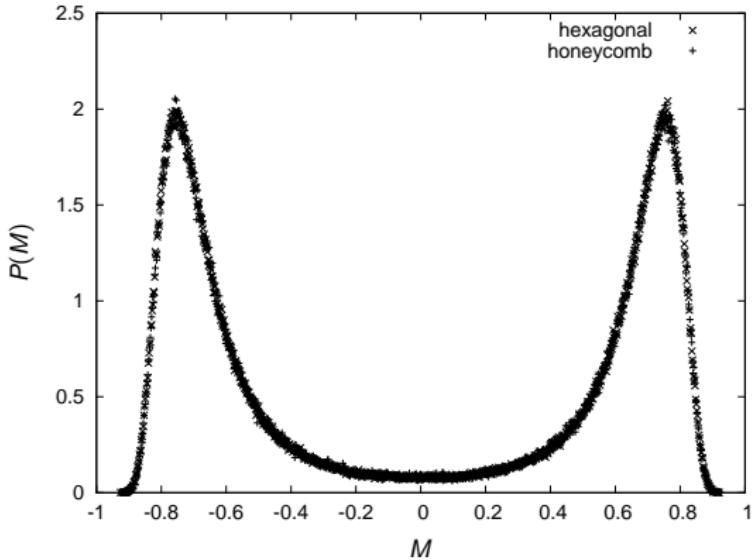
Magnetization on triangular lattice as function of inverse temperature  $\tilde{\beta}$  ("cold") from worm update on dual honeycomb lattice at  $K = \tanh \beta$  ("hot"):



Dashed line: Exact result due to Potts,  $M(\tilde{\beta}) = \left\{ 1 - 16 \exp(-12\tilde{\beta}) / [1 + 3 \exp(-4\tilde{\beta})][1 - \exp(-4\tilde{\beta})]^3 \right\}^{1/8}$

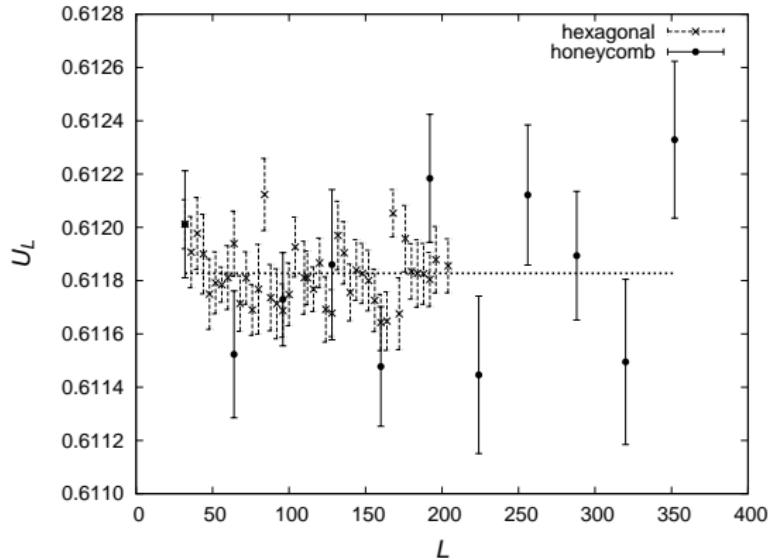


## Magnetization distribution at criticality for $L = 32$



“hexagonal”: Swendsen-Wang cluster update  
“honeycomb”: worms + duality

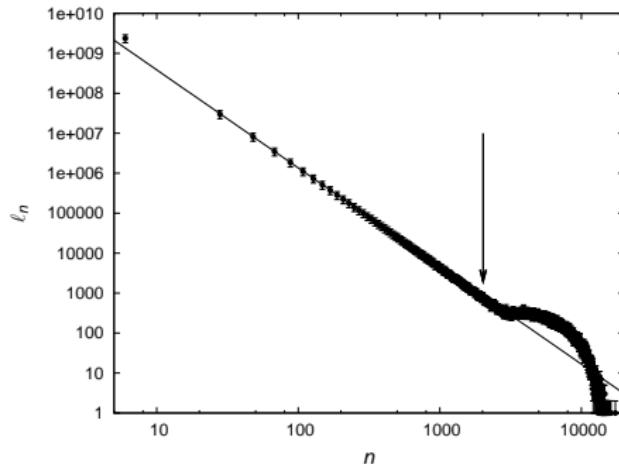
Finite-size scaling of **Binder parameter**  $U_L = 1 - \frac{\langle M^4 \rangle}{3\langle M^2 \rangle^2}$  at criticality



“hexagonal”: Swendsen-Wang cluster update  
“honeycomb”: worms + duality

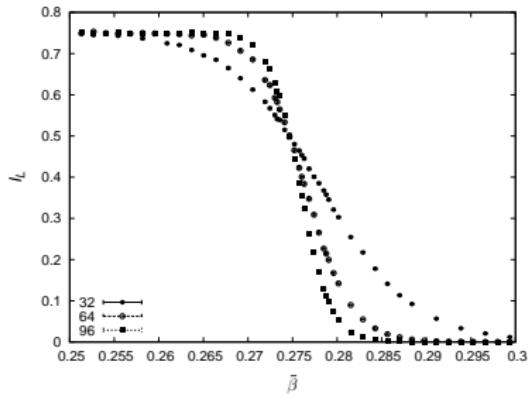
# Results

Loop distribution  $\ell_n$  at criticality as function of loop length  $n$

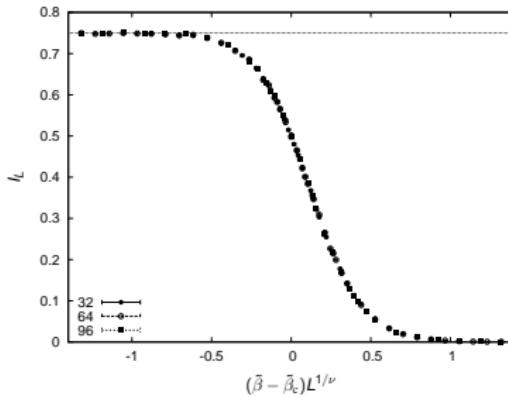


Honeycomb lattice with  $L = 352$ ; straight line:  $\ell_n \propto n^{-2/D-1}$  with  $D = 11/8$  (bump for  $n > 2000$ : winding loops).

**Binary variable:** 0 – even winding numbers (unique magnetization transcription); 1 – odd winding numbers.  
 Average  $I_L(\tilde{\beta})$  ( $L = 32, 64, 96$ ):



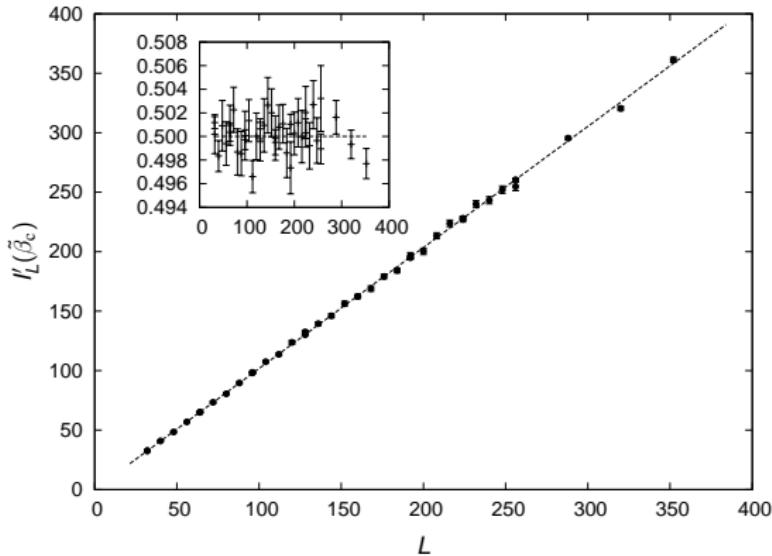
$$I_L(\tilde{\beta}_c) = 0.50024(21)$$



$\nu = 1$ , straight line at  $3/4$   
 # “odd”/# “even” configs



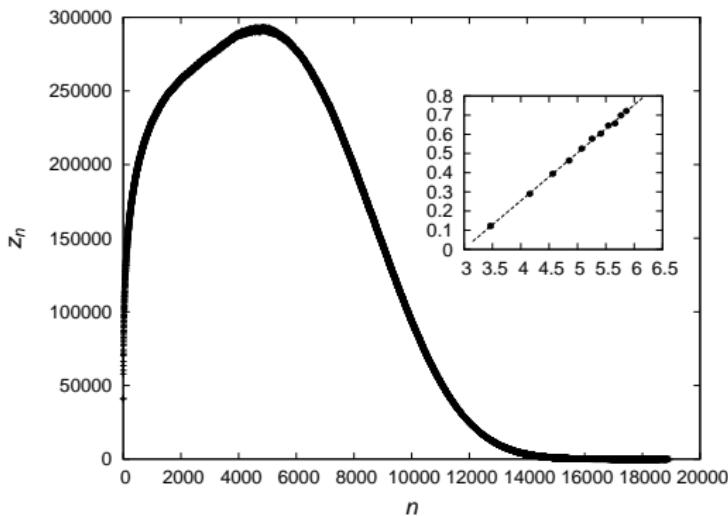
## Derivative of $I_L(\tilde{\beta})$ at criticality



2-parameter fit:  $1/\nu = 1.0001(15)$  ( $\chi^2/\text{dof} = 1.01$ )  
Inset:  $I_L(\tilde{\beta}_c) = 0.50024(21)$ .

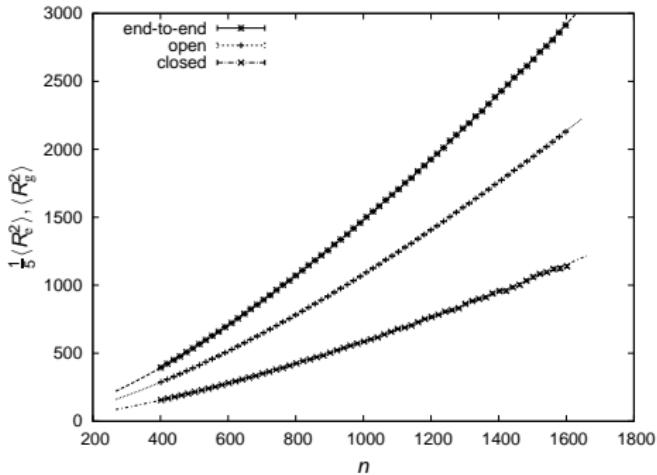
Distribution  $z_n$  of open chains at criticality ( $L = 352$ ).

Inset: Log-log plot of  $L^2 / \sum_n z_n = L^2 / \chi \propto L^{2-\gamma/\nu} = L^\eta$  vs  $L$



Inset: 2-parameter fit:  $\eta = 0.2498(26) \approx 1/4$  ( $\chi^2/\text{dof} = 1.87$ )

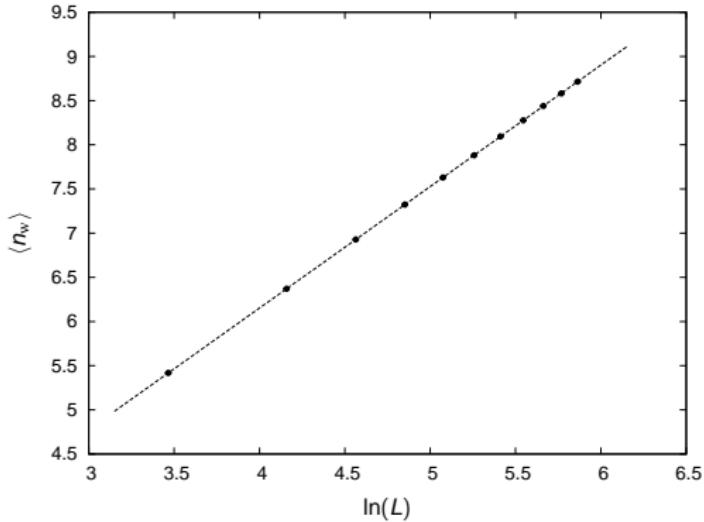
Average squared end-to-end distance (of chains) and radius of gyration of chains and loops  $\propto n^{2/D}$ ,  $D = 11/8 = 1.375$  ( $L = 352$ )



$$\langle R_e^2 \rangle: D = 1.3755(31) = 1.0004(23)D_{\text{exact}}$$

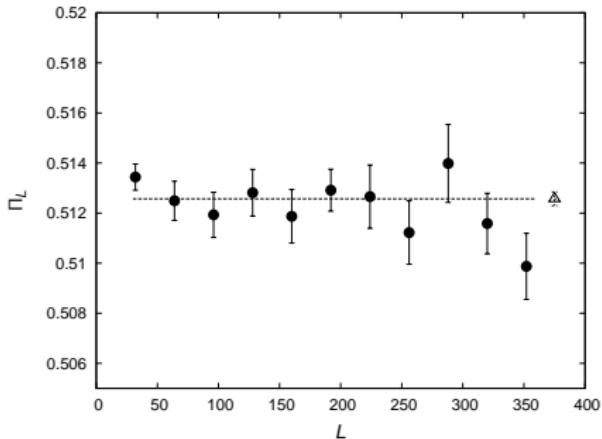
$$\langle R_g^2 \rangle_{\text{chains}}: D = 1.3789(55) = 1.0028(40)D_{\text{exact}}$$

Average length of winding loops on a honeycomb lattice of linear extent  $L$ ,  $\langle n_w \rangle \propto L^D$



2-parameter fit:  $D = 1.37504(32) = 1.00003(24)D_{\text{exact}}$   
( $\chi^2/\text{dof} = 1.13$ )

## Probability $\Pi_L$ that one or more loops wind the honeycomb lattice of linear size $L$ at the critical point



$P_w$  for  $L = 160$ :

$$P_0 = 0.48802(74)$$

$$P_1 = 0.49960(73)$$

$$P_2 = 0.01236(14)$$

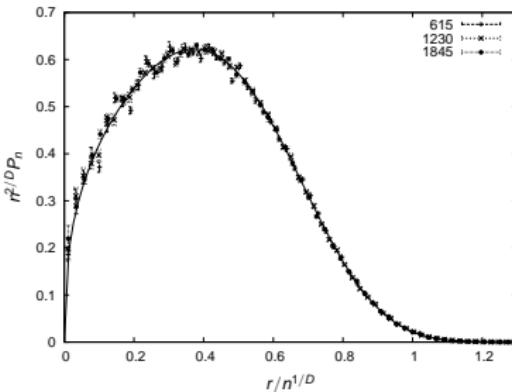
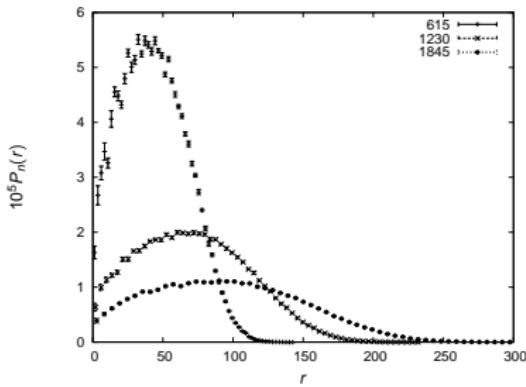
$$P_3 = 0.0000299(64)$$

$$P_4 = 0$$

$$P_0 + P_2 + P_4 + \dots = 0.50038$$

Average:  $\Pi_L = 0.51257(27) > 0.5$  ( $\chi^2/\text{dof} = 1.08$ )

## Scaling behaviour of the distribution function $P_n(r)$ of the end-to-end distance $r$ ( $n = 615, 1230, 1845, L = 352$ )



Perfect scaling collapse with  $D = 11/8$ . Scaling function is  $\propto t^\vartheta \exp(-bt^\delta)$ ;  $t = r/n^{1/D}$ ,  $\vartheta = 3/8$ ,  $\delta = (1 - 1/D)^{-1} = 11/3$

# Summary

- Worm update perfect tool for loop-gas approach to fluctuating fields on a lattice
- Concepts developed for self-avoiding walks ( $N = 0$ ) generalized to Ising ( $N = 1$ ) loops
- Extend study in future work to other numbers of colors  $N$

Collaboration with **Thomas Neuhaus** (FZ Jülich) and **Adriaan Schakel** (then Leipzig, now Recife (Brazil))

WJ, T. Neuhaus & A.M.J. Schakel, Nucl. Phys. B 829 [FS] (2010) 573

## Acknowledgements

€€€

- Deutsche Forschungsgemeinschaft (DFG)
- EU RTN Network “ENRAGE”
- Graduate School “BuildMoNa”
- DFH–UFA Graduate School Nancy–Leipzig
- NIC Computer time, JSC, Forschungszentrum Jülich

THANK YOU !

C Q T

## Advertisements

- WORKSHOP CompPhys10

11th International NTZ–Workshop on  
*Recent Developments in Computational Physics*,  
25 – 27 November 2010, ITP, Universität Leipzig

[www.physik.uni-leipzig.de/~janke/CompPhys10](http://www.physik.uni-leipzig.de/~janke/CompPhys10)

See you there ?

