## From Fidelity Susceptibility to Recommender Engines

Lei Wang Institute of Physics, CAS



http://wangleiphy.github.io/





exact diagonalization

quantum Monte Carlo



tensor network states



dynamical mean field theories





exact diagonalization

quantum Monte Carlo



tensor network states



dynamical mean field theories

Algorithmic improvement in past 20 years outperformed Moore's law





exact diagonalization

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tensor network states



dynamical mean field theories







exact diagonalization

quantum Monte Carlo



tensor network states



dynamical mean field theories





Iazzi and Troyer, PRB 2015 LW, Iazzi, Corboz and Troyer, PRB 2015 Liu and LW, PRB 2015 LW, Liu and Troyer, PRB 2016

### entanglement & fidelity

LW and Troyer, PRL 2014 LW, Liu, Imriška, Ma and Troyer, PRX 2015 LW, Shinaoka and Troyer, PRL 2015 Huang, Wang, LW and Werner, arXiv 2016

Huffman and Chandrasekharan, PRB 2014 Li, Jiang and Yao, PRB 2015 LW, Liu, Iazzi, Troyer and Harcos, PRL 2015 Wei, Wu, Li, Zhang and Xiang, PRL 2016

International Journal of Modern Physics B Vol. 24, No. 23 (2010) 4371–4458 © World Scientific Publishing Company DOI: 10.1142/S0217979210056335



Review

#### FIDELITY APPROACH TO QUANTUM PHASE TRANSITIONS

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Received 20 August 2010

We review the quantum fidelity approach to quantum phase transitions in a pedagogical manner. We try to relate all established but scattered results on the leading term of the fidelity into a systematic theoretical framework, which might provide an alternative paradigm for understanding quantum critical phenomena. The definition of the fidelity and the scaling behavior of its leading term, as well as their explicit applications to the one-dimensional transverse-field Ising model and the Lipkin–Meshkov–Glick model, are introduced at the graduate-student level. Besides, we survey also other types of fidelity approach, such as the fidelity per site, reduced fidelity, thermal-state fidelity, operator fidelity, etc; as well as relevant works on the fidelity approach to quantum phase transitions occurring in various many-body systems.

Keywords: Fidelity; fidelity susceptibility; quantum phase transitions.





## News on Fidelity Susceptibility

LW, Liu, Imriška, Ma and Troyer, PRX 2015 LW, Shinaoka and Troyer, PRL 2015

$$\hat{H}(\lambda) = \hat{H}_0 + \lambda \hat{H}_1$$

You, Li, and Gu, 2007 Campos Venuti et al, 2007



$$\hat{H}(\lambda) = \hat{H}_0 + \lambda \hat{H}_1$$

You, Li, and Gu, 2007 Campos Venuti et al, 2007



Fidelity 
$$F(\lambda, \epsilon) = |\langle \Psi_0(\lambda) | \Psi_0(\lambda + \epsilon) \rangle|$$
  
=  $1 - \frac{\chi_F}{2} \epsilon^2 + \dots$  Fidelity  
Susceptibility

$$\hat{H}(\lambda) = \hat{H}_0 + \lambda \hat{H}_1$$

You, Li, and Gu, 2007 Campos Venuti et al, 2007

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A general indicator of quantum phase transitions No need for local order parameters e.g. Kitaev model, Abasto et al 2008, Yang et al 2008

Fulfills scaling law around QCP Gu et al 2009, Albuquerque et al 2010

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A general indicator of quantum phase transitions No need for local order parameters e.g. Kitaev model, Abasto et al 2008, Yang et al 2008

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However, very hard to compute, only a few limited tools



#### Fidelity and superconductivity in two-dimensional *t*-*J* models

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B. Sriram Shastry

Department of Physics, University of California, Santa Cruz, California 95064, USA

Stephan Haas

Department of Physics and Astronomy, University of Southern California, Los Angeles, California 90089, USA (Received 29 June 2009; revised manuscript received 25 August 2009; published 29 September 2009)

Exact diagonalization on small clusters

$$g(\lambda, \delta\lambda) \equiv \frac{2}{L} \frac{1 - F(\lambda, \delta\lambda)}{\delta\lambda^2}$$

 $\delta \lambda = 10^{-5}$ 



Is there a general way to compute  $\chi_F$ ?

### Fidelity Susceptibility

Yu, et al., PRE, **76** 022101 (2007)

L. Campos Venuti, et al., PRL **99**,095701 (2007)

$$\chi_F = \frac{\langle \partial_\lambda \Psi_0 | \partial_\lambda \Psi_0 \rangle}{\langle \Psi_0 | \Psi_0 \rangle} - \frac{\langle \Psi_0 | \partial_\lambda \Psi_0 \rangle}{\langle \Psi_0 | \Psi_0 \rangle} \frac{\langle \partial_\lambda \Psi_0 | \Psi_0 \rangle}{\langle \Psi_0 | \Psi_0 \rangle}$$

Real part of "quantum geometric tensor"

Fidelity Susceptibility

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Real part of "quantum geometric tensor"

Fidelity Susceptibility

Yu, et al., PRE, **76** 022101 (2007)

### Perturbative form

$$\chi_F = \sum_{n \neq 0} \frac{|\langle \Psi_n | \hat{H}_1 | \Psi_0 \rangle|^2}{(E_0 - E_n)^2}$$

Related to second order derivative of energy

L. Campos Venuti, et al., PRL **99**,095701 (2007)

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### Kubo form

$$\chi_F = \int_0^\infty d\tau \left[ \langle \hat{H}_1(\tau) \hat{H}_1 \rangle - \langle \hat{H}_1 \rangle^2 \right] \tau$$

Extension to finite-temperature

L. Campos Venuti, et al., PRL **99**,095701 (2007)

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Real part of "quantum geometric tensor"

Fidelity Susceptibility

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### Perturbative form

$$\chi_F = \sum_{n \neq 0} \frac{|\langle \Psi_n | \hat{H}_1 | \Psi_0 \rangle|^2}{(E_0 - E_n)^2}$$

Related to second order derivative of energy

### Kubo form

$$\chi_F = \int_0^{\beta/2} d\tau \left[ \langle \hat{H}_1(\tau) \, \hat{H}_1 \rangle - \langle \hat{H}_1 \rangle^2 \right] \tau$$

#### Extension to finite-temperature

#### PHYSICAL REVIEW B 81, 064418 (2010)

#### Quantum critical scaling of fidelity susceptibility

A. Fabricio Albuquerque, Fabien Alet, Clément Sire, and Sylvain Capponi Laboratoire de Physique Théorique, (IRSAMC), Université de Toulouse (UPS), F-31062 Toulouse, France and LPT (IRSAMC), CNRS, F-31062 Toulouse, France (Received 18 December 2009; published 18 February 2010)



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Imaginary-time correlator in  
stochastic series expansion  

$$g^{2}\langle H_{1}(\tau)H_{1}(0)\rangle$$
  
 $=\sum_{m=0}^{n-2}\frac{(n-1)!}{(n-m-2)!m!}\beta^{-n}(\beta-\tau)^{n-m-2}\tau^{m}\langle N_{gH_{1}}(m)\rangle_{W}$ 

C

02

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## Can we do even better?



#### JUNE, 1953

#### Equation of State Calculations by Fast Computing Machines

NICHOLAS METROPOLIS, ARIANNA W. ROSENBLUTH, MARSHALL N. ROSENBLUTH, AND AUGUSTA H. TELLER, Los Alamos Scientific Laboratory, Los Alamos, New Mexico

AND

EDWARD TELLER,\* Department of Physics, University of Chicago, Chicago, Illinois (Received March 6, 1953)

A general method, suitable for fast computing machines, for investigating such properties as equations of state for substances consisting of interacting individual molecules is described. The method consists of a modified Monte Carlo integration over configuration space. Results for the two-dimensional rigid-sphere system have been obtained on the Los Alamos MANIAC and are presented here. These results are compared to the free volume equation of state and to a four-term virial coefficient expansion.

#### I. INTRODUCTION

THE purpose of this paper is to describe a general method, suitable for fast electronic computing machines, of calculating the properties of any substance which may be considered as composed of interacting individual molecules. Classical statistics is assumed,

#### II. THE GENERAL METHOD FOR AN ARBITRARY POTENTIAL BETWEEN THE PARTICLES

In order to reduce the problem to a feasible size for numerical work, we can, of course, consider only a finite number of particles. This number N may be as high as several hundred. Our system consists of a square<sup>†</sup> con-



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## Diagrammatic approaches







### bosons **World-line Approach**

**Stochastic Series Expansion** 

quantum spins

Prokof'ev et al, JETP, 87, 310 (1998)

Sandvik et al, PRB, 43, 5950 (1991)

### fermions **Determinantal Methods**

Gull et al, RMP, 83, 349 (2011)







## Diagrammatic approaches







### bosons World-line Approach

### **Stochastic Series Expansion**

### fermions Determinantal Methods

Prokof'ev et al, JETP, **87**, 310 (1998)

### Sandvik et al, PRB, **43**, 5950 (1991)

quantum spins

98) Sandvik et al, PRB, **43**, 5950 (1991) Gull et al, RMP, **83**, 349 (2011)  $\beta$ 

$$Z = \sum_{k=0}^{\infty} \lambda^k \int_0^{\beta} d\tau_1 \dots \int_{\tau_{k-1}}^{\beta} d\tau_k \operatorname{Tr} \left[ (-1)^k e^{-(\beta - \tau_k)\hat{H}_0} \hat{H}_1 \dots \hat{H}_1 e^{-\tau_1 \hat{H}_0} \right]$$

$$=\sum_{k=0}^{\infty}\lambda^k\sum_{\mathcal{C}_k}w(\mathcal{C}_k)$$

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$$= \sum_{k=0}^{\infty} \lambda^{k} \sum_{\mathcal{C}_{k}} w(\mathcal{C}_{k})$$

$$det \left( \begin{array}{c} \text{Noninteracting} \\ \text{Green's functions} \end{array} \right)_{k \times k}$$

$$\langle k \rangle \sim \beta \lambda N, \text{ scales as } \mathcal{O}(\beta^{3} \lambda^{3} N^{3})$$

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Rubtsov et al, PRB 2005 Gull et al, RMP 2011

Noninteracting Green's functions  $\Big|_{k \times k}$ det

 $\langle k \rangle \sim \beta \lambda N$ , scales as  $\mathcal{O}(\beta^3 \lambda^3 N^3)$ 

Rombouts, Heyde and Jachowicz, PRL 1999 Iazzi and Troyer, PRB 2015 LW, Iazzi, Corboz and Troyer, PRB 2015



LCT-QMC Methods

$$\det \left( I + \mathcal{T}e^{-\int_0^\beta d\tau H_{\mathcal{C}_k}(\tau)} \right)_{N \times N}$$

thus achieving  $\mathcal{O}(\beta\lambda N^3)$  scaling!

## More advantages

$$\langle \hat{O} \rangle = \frac{1}{Z} \sum_{k} \lambda^{k} \sum_{\mathcal{C}_{k}} w(\mathcal{C}_{k}) O(\mathcal{C}_{k})$$

### Observable derivatives Histogram reweighing Lee-Yang zeros

$$\boxed{ \frac{\partial \langle \hat{O} \rangle}{\partial \lambda} = \frac{\langle \hat{O}k \rangle - \langle \hat{O} \rangle \langle k \rangle}{\lambda} }$$





Directly sample *derivatives* of any observable

Can obtain observables in a *continuous range* of coupling strengths

Partition function zeros in the *complex coupling strength* plane

Ferrenberg et al, 1988 Wang and Landau, 2001 Troyer et al, 2003

## Fidelity susceptibility made simple!

LW, Liu, Imriška, Ma and Troyer, PRX 2015

$$\chi_F = \frac{\langle k_L k_R \rangle - \langle k_L \rangle \langle k_R \rangle}{2\lambda^2}$$



Cut and count, that's it!

## Fidelity susceptibility made simple!

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### **Bose-Hubbard Model**

$$\hat{H} = \frac{U}{2} \sum_{i} \hat{n}_{i} \left( \hat{n}_{i} - 1 \right) - \lambda \sum_{\langle i, j \rangle} \left( \hat{b}_{i}^{\dagger} \hat{b}_{j} + \hat{b}_{j}^{\dagger} \hat{b}_{i} \right)$$



### Bose-Hubbard Model

$$\hat{H} = \frac{U}{2} \sum_{i} \hat{n}_{i} \left( \hat{n}_{i} - 1 \right) - \lambda \sum_{\langle i, j \rangle} \left( \hat{b}_{i}^{\dagger} \hat{b}_{j} + \hat{b}_{j}^{\dagger} \hat{b}_{i} \right)$$



## Honeycomb Hubbard Model $\hat{H} = -t \sum_{\langle i,j \rangle} \sum_{\sigma = \{\uparrow,\downarrow\}} \left( \hat{c}_{i\sigma}^{\dagger} \hat{c}_{j\sigma} + \hat{c}_{j\sigma}^{\dagger} \hat{c}_{i\sigma} \right) + \lambda \sum_{i} \left( \hat{n}_{i\uparrow} - \frac{1}{2} \right) \left( \hat{n}_{i\downarrow} - \frac{1}{2} \right)$

Meng et al, Nature 2010





### A hotly debated problem in recent years

## There is only one peak !

Suggesting a single phase transition, i.e. no intermediate phase



Impurity QPT

LW, Shinaoka and Troyer, PRL 2015



Anderson and Yuval, 1969 Maps the Kondo model to a classical Coulomb gas



Werner el al 2006 Hybridization expansion QMC performs a similar mapping for the Anderson impurity models

Impurity QPT

LW, Shinaoka and Troyer, PRL 2015









Werner el al 2006 Hybridization expansion QMC performs a similar mapping for the Anderson impurity models



Two-impurity Anderson model



## How to experimentally measure $\chi_F$ ?

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### Dynamical response functions

Hauke, et al Nat. Phys. 2016 Gu, et al EPL 2014

## Excitations after an adiabatic ramp

Kolodrubetz, et al PRB 2013 De Grandi, et al PRB 2010 Polkovnikov et al RMP 2011

Islam et al, Nature 2015

Measure fidelity by interferencing two copies of many-body system ?

### $\chi_{\rm F}$ in AdS-CFT

PRL 115, 261602 (2015)

PHYSICAL REVIEW LETTERS

week ending 31 DECEMBER 2015

#### **Distance between Quantum States and Gauge-Gravity Duality**

Masamichi Miyaji,<sup>1</sup> Tokiro Numasawa,<sup>1</sup> Noburo Shiba,<sup>1</sup> Tadashi Takayanagi,<sup>1,2</sup> and Kento Watanabe<sup>1</sup> <sup>1</sup>Yukawa Institute for Theoretical Physics, Kyoto University, Kitashirakawa Oiwakecho, Sakyo-ku, Kyoto 606-8502, Japan <sup>2</sup>Kavli Institute for the Physics and Mathematics of the Universe, University of Tokyo, Kashiwa, Chiba 277-8582, Japan (Received 3 August 2015; revised manuscript received 5 October 2015; published 22 December 2015)

We study a quantum information metric (or fidelity susceptibility) in conformal field theories with respect to a small perturbation by a primary operator. We argue that its gravity dual is approximately given by a volume of maximal time slice in an anti-de Sitter spacetime when the perturbation is exactly marginal. We confirm our claim in several examples.



Monte Carlo simulations can be painfully slow

## A Comparison of two Markov Chain Monte Carlo samplers

### Recommender engine for QMC

1. Collect configuration data

2. Train a classical Stat-Mech model

$$E(\{\tau_i\}) = -\sum_{i < j}^{k} V(\tau_i - \tau_j) - \mu k$$

3. Use it as a recommender engine!

Huang and LW, 1610.02746 Liu, Qi, Meng and Fu, 1610.03137

and more to come...



## Take home message

Fidelity Susceptibility: A general purpose indicator of quantum phase transition

Quantum Monte Carlo: New developments are around the horizon

### Thanks to my collaborators!



# Take home message

Fidelity Susceptibility: A general purpo quantum phase transition

Quantum Monte Carlo: New developments are around the horizon

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## 欢迎本科生毕业设计,博士生,博士后 wanglei@iphy.ac.cn 010-82649853

State of the second second

广告

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