

# Minimally entangled typical thermal states of fermions in DMRG++

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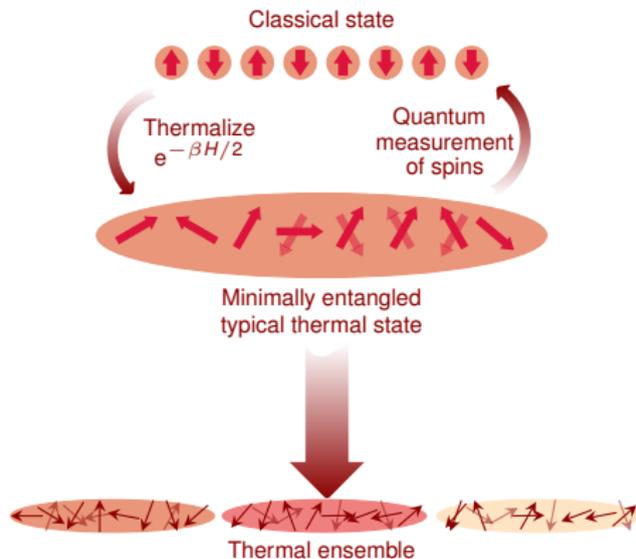
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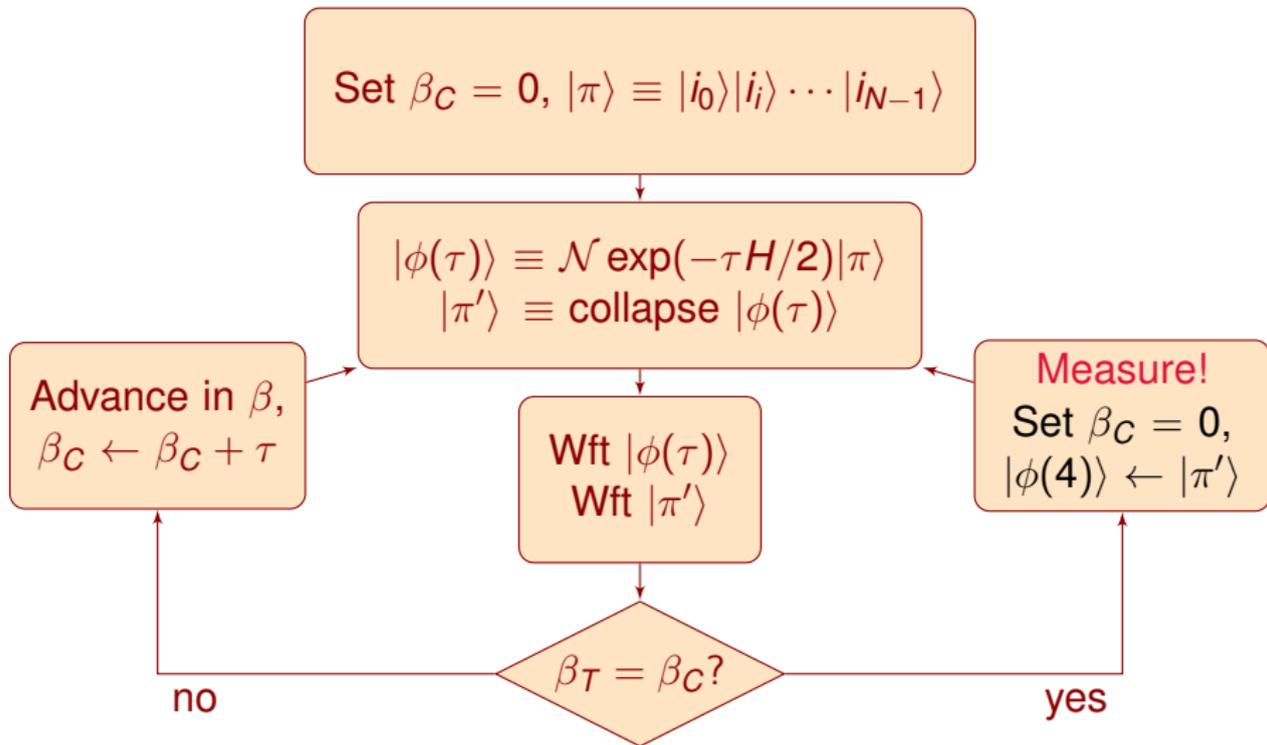
# Krylov-space Imaginary Time Evolution

 Alvarez, 2013

G. Alvarez, Production of minimally entangled typical thermal states with the Krylov-space approach, Phys. Rev. B 87, 245130, (2013)

<http://arxiv.org/abs/1307.8034>

# The Krylov-space Recipe



## We use Krylov-space Time Evolution

**Tridiagonalize**  $H = V^\dagger T V$  starting Lanczos with  $|\phi\rangle$ .  
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Finally,\* **compute the evolution** with

$$\exp(\alpha H)|\phi\rangle_i = \sum_{k,k',k'',j} V_{i,k}^* S_{k,k'}^\dagger \exp(\alpha d_{k'}) S_{k',k''} V_{j,k''} |\phi\rangle_j$$

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\* This is within a DMRG method, so don't forget to **target** the appropriate states. For an implementation, see  Alvarez et al., 2011.

# The “Collapse” Step and Ergodicity

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 \text{CPS} & & \xrightarrow[\text{natural basis}]{\text{collapse}} |\pi'\rangle
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When collapsing **into the natural basis**,  
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Therefore, observables don't depend on  $\mu$ ,  
 and **we get incorrect results.**

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One collapses in a random basis  $|\alpha_j\rangle = \sum_{\eta_j} M_{\alpha_j, \eta_j} |\eta_j\rangle$

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The new state  $\mathcal{N}\bar{\pi}(\eta_i)$  is collapsed with probability

$$p(\eta_i) = \|\bar{\pi}(\eta_i)\|^2$$

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To avoid **ergodicity** problems in METTS,  
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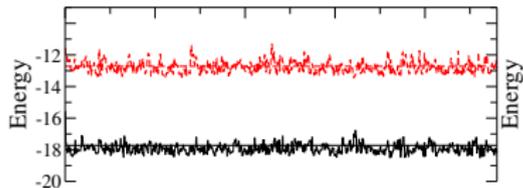
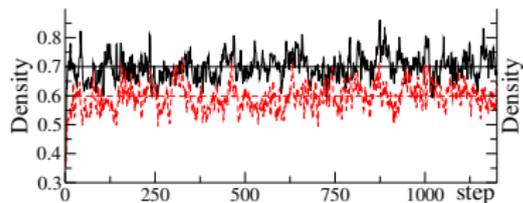
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Local **symmetries** are **not preserved** anymore.

For example, one uses the **grand canonical** ensemble.

# Accuracy and Convergence

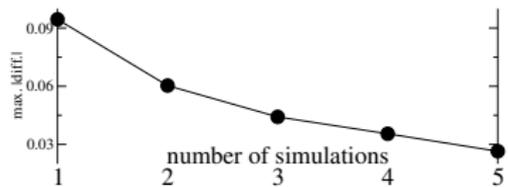
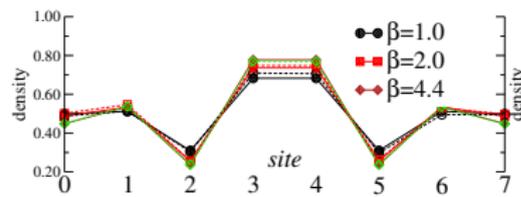
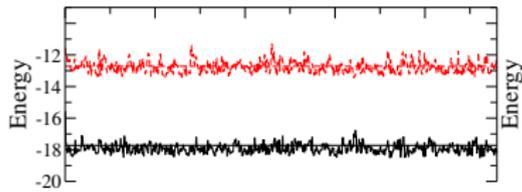
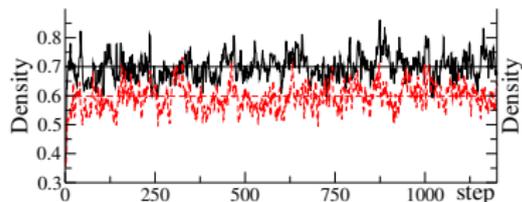
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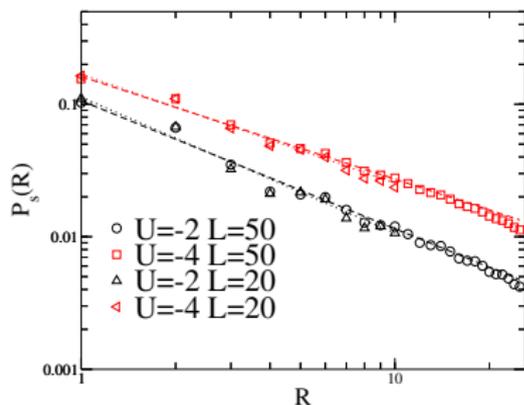
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Hubbard Chain at  $T > 0$ 

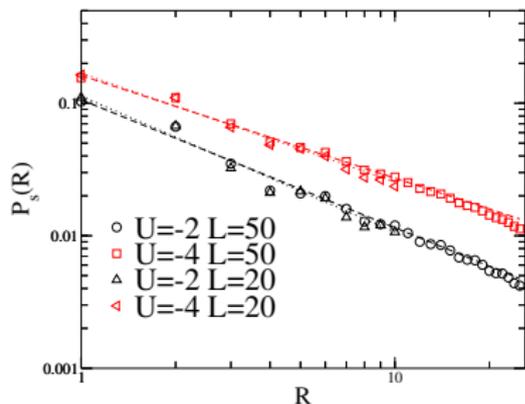
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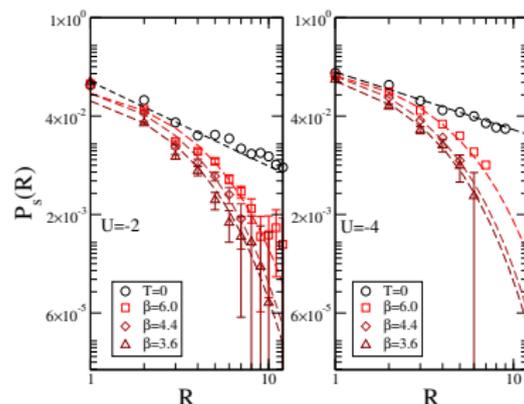
Hubbard chain with length  $L$  (as indicated) for  $T = 0$ .

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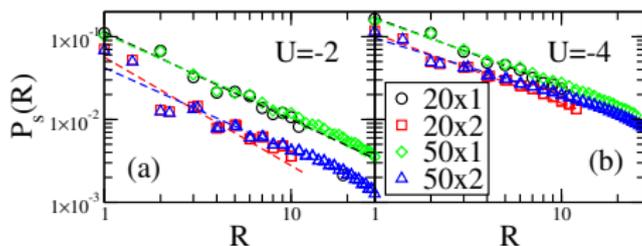
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	<b>1D</b>	<b>Ladders</b>	<b>2D</b>
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- Make tons of improvements to our codebase
- Implement **parallel DMRG**
  - 📄 Stoudenmire and White, 2013
- Work towards **2D DMRG**
- Develop a matrix product states code
- Stay at the **vanguard of renormalization methods**



- 📄 Corboz and Vidal, 2009,  
Evenbly and Vidal, 2009,  
Koenig et al., 2009, M. Aguado, 2008
- 📄 M. Rizzi, 2008, Pfeifer et al., 2009,  
Vidal, 2008, Barthel et al., 2009,  
Kraus et al., 2010

# Summary

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This **talk** is at <https://web.ornl.gov/~gz1/talks/>

## Credit Line

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### Credit Line

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# Colophon

Produced with  $\text{\LaTeX}$  and the Beamer package  
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