# Projection and Variational Monte Carlo simulations

A presentation for the course in Computer Simulation

Matteo Seclì

May whenever, 2017

SISSA - DOCTORATE SCHOOL IN CONDENSED MATTER



Code at:
https://github.com/matteosecli/PMC-VMC

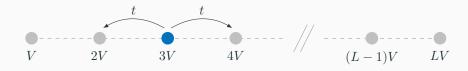
Projection Monte Carlo

# The system



#### Single particle in a 1D lattice with:

- L sites
- A linear (site-dependent) potential  $V(x) = V \cdot x$
- $\cdot$  A hopping amplitude t
- · Open boundary conditions



$$H = -t \sum_{\langle xx' \rangle} c_{x'}^{\dagger} c_x + \sum_x V(x) c_x^{\dagger} c_x \tag{1}$$



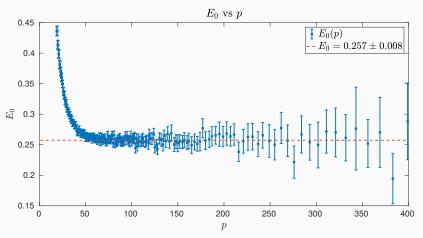


Figure 1:  $E_0$  for L=20, t=1, V=1 and  $N=10^7$ . The mean position is  $x_0=1.80\pm0.05$ .



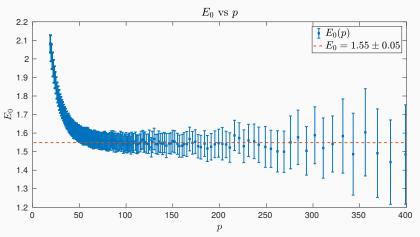
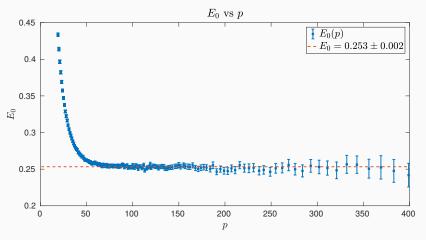


Figure 2:  $E_0$  for L=20, t=1, V=2 and  $N=10^7$ . The mean position is  $x_0=1.46\pm0.05$ .





**Figure 3:**  $E_0$  for L=20, t=1, V=1 and  $N=10^8$ . The mean position is  $x_0=1.79\pm0.01$ .



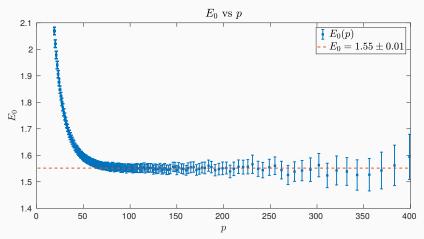


Figure 4:  $E_0$  for L=20, t=1, V=1 and  $N=10^8$ . The mean position is  $x_0=1.46\pm0.01$ .

Variational Monte Carlo

# The system



Antiferromagnetic spin-1/2 Heisenberg model on a 1D lattice with:

- L sites
- · Periodic boundary conditions
- · Zero magnetization



$$H = J \sum_{i=1}^{L} \vec{S}_{i} \cdot \vec{S}_{i+1} = J \sum_{i=1}^{L} \left\{ S_{i}^{z} S_{i+1}^{z} + \frac{1}{2} \left( S_{i}^{+} S_{i+1}^{-} + S_{i}^{-} S_{i+1}^{+} \right) \right\}$$
 (2)

with J > 0 in order to be antiferromagnetic.

# The VMC procedure I



• Variational wavefunction on the basis of the configurations  $\{|x\rangle\}$  with definite  $S_i^z$ :

$$\psi(x) = \operatorname{Sign}_{M}(x) e^{\frac{\alpha}{2} \sum_{i \neq j} v_{i,j}^{z} (2S_{i}^{z}) (2S_{ij}^{z})}$$
 (3)

with  $\mathrm{Sign}_M(x) = (-1)^{\sum_{i=1}^{L/2} (S_{2i}^z + 1/2)}$  and  $v_{i,j}^z = 2\log(|2\sin(\pi(i-j)/L)|).$ 

· Local energy:

$$E_L(x) = \frac{\langle x \mid H \mid \psi \rangle}{\langle x \mid \psi \rangle} = \langle x \mid H \mid x \rangle + \sum_{x' \neq x} \langle x \mid H \mid x' \rangle \frac{\langle x' \mid \psi \rangle}{\langle x \mid \psi \rangle}$$
(4)

· Staggered magnetization:

$$m^2 = \left\langle \left(\frac{1}{L} \sum_{i=1}^{L} (-1)^i S_i^z\right)^2 \right\rangle \tag{5}$$

# The VMC procedure II



· First neighbor correlation function:

$$C_1 = \left\langle \frac{1}{L} \sum_{i=1}^{L} S_i^z S_{i+1}^z \right\rangle. \tag{6}$$

Exact results from Bethe ansatz in  $1D^1$  ( $L \to \infty$ ):

$$E_0 = -|J| \left(\log 2 - \frac{1}{4}\right) \simeq -0.4431471|J|$$

and

$$C_1 = \frac{1}{12} (1 - 4 \log 2) \simeq -0.14771573.$$

<sup>&</sup>lt;sup>1</sup>See Minoru Takahashi, *Thermodynamics of One-Dimensional Solvable Models*. Cambridge University Press, 2005. ISBN 9780521019798.

# **Execution times**



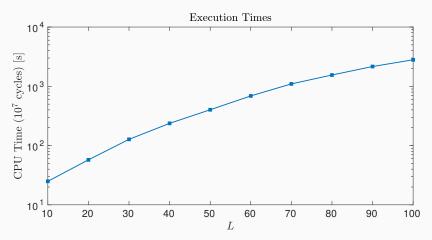
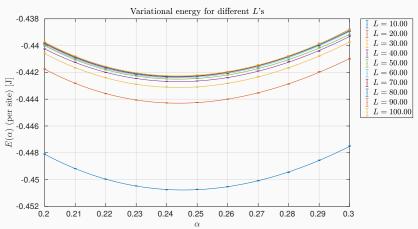


Figure 5: CPU time per variational parameter value with  $10^7\,\mathrm{MC}$  steps.





**Figure 6:** Variational energy. The best value for the variational parameter is estimated to be  $\alpha = 0.244 \pm 0.001$ .



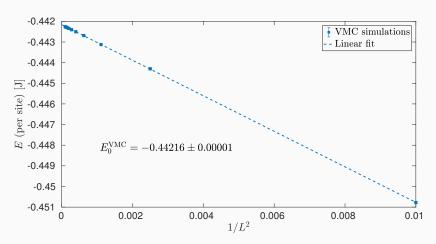


Figure 7: Extrapolation for  $L \to \infty$ .



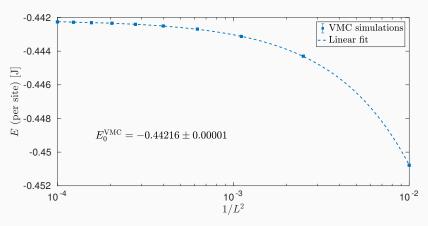
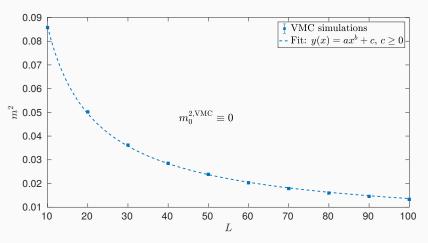


Figure 8: Extrapolation for  $L \to \infty$ .





**Figure 9:** Extrapolation for  $L \to \infty$ .



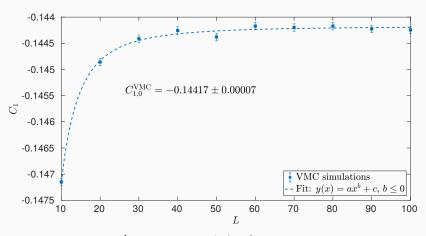


Figure 10: Extrapolation for  $L \to \infty$ .



Method	$E_0[J]$	$m^2$	$C_1$
Bethe ansatz <sup>2</sup>	-0.443147	0	-0.147716
$VMC^3$	-0.44216(1)	0	-0.14417(7)
ED/Lanczos <sup>4</sup>	-0.44304(5)	-	_

 $<sup>^{2}</sup>L\rightarrow\infty$ , exact.

 $<sup>^3</sup>L \to \infty$ , upper bound.

<sup>&</sup>lt;sup>4</sup>Extrapolated to  $L \to \infty$  from a set of calculations for  $L = \{8, 10, 12, 14, 16\}$ , with max 32 steps for the Lanczos. Code: http://www.fisica.uniud.it/~giannozz/Corsi/MQ/Software/C/heisenberg\_exact.c

# Conclusions



Hope this was at least a little bit interesting...

Thanks for your attention!







# References

I Affleck, D Gepner, H J Schulz, and T Ziman. Critical behaviour of spin-s Heisenberg antiferromagnetic chains: analytic and numerical results. *Journal of Physics A: Mathematical and General*, 22(5):511–529, mar 1989. ISSN 0305-4470. doi: 10.1088/0305-4470/22/5/015. URL

http://iopscience.iop.org/0305-4470/22/5/015.

Federico Becca and Sandro Sorella. The variational approach for strongly-correlated systems on the lattice.

John O Fjærestad. The Heisenberg model. In *Quantum theory of many-particle systems (TFY4210) - Lecture Notes*, pages 1–16. NTNU, 2012 edition, 2014.

#### References II



Paolo Giannozzi. Exact diagonalization of quantum spin models. In Numerical Methods in Quantum Mechanics - Lecture Notes. chapter 11, pages 80-85. University of Udine, Udine, 2015/2016 edition. URL http://www.fisica.uniud.it/{~}giannozz/ Corsi/MQ/mq.html.

Christopher L. Henley. Antiferromagnetic and frustrated order. In States in Solids, chapter 5.3, pages 15–23. Unpublished, 2007. URL http://www.lassp.cornell.edu/clh/clh{ }book.html.

Michael Karbach, Kun Hu, and Gerhard Muller. Introduction to the Bethe Ansatz III. Cond-Mat/0008018, 11(1):36, 2000. ISSN 08941866. doi: 10.1063/1.4822511. URL

http://arxiv.org/abs/cond-mat/0008018.

#### References III



Kenn Kubo, T. A. Kaplan, and J. R. Borysowicz. Monte Carlo simulation of the S=1/2 antiferromagnetic Heisenberg chain and the long-distance behavior of the spin-correlation function. *Physical Review B*, 38(16):11550–11561, dec 1988. ISSN 0163-1829. doi: 10.1103/PhysRevB.38.11550. URL https://link.aps.org/doi/10.1103/PhysRevB.38.11550.

Efstratios Manousakis. The spin- Heisenberg antiferromagnet on a square lattice and its application to the cuprous oxides. *Reviews of Modern Physics*, 63(1):1–62, 1991. ISSN 00346861. doi: 10.1103/RevModPhys.63.1.

J. Neirotti and M. de Oliveira. Spontaneous staggered magnetization in antiferromagnetic Heisenberg-Ising chains. *Physical Review B*, 54(9):6351–6355, 1996. ISSN 0163-1829. doi:

10.1103/PhysRevB.54.6351. URL

http://link.aps.org/doi/10.1103/PhysRevB.54.6351.

#### References IV



Jorge Quintanilla. Lecture XIV. In Magnetism and Superconductivity (PH752) - Lecture Notes, pages 1–6. University of Kent, Canterbury. URL https:

//www.kent.ac.uk/courses/modules/module/PH752.

Conrad Sanderson and Ryan Curtin. Armadillo: a template-based C++ library for linear algebra. *The Journal of Open Source Software*, 1 (2), jun 2016. doi: 10.21105/joss.00026. URL

http://joss.theoj.org/papers/10.21105/joss.00026.

Anders W Sandvik. Quantum spin systems - models and computational methods, 2010.

Sandro Sorella and Federico Becca. SISSA Lecture notes on Numerical methods for strongly correlated electrons. 2012.

#### References V



Minoru Takahashi. Thermodynamics of One-Dimensional Solvable Models. 2005. ISBN 0521019796. doi: 10.1017/CBO9780511524332. URL http://books.google.com/books?id=ubGcM-JCT0IC{&}pgis=1.

Wolfgang von der Linden. A quantum Monte Carlo approach to many-body physics. *Physics Reports*, 220(2-3):53-162, nov 1992. ISSN 03701573. doi: 10.1016/0370-1573(92)90029-Y. URL http://linkinghub.elsevier.com/retrieve/pii/037015739290029Y.