

Numerical simulations of bosons and fermions in three dimensional optical lattices

Ping Nang MA

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Supervisor: Prof. Matthias TROYER



Contents

1. Optical lattice - introduction

2. Magnetism in optical lattices

▶ **Density Functional Theory**

▶ **Reference:** P. N. Ma, S. Pilati, M. Troyer, and X. Dai,
Density functional theory for atomic Fermi gases,
Nature Phys. **8**, 601 (2012)

3. Thermometry in optical lattices

▶ **Fluctuation-dissipation thermometry**

▶ **Wing thermometry**

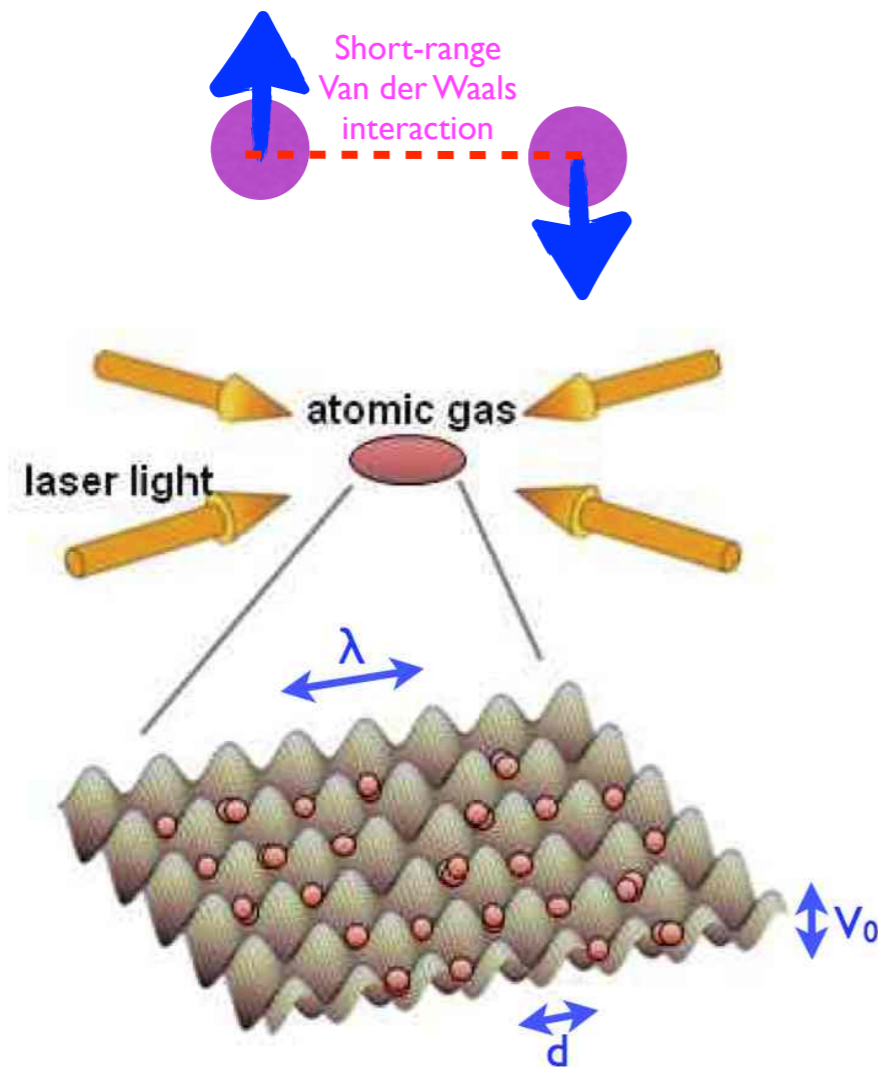
▶ **Reference:** P. N. Ma, L. Pollet, and M. Troyer,
Measuring the equation of state of trapped ultracold bosonic
systems in an optical lattice with in-situ density imaging ,
Phys. Rev. A. **82**, 033627 (2010)

4. Directed worm algorithm (QMC) - optional

5. Conclusion/Outlook

Optical lattices

-- setup by 3 orthogonal pairs of laser beams.



Cartoon illustration

$$V(\mathbf{x}) = \sum_{x^i=x,y,z} V_0 \sin^2(kx^i)$$

Lattice strength: V_0

Lattice separation: $d = \frac{\lambda}{2}$;

Lattice wavevector: $k = \frac{2\pi}{\lambda} = \frac{\pi}{d}$

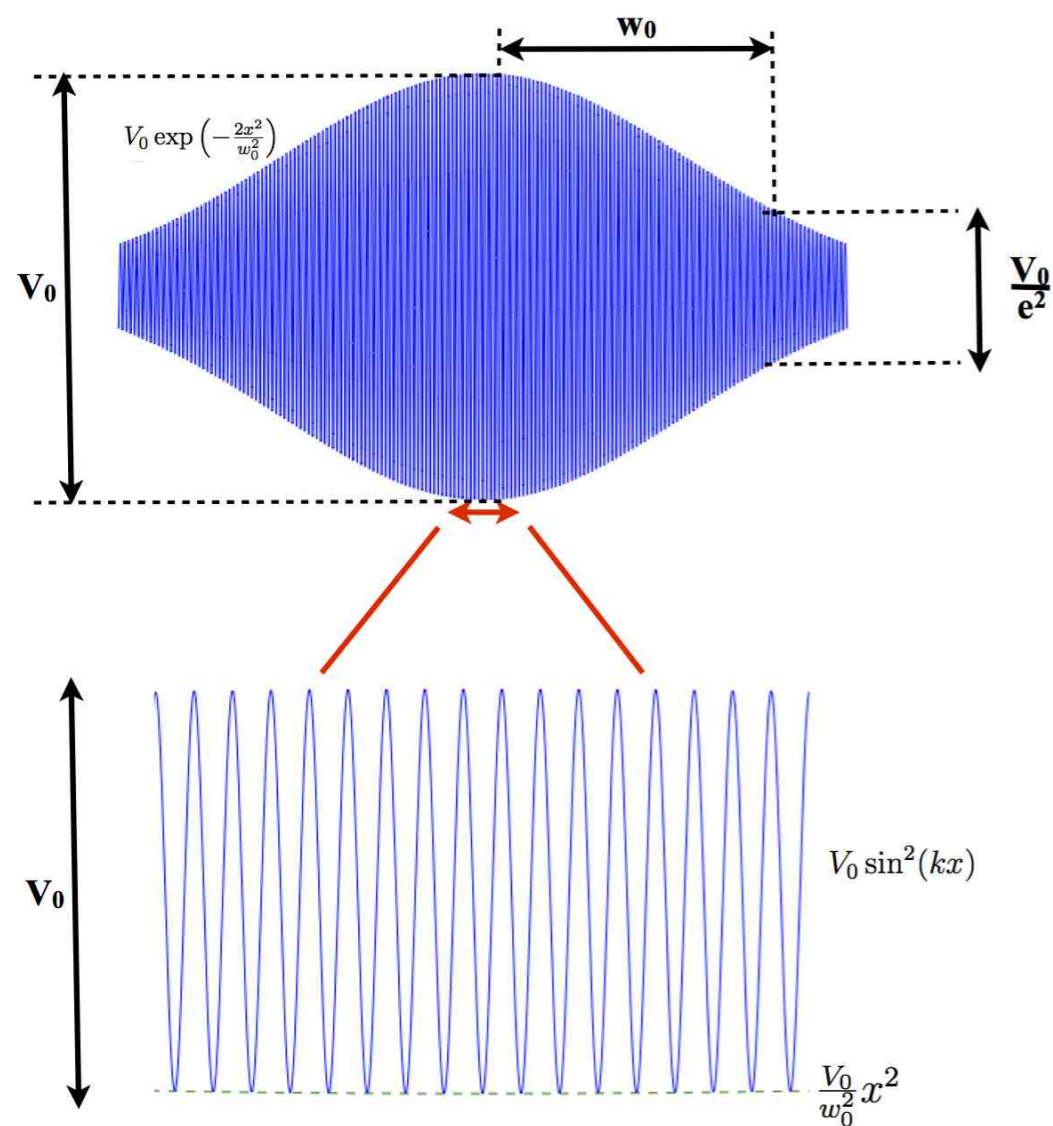
s-wave scattering length: a

-- setup by 3 orthogonal pairs of laser beams.



Immanuel Bloch's laboratory, Max Planck Institute

Optical lattices



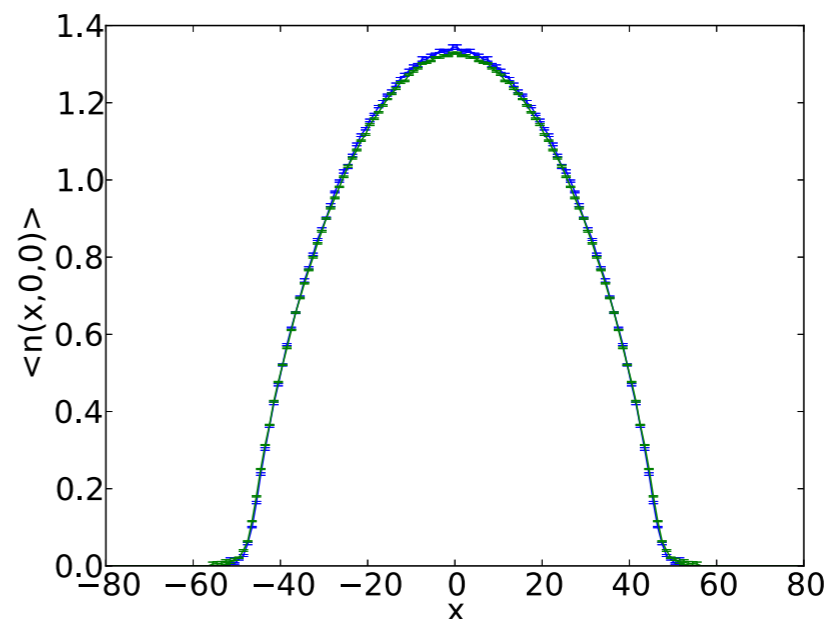
-- Gaussian laser beams induce trapping of atoms.

trapping envelope: $V_0 \exp\left(-\frac{2r^2}{w_0^2}\right)$

-- Current experiments:
Atoms are around the vicinity of the center.

~ harmonic trapping: $V_T(\mathbf{x}) = V_T \mathbf{x}^2$

~ waist effects are minimal:



Bosons in an optical lattice. QMC-DWA simulation.
 $U/t = 8.11, T/t = 1.00, N = 280,000, w_0 = 150\mu\text{m}$
(Red) Minimal effect seen due to waist corrections.

Optical lattices

For deep lattices, or large V_0 :

1. bosons in an optical lattice

$$\hat{H} = -t \sum_{\langle i,j \rangle} \hat{b}_i^\dagger \hat{b}_j + \frac{U}{2} \sum_i n_i(n_i - 1) - \sum_i (\mu - V_T \mathbf{x}_i^2) n_i$$

(boson Hubbard model)

2. fermions in an optical lattice

$$\hat{H} = -t \sum_{\langle i,j \rangle, \sigma} \hat{c}_{i\sigma}^\dagger \hat{c}_{j\sigma} + U \sum_i n_{i\uparrow} n_{i\downarrow} - \sum_i (\mu - V_T \mathbf{x}_i^2) n_i$$

(Hubbard model)

hopping

onsite interaction

Easy and convenient conversion within ALPS Python:

```
>>> import numpy;
>>> import pyalps.dwa;
>>>
>>> V0 = numpy.array([8.805, 8., 8.]); #lattice strength [Er]
>>> wlen = numpy.array([765., 843., 843.]); #laser wavelength [nm]
>>> a = 101; #s-wave scattering length [bohr radius]
>>> m = 86.99; #mass [a.m.u.]
>>> L = 160; #lattice of size L^3
>>>
>>> band = pyalps.dwa.bandstructure(V0, wlen, a, m, L);
>>>
```

```
>>> band
```

```
Optical lattice:
```

```
=====
```

```
V0 [Er] = 8.805 8 8
lamda [nm] = 765 843 843
Er2nK = 188.086 154.89 154.89
L = 160
g = 5.51132
```

```
Band structure:
```

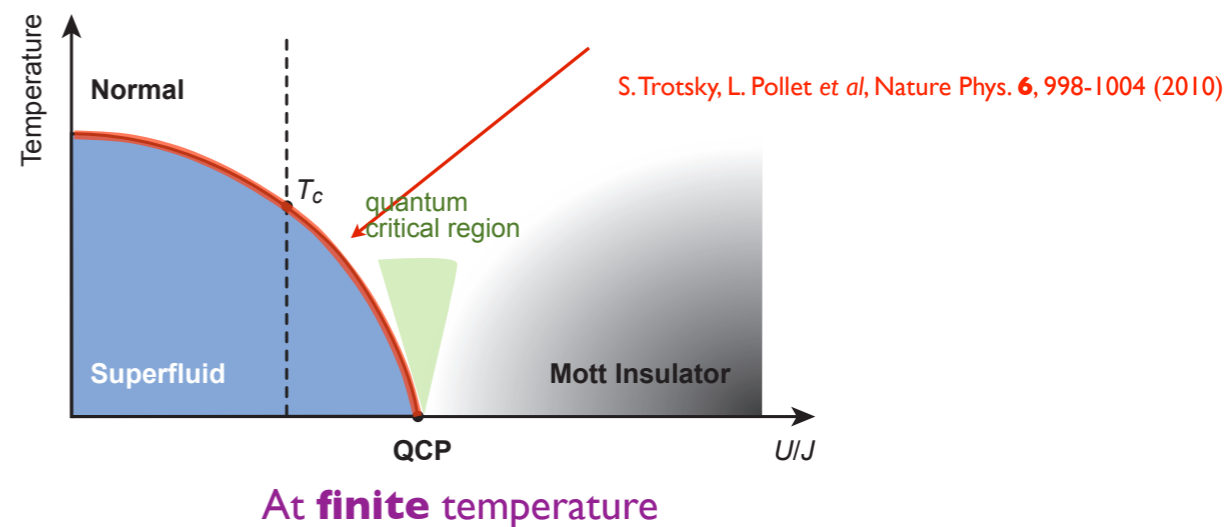
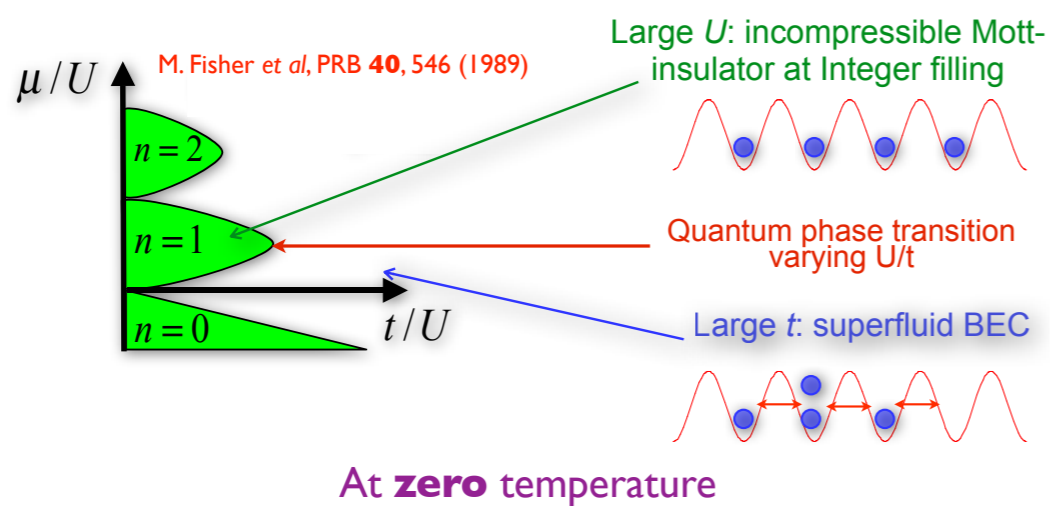
```
=====
```

```
t [nK] : 4.77257 4.77051 4.77051
U [nK] : 38.7027
U/t : 8.1094 8.1129 8.1129
```

Bosons in an optical lattice

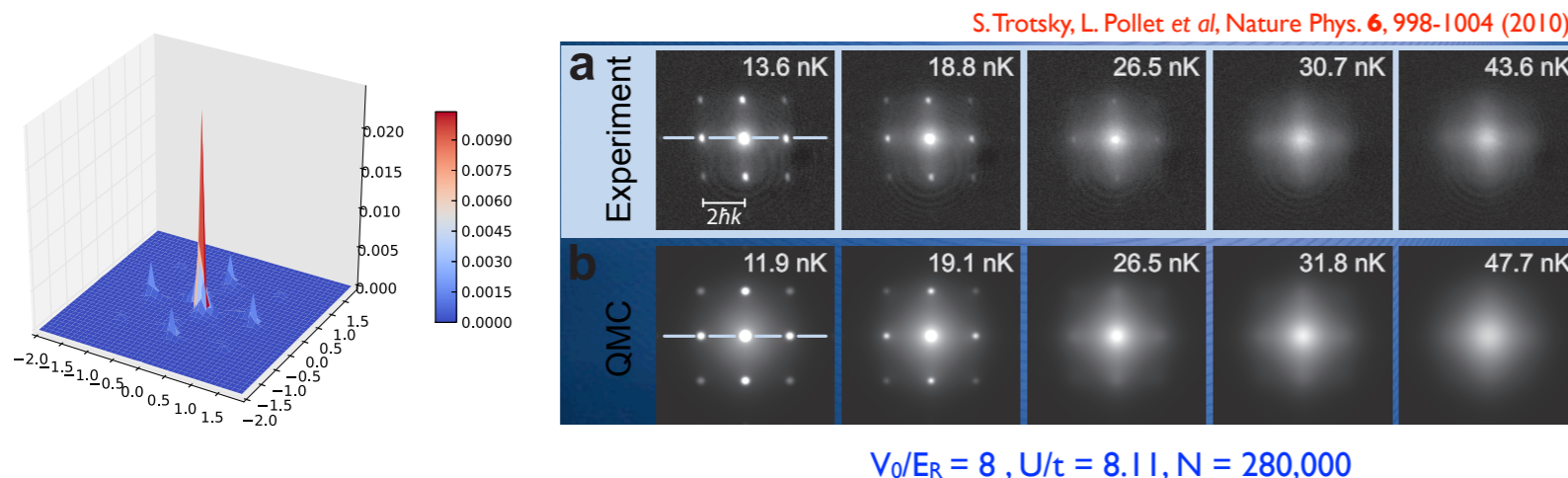
$$\hat{H} = -t \sum_{\langle i,j \rangle} \hat{b}_i^\dagger \hat{b}_j + \frac{U}{2} \sum_i n_i(n_i - 1) - \sum_i (\mu - V_T \mathbf{x}_i^2) n_i$$

Phase diagram for homogeneous systems:

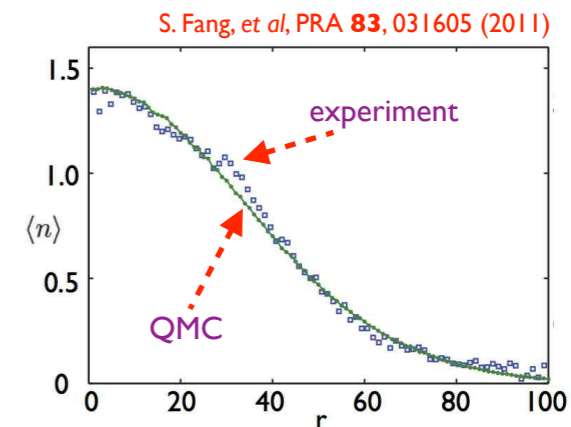


Quantitative validation:

1. on time-of-flight (tof) images:



2. on density profiles:



Fermions in an optical lattice

$$\hat{H} = -t \sum_{\langle i,j \rangle, \sigma} \hat{c}_{i\sigma}^\dagger \hat{c}_{j\sigma} + U \sum_i n_{i\uparrow} n_{i\downarrow} - \sum_i (\mu - V_T \mathbf{x}_i^2) n_i$$

Quantum Monte Carlo -- negative sign problem

M. Troyer, U.-J. Weise, PRL **94**, 170201 (2005)

$$\begin{aligned} \langle A \rangle &= \frac{\sum_c A(c) p(c)}{\sum_c p(c)} \\ &= \frac{\sum_c A(c) s(c) |p(c)| / \sum_c |p(c)|}{\sum_c s(c) |p(c)| / \sum_c |p(c)|} \equiv \frac{\langle As \rangle'}{\langle s \rangle'} \end{aligned}$$

$$\frac{\Delta s}{\langle s \rangle} = \frac{\sqrt{(\langle s^2 \rangle - \langle s \rangle^2) / M}}{\langle s \rangle} = \frac{\sqrt{1 - \langle s \rangle^2}}{\sqrt{M} \langle s \rangle} \sim \frac{e^{\beta N \Delta f}}{\sqrt{M}}$$

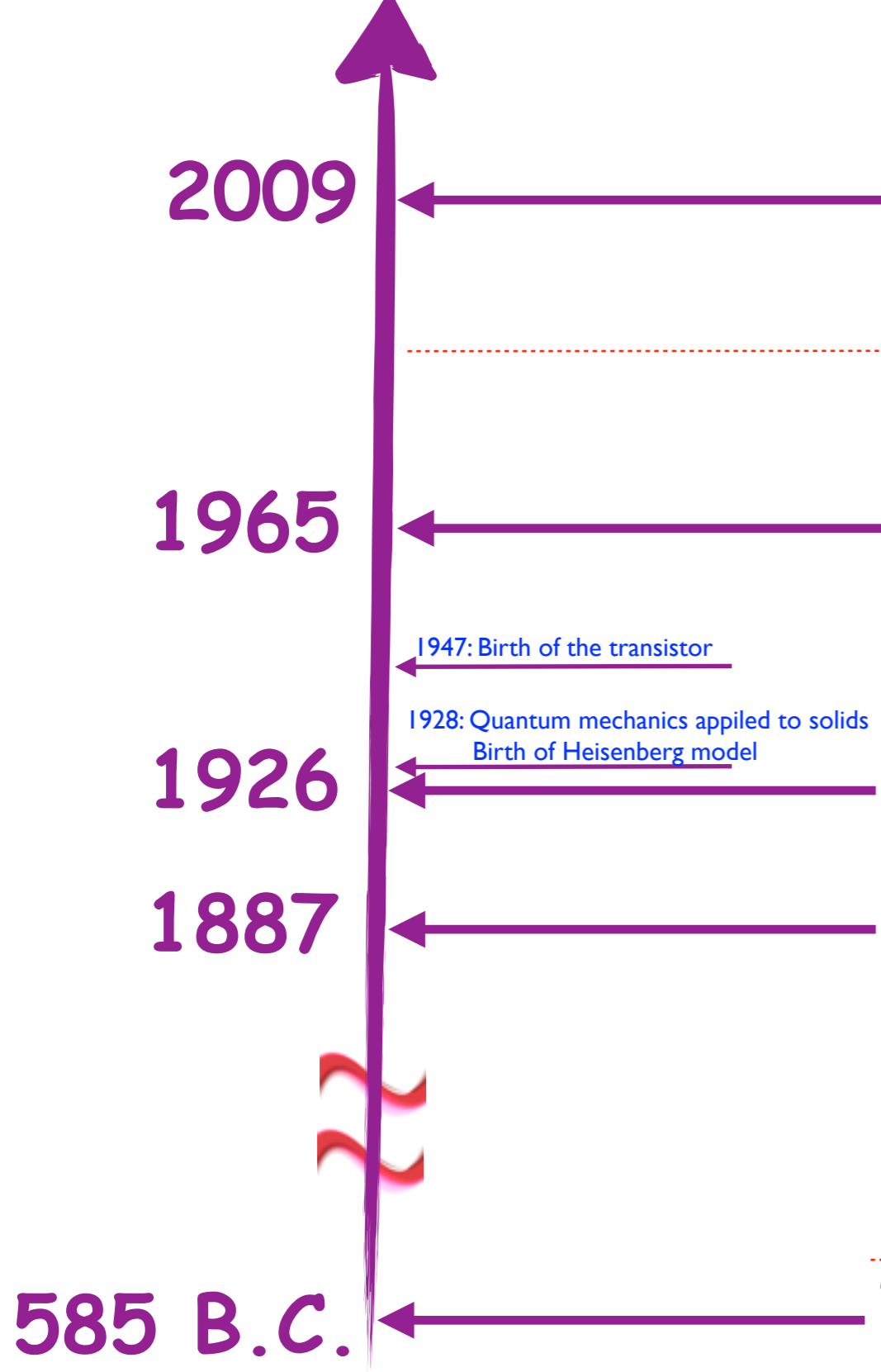
~ scales exponentially with
1) inverse temperature β , and
2) system size N .

Therefore, phase diagram for fermions is not entirely clear in general

At half-filling, the Hubbard model exhibits antiferromagnetic ground state.

Magnetism

Time Line



2009

Stoner ferromagnetism experimentally detected in (ultracold) **gases**.

$$\hat{H} = \sum_{\mathbf{k}, \sigma} \epsilon_{\mathbf{k}} \hat{c}_{\mathbf{k}}^{\dagger} \hat{c}_{\mathbf{k}} + \frac{1}{2} \frac{U}{N} \sum_{\substack{\mathbf{k}_1, \mathbf{k}_2 \\ \mathbf{q} \neq 0}} \hat{c}_{\mathbf{k}_1 + \mathbf{q} \uparrow}^{\dagger} \hat{c}_{\mathbf{k}_2 - \mathbf{q} \downarrow}^{\dagger} \hat{c}_{\mathbf{k}_2 \downarrow} \hat{c}_{\mathbf{k}_1 \uparrow}$$

Magnetism in gases
Magnetism in solids

1965

Kohn-Sham DFT: $\left(-\frac{\hbar^2}{2m} \nabla^2 + V(\mathbf{r}) + V_{\sigma}^{\text{HXC}}(\rho_{\uparrow}, \rho_{\downarrow}; \mathbf{r}) \right) \phi_n^{\sigma} = \epsilon_n^{\sigma} \phi_n^{\sigma}$

1. many-body → effective single-body quantum problem
2. largely successful in electronic structure problems
3. inadequate to explain (strong) magnetism

1947: Birth of the transistor

1928: Quantum mechanics applied to solids
Birth of Heisenberg model

1926

Quantum Mechanics (Schrodinger equation):

$$i\hbar \frac{\partial}{\partial t} \psi(\mathbf{x}, t) = \left(-\frac{\hbar^2}{2m} \nabla^2 + V(\mathbf{x}, t) \right) \psi(\mathbf{x}, t)$$

1887

Classical electromagnetism (Maxwell's equations):

$$\nabla \cdot \mathbf{E} = \frac{\rho}{\epsilon_0}$$

$$\nabla \cdot \mathbf{B} = 0$$

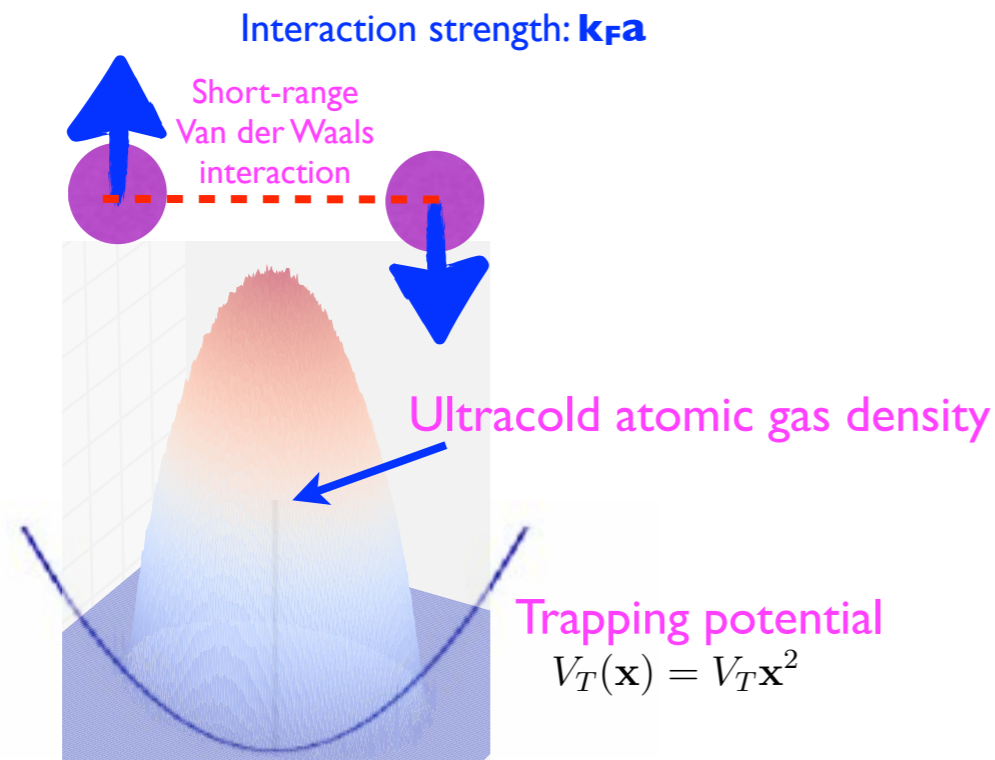
$$\nabla \times \mathbf{E} = -\frac{\partial \mathbf{B}}{\partial t}$$

$$\nabla \times \mathbf{B} = \mu_0 \mathbf{J} + \mu_0 \epsilon_0 \frac{\partial \mathbf{E}}{\partial t}$$

585 B.C.

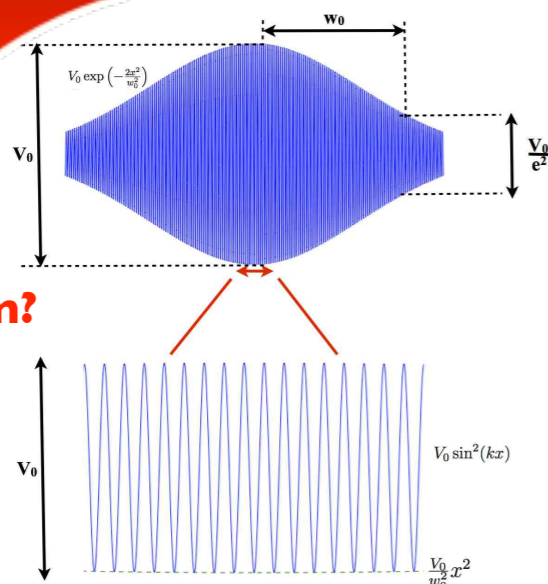
“ ... loadstone attracts iron because it has a soul.”
— Thales of Miletus, ~ 585 B.C.

Magnetism in (ultracold) gases



Cartoon illustration

setup an optical lattice



Q: Magnetism?

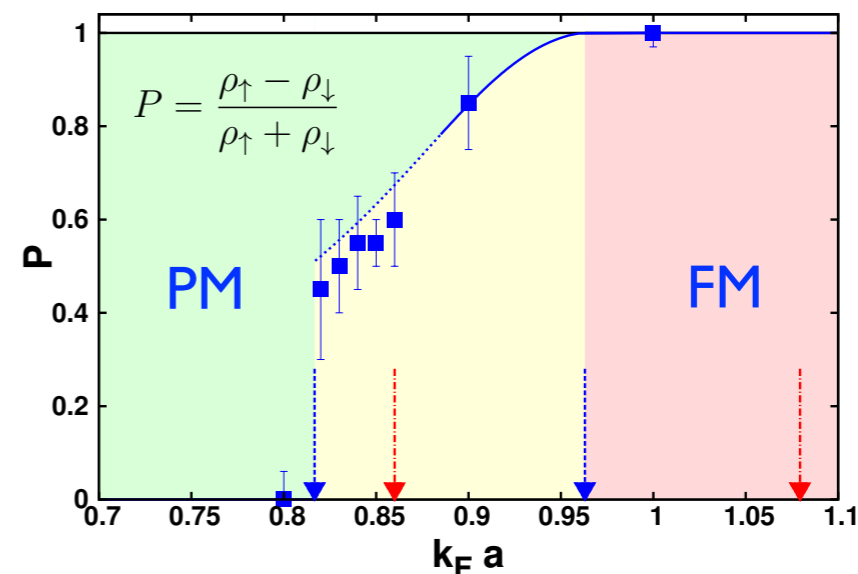
Stoner ferromagnetism:

$$\hat{H} = \sum_{\mathbf{k}, \sigma} \epsilon_{\mathbf{k}} \hat{c}_{\mathbf{k}}^{\dagger} \hat{c}_{\mathbf{k}} + \frac{1}{2} \frac{U}{N} \sum_{\substack{\mathbf{k}_1 \mathbf{k}_2 \\ \mathbf{q} \neq 0}} \hat{c}_{\mathbf{k}_1 + \mathbf{q} \uparrow}^{\dagger} \hat{c}_{\mathbf{k}_2 - \mathbf{q} \downarrow}^{\dagger} \hat{c}_{\mathbf{k}_2 \downarrow} \hat{c}_{\mathbf{k}_1 \uparrow}$$

-- first observed experimentally in an ultracold ${}^6\text{Li}$ gaseous cloud in 2009.

G-B. Jo, et al,
Itinerant ferromagnetism in a Fermi gas of ultracold atoms,
Science **325**, 5947 (2009).

-- phase diagram

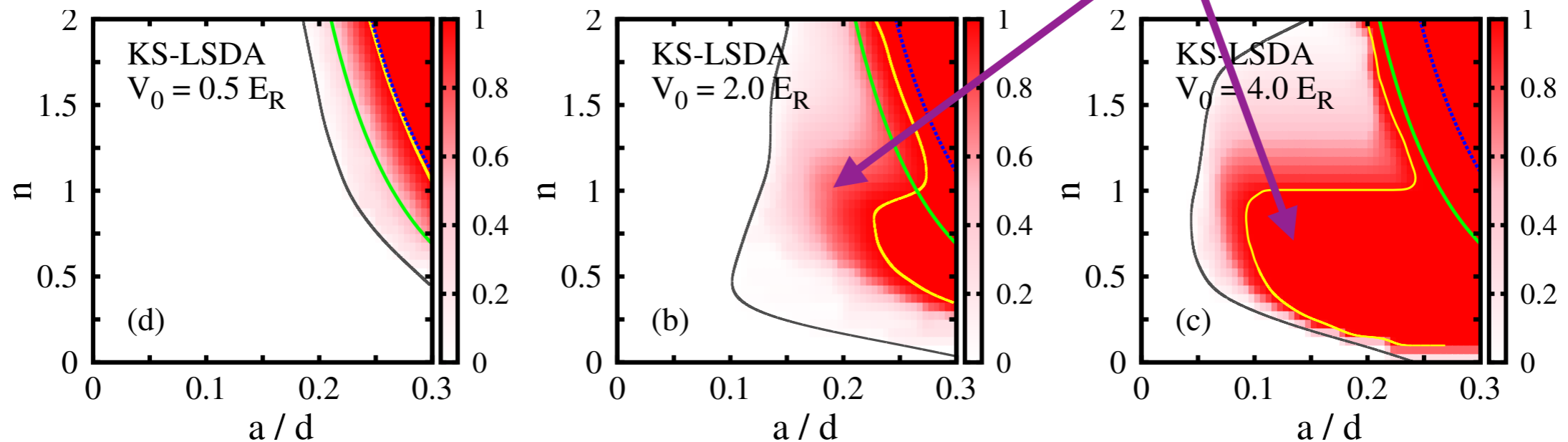


S. Pilati, G. Bertaino, S. Giorgini, and M. Troyer,
Itinerant ferromagnetism of a repulsive atomic Fermi gas: a quantum Monte Carlo study
Phys. Rev. Lett. **105**, 030405 (2010).

Magnetism in optical lattices

Ferromagnetism is enhanced by optical lattice (band structure effects):

$$P = \frac{\rho_{\uparrow} - \rho_{\downarrow}}{\rho_{\uparrow} + \rho_{\downarrow}}$$



Kohn-Sham density functional theory (KS-DFT):

$$\left(-\frac{\hbar^2}{2m} \nabla^2 + V(\mathbf{r}) + V_{\sigma}^{\text{HXC}}(\rho_{\uparrow}, \rho_{\downarrow}; \mathbf{r}) \right) \phi_n^{\sigma} = \epsilon_n^{\sigma} \phi_n^{\sigma}$$

-- KS-DFT is exact only with exact h.x.c. potential:

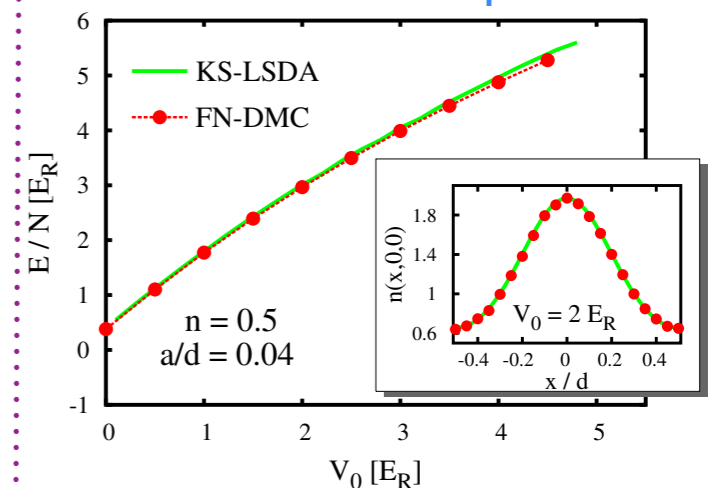
$$V_{\sigma}^{\text{HXC}}(\rho_{\uparrow}, \rho_{\downarrow}; \mathbf{r}) = \frac{\delta}{\delta \rho_{\sigma}(\mathbf{r})} [\epsilon_{\text{HXC}}(\rho_{\uparrow}, \rho_{\downarrow}; \mathbf{r})]$$

-- Local density approximation (LDA) to h.x.c. potential

(See appendix B in thesis.)

Q: How valid is KS-DFT?

A: KS-DFT works (quantitatively) for **shallow** optical lattice



Magnetism in optical lattices

KS-DFT:

$$\left[\frac{1}{\pi^2} (-i\nabla + 2\pi\mathbf{k})^2 + V_{\sigma}^{\text{eff}}(\rho_{\uparrow}, \rho_{\downarrow}; \mathbf{r}) \right] u_{n\mathbf{k}}^{\sigma}(\mathbf{r}) = \epsilon_{n\mathbf{k}}^{\sigma} u_{n\mathbf{k}}^{\sigma}(\mathbf{r})$$

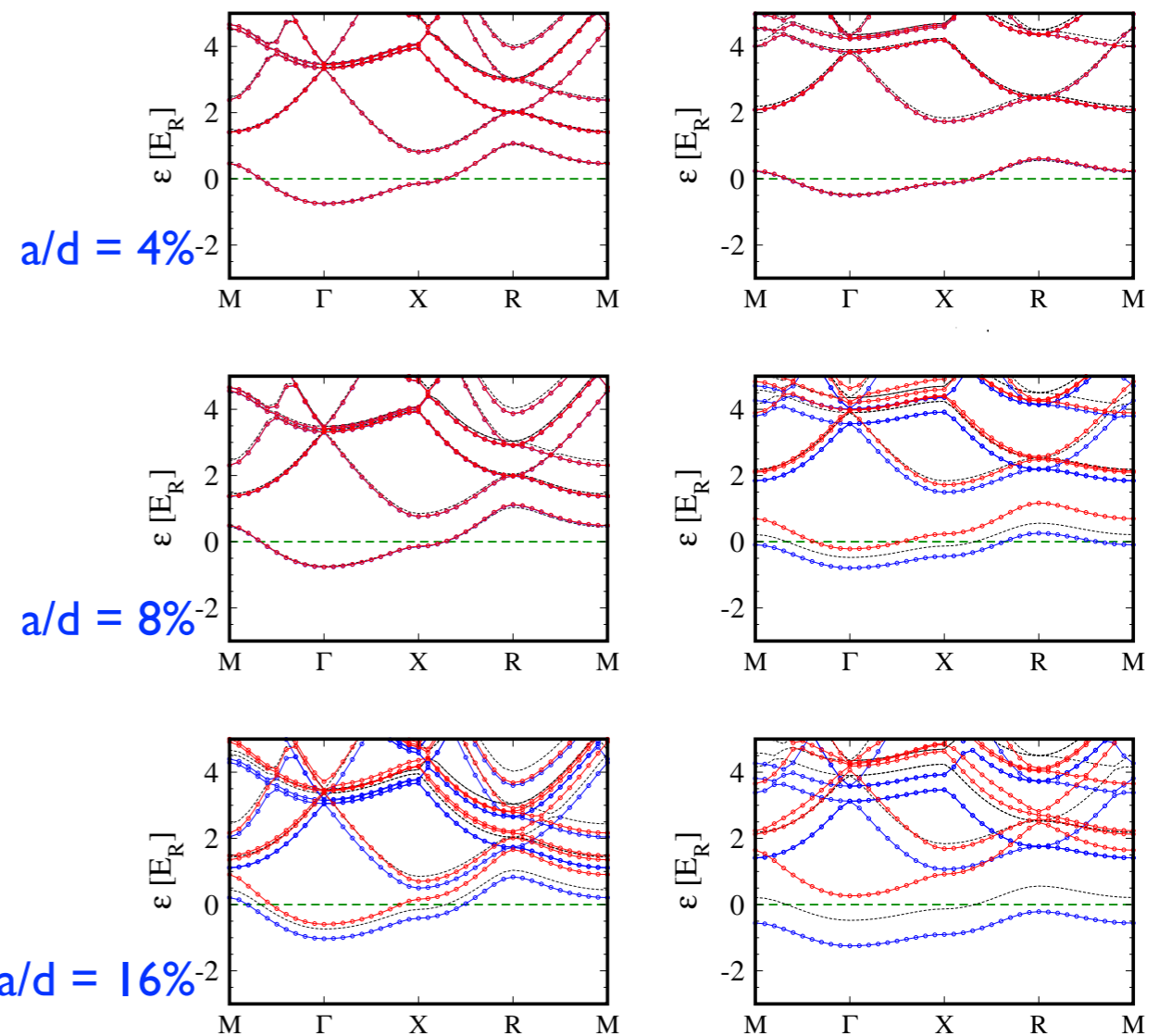
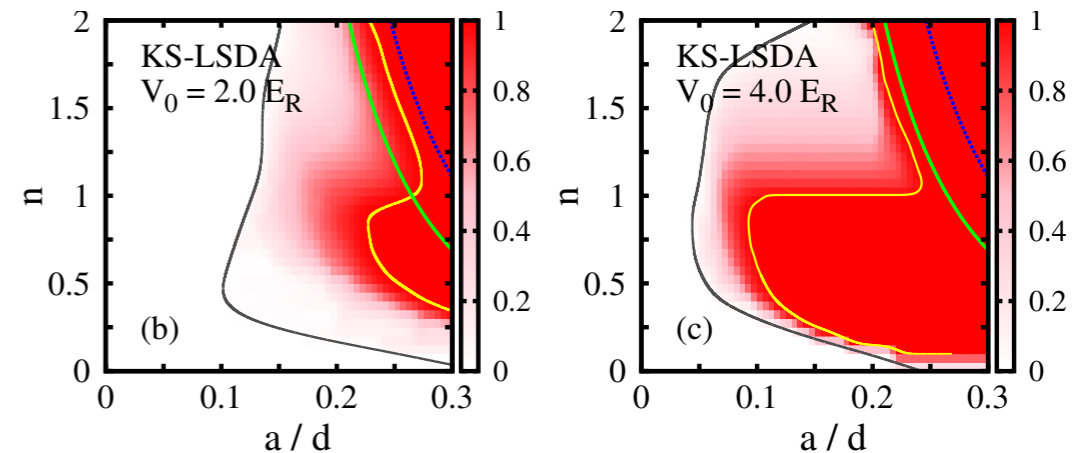
simple cubic (sc) lattice:

$$\mathbf{b}_1 = \hat{\mathbf{x}}, \quad \mathbf{b}_2 = \hat{\mathbf{y}}, \quad \mathbf{b}_3 = \hat{\mathbf{z}}$$

Notation	\mathbf{k} -point
Γ	$(0, 0, 0)$
X	$(1/2, 0, 0)$
M	$(1/2, 1/2, 0)$
R	$(1/2, 1/2, 1/2)$

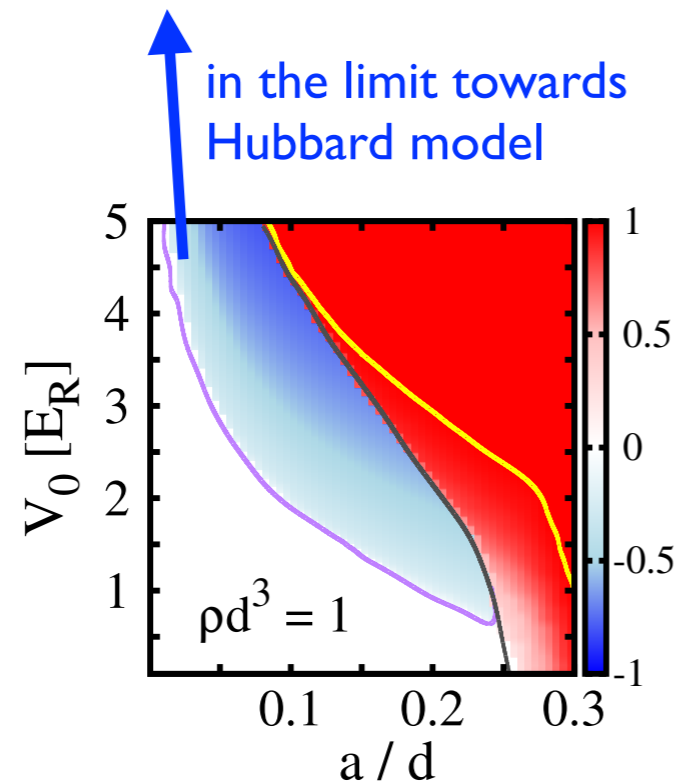
Conclusion:

Band structure effects
stabilizes ferromagnetism.

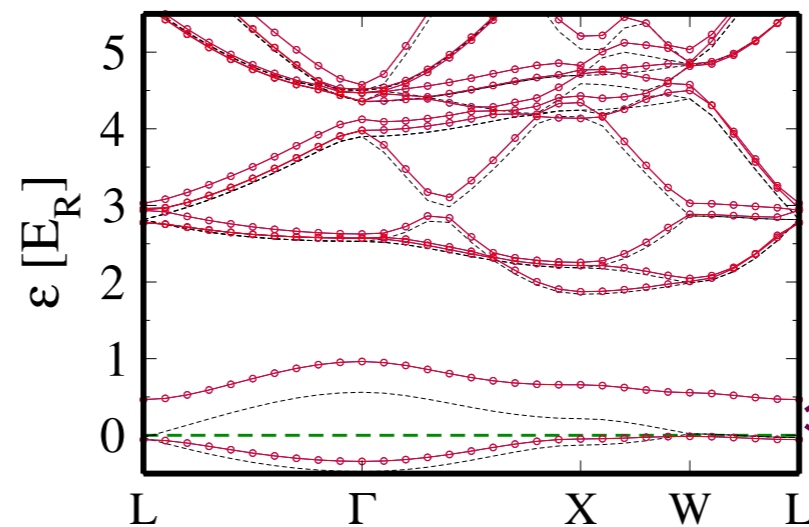


Magnetism in optical lattices

Antiferromagnetism:



$V_0/E_R = 4, a/d = 8\%$:



fcc lattice:

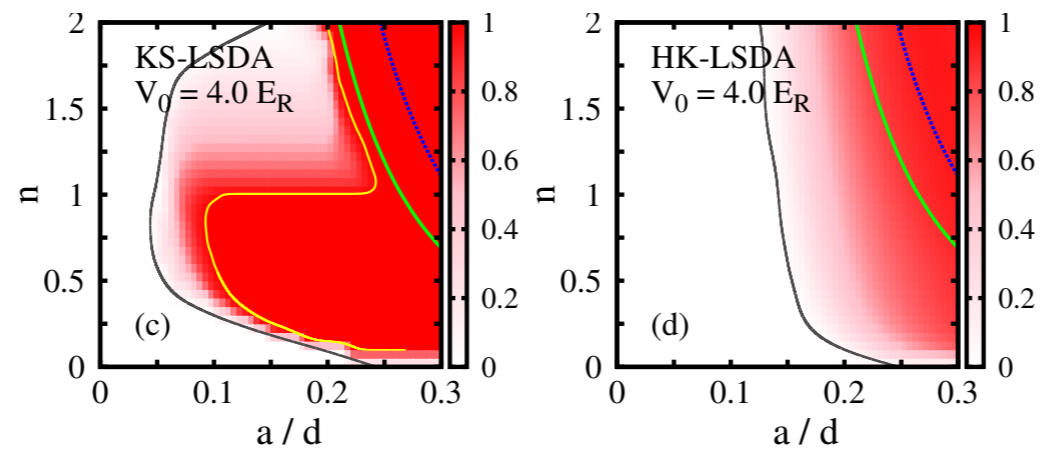
Notation	\mathbf{k} -point
Γ	$(0, 0, 0)$
X	$(\frac{1}{2}, 0, 0)$
W	$(\frac{1}{4}, \frac{1}{2}, 0)$
L	$(\frac{1}{4}, \frac{1}{4}, \frac{1}{4})$

- qualitatively correct (AFM ground state) towards the Hubbard limit.
- AFM phase can be deduced indirectly by probing Δ_{SDW}
- Cooling towards GS is an experimental challenge!

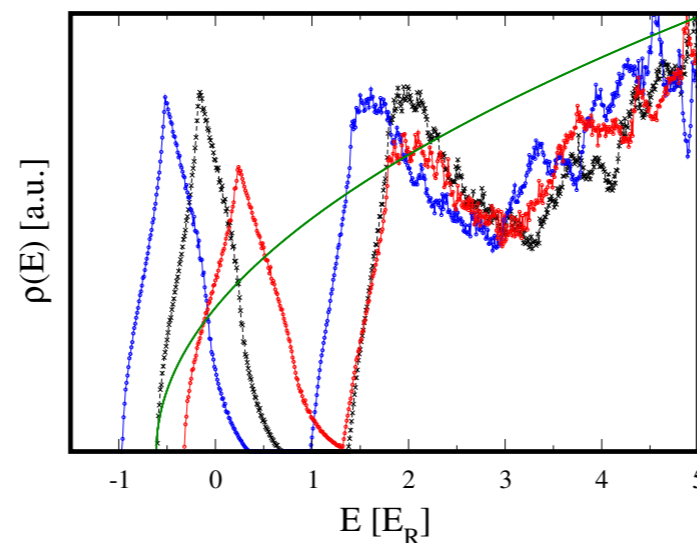
Magnetism in optical lattices

Inadequacy of Hohenberg-Kohn DFT (HK-DFT):

Phase diagram:



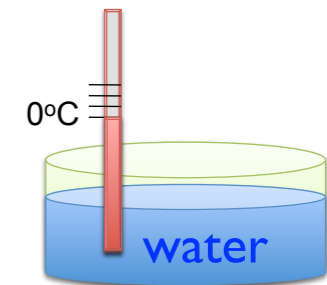
Density-of-states:



Thermometry

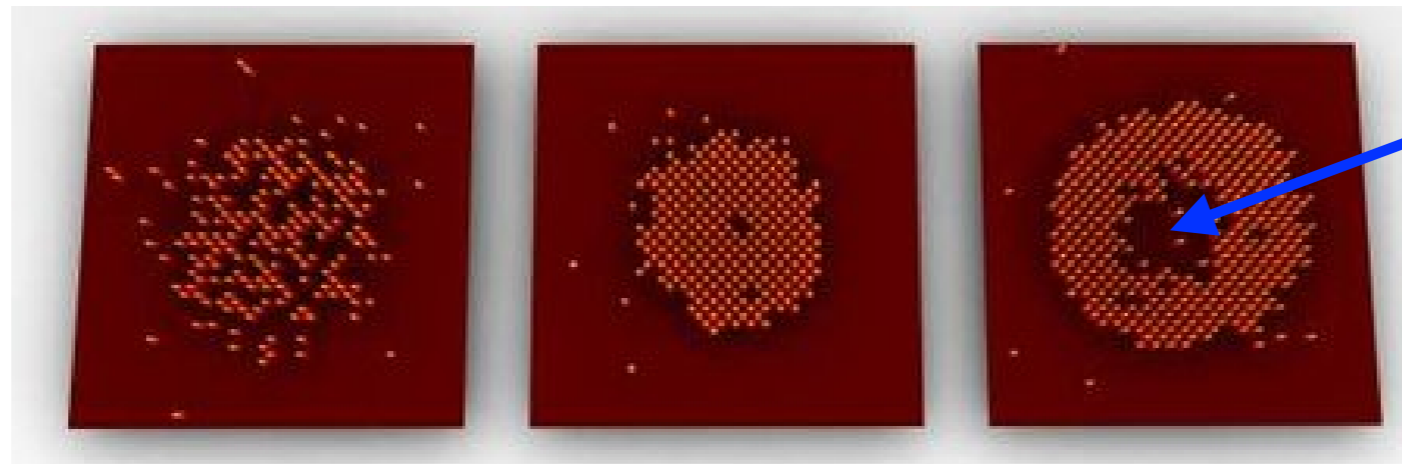
In-situ density images:

mercury thermometer



non-destructive measurement

destructive measurement



J. F. Sherson, et al, Nature **467**, 68 (2010)

Unable to distinguish a doublon

Fluorescence experiment: a single measurement of atom distribution of bosons in an optical lattice. Single-site resolution

We can then collect a timeseries of density measurements, thereby able to evaluate density-related observables, for instance:

1. average density , i.e. $\langle n(r) \rangle$
2. density correlations , i.e. $\langle n(r)n(r') \rangle - \langle n(r) \rangle \langle n(r') \rangle$

Fluctuation-Dissipation Thermometry

Fluctuation-dissipation theorem:

$$\frac{\partial \langle n(\vec{r}) \rangle}{\partial \mu} = \beta [\langle n(\vec{r})N \rangle - \langle n(\vec{r}) \rangle \langle N \rangle]$$

Local Density Approximation

$$n(\mathbf{r}; T, \mu) = n_o(\mu(\mathbf{r}), T) \quad , \text{ where } \mu(\mathbf{r}) = \mu - V(\mathbf{r})$$

$$(V(\mathbf{r}) = \frac{1}{2} M \omega^2 \mathbf{r}^2)$$

(Thereby, we have $\frac{d\mu(\mathbf{r})}{dr} = -M\omega^2 r$ and $\frac{\delta \langle n(\mathbf{r}) \rangle}{\delta \mu(\mathbf{r})} = -\frac{1}{M\omega^2 r} \frac{\partial \langle n(\mathbf{r}) \rangle}{\partial r}$.)

Universal Thermometry:

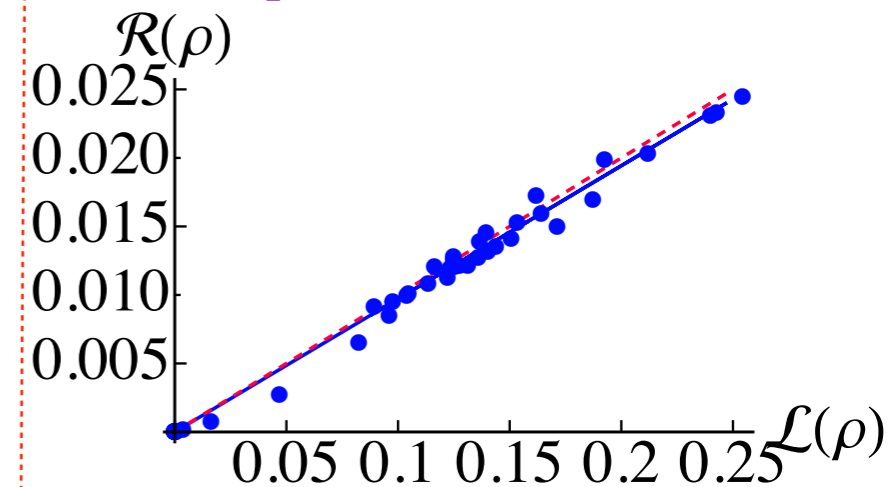
$$\frac{k_B}{M\omega^2 r} \frac{\partial \langle n(\vec{r}) \rangle}{\partial r} \times T = \langle n(\vec{r})N \rangle - \langle n(\vec{r}) \rangle \langle N \rangle$$

or : $L(r) \times T = R(r)$

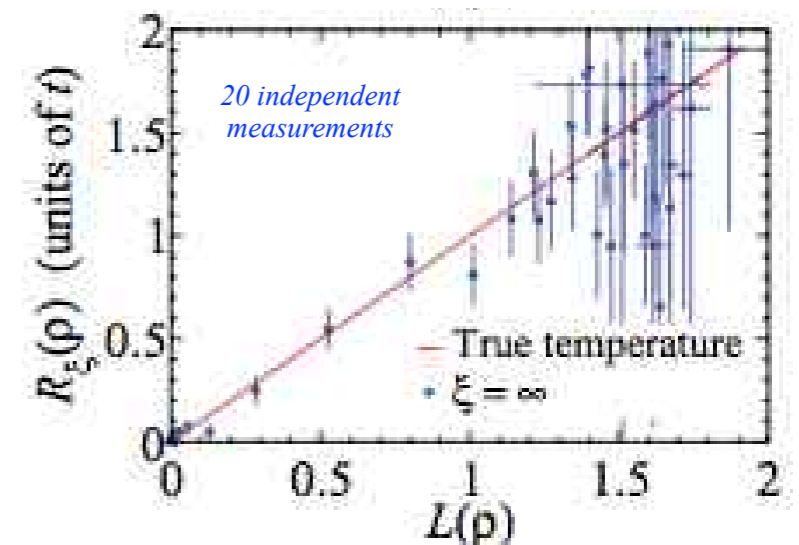
Q. Zhou, T-L. Ho,

Universal thermometry for quantum simulation,
Phys. Rev. Lett **106**, 225301 (2011)

1200 non-interacting fermions,
2D optical lattice, $T/t = 0.1$



125 000 interacting bosons,
3D optical lattice, $T/t = 1.0$



Uncontrolled statistical noise!

Fluctuation-Dissipation Thermometry

Window-sizing:

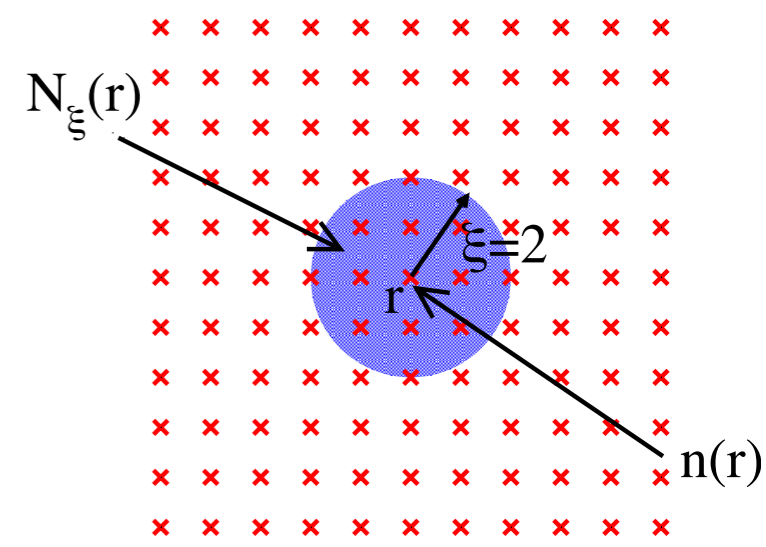
$$R_\xi(\rho) = \int d\rho' \{ \langle n(\rho)n(\rho') \rangle - \langle n(\rho) \rangle \langle n(\rho') \rangle \} \theta(\xi - |\rho - \rho'|).$$

$$L(\rho) = - \frac{1}{M\omega^2\rho} \frac{\partial \langle n(\rho) \rangle}{\partial \rho}$$

- density-density correlation length
- unknown in reality
- yet can be "obtained" by slowly enlarging the "window size"

where the 3D density is integrated along the line-of-sight:

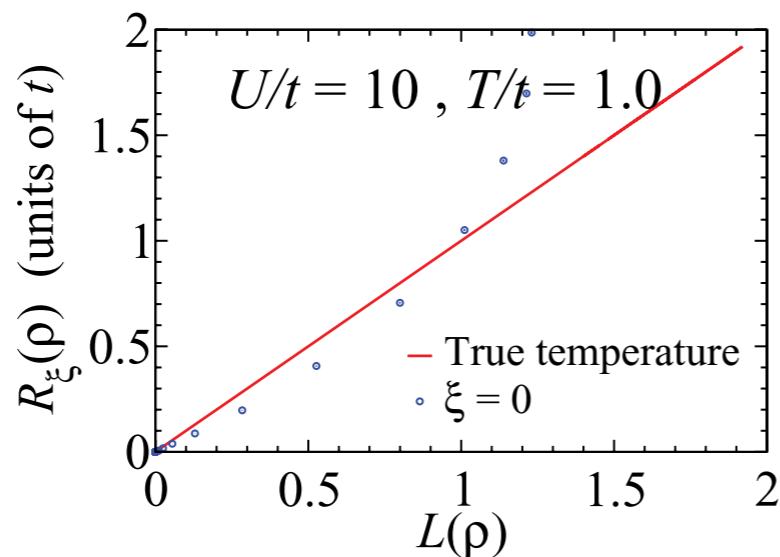
$$\langle n(\rho) \rangle = \int dz \langle n(\mathbf{r}) \rangle,$$



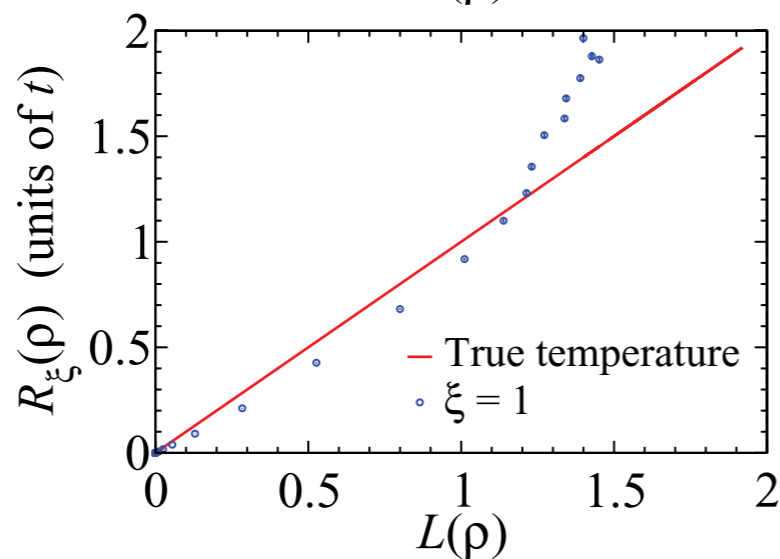
Graphical illustration of $\xi = 2$

Systematic error arises due to lack of correlations

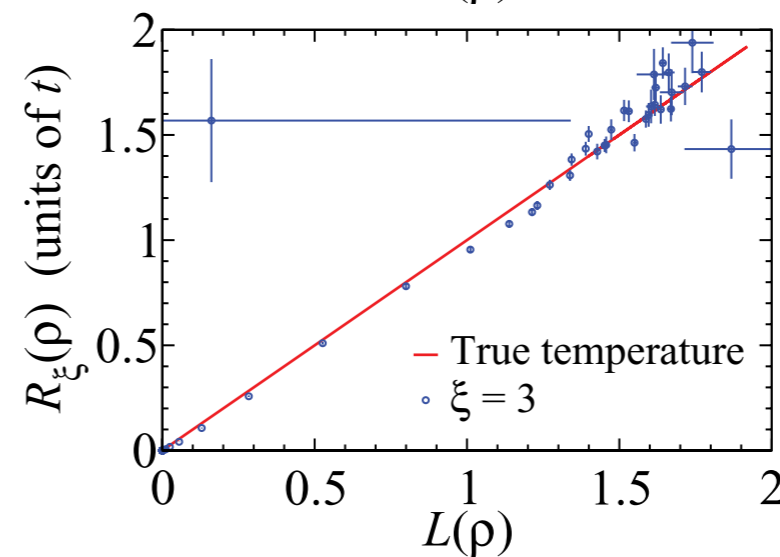
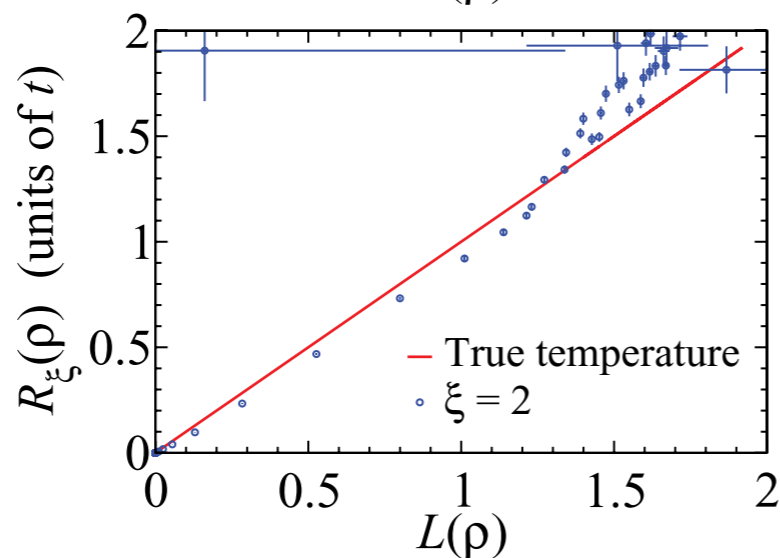
0



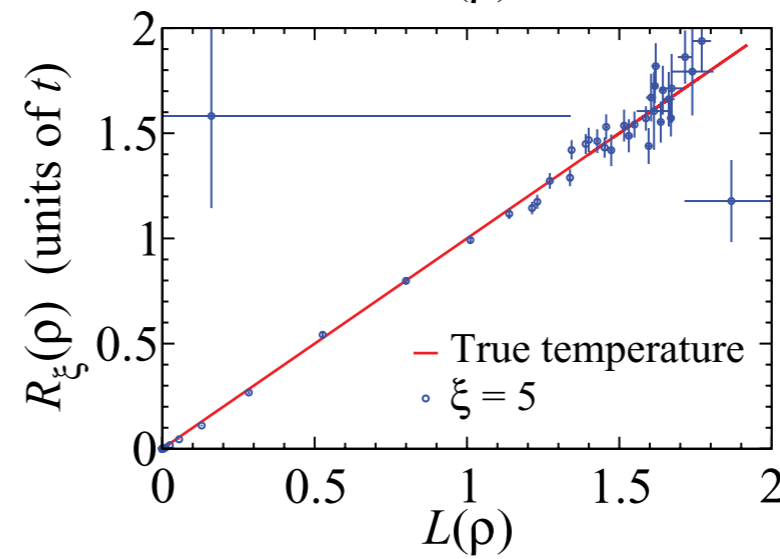
1



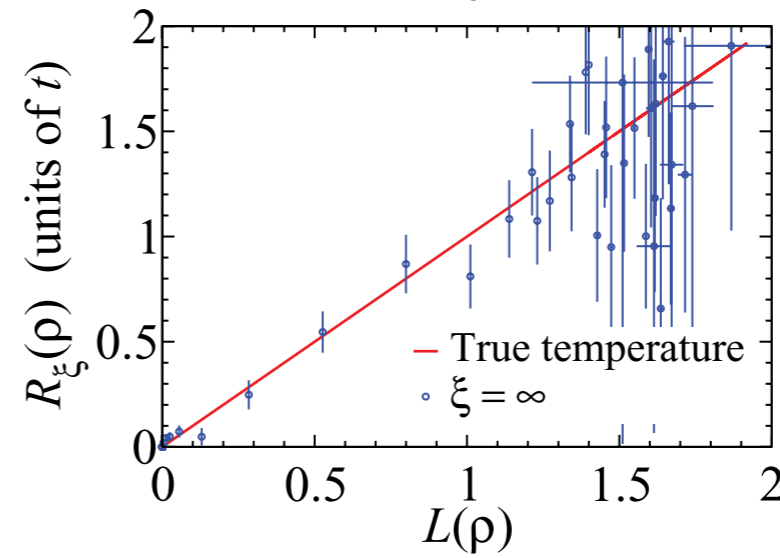
2



3



5



∞

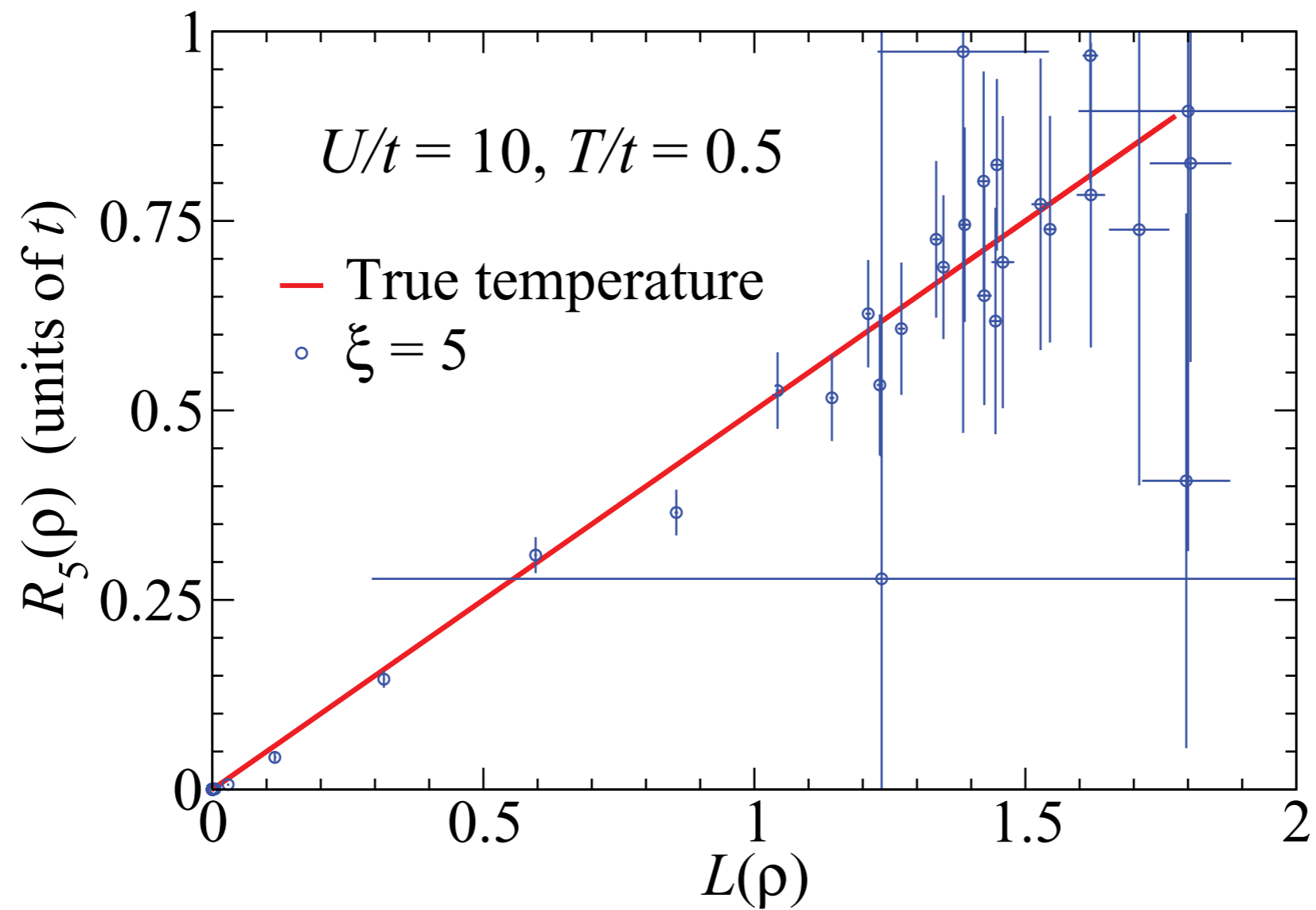
Statistical noise arises with increasing ξ

Number of independent shots required to estimate the temperature within 5% accuracy

System	Number of shots	
	$\xi = 3$	$\xi = \infty$
$U/t = 10, T/t = 1$	20	$O(10^4)$
$U/t = 10, T/t = 3$	14	$O(10^4)$
$U/t = 50, T/t = 1$	21	$O(10^4)$
$U/t = 50, T/t = 3$	12	$O(10^4)$

- The simple trick of “*window-sizing*” leads to orders-of-magnitude improvement!
- Statistical noise is drastically reduced.
- Fluctuation-dissipation thermometry will remain a feasible tool so long as the density-density correlation length remains short !

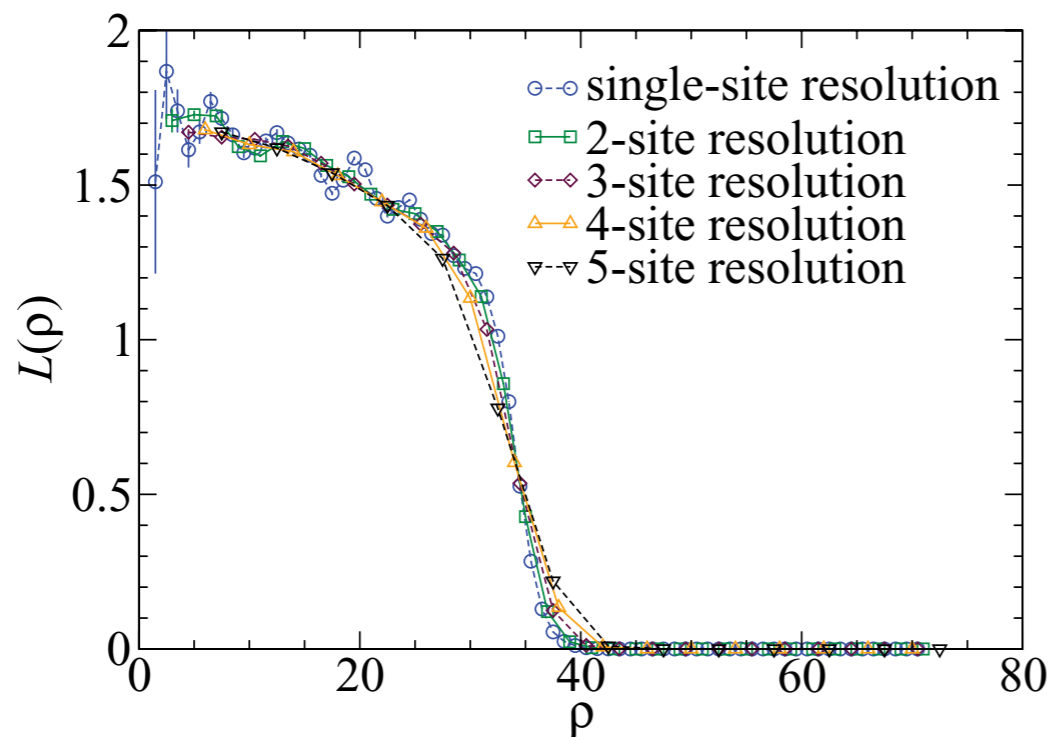
At a lower temperature, a larger window is needed due to increasing correlation length :



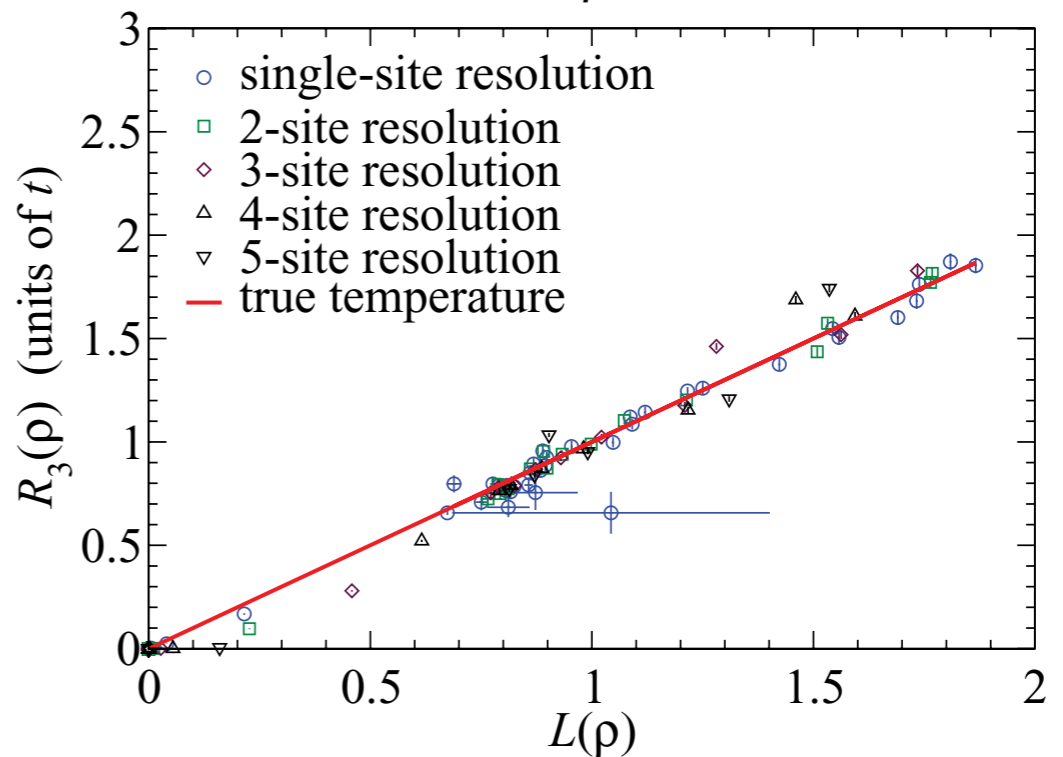
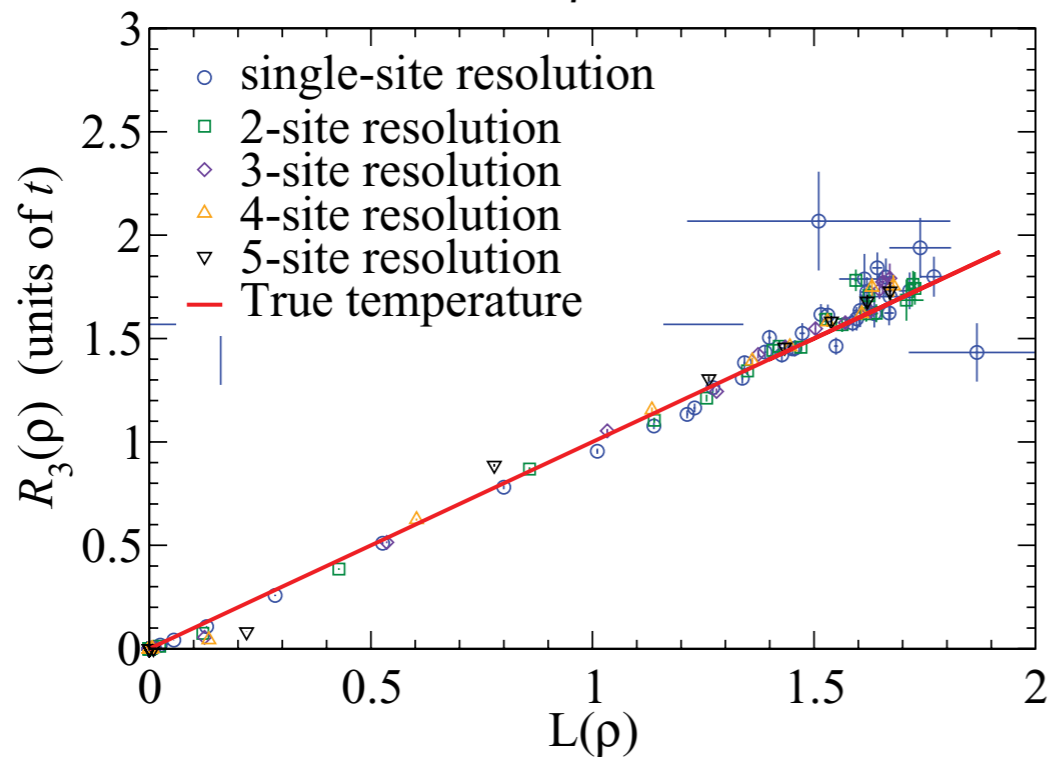
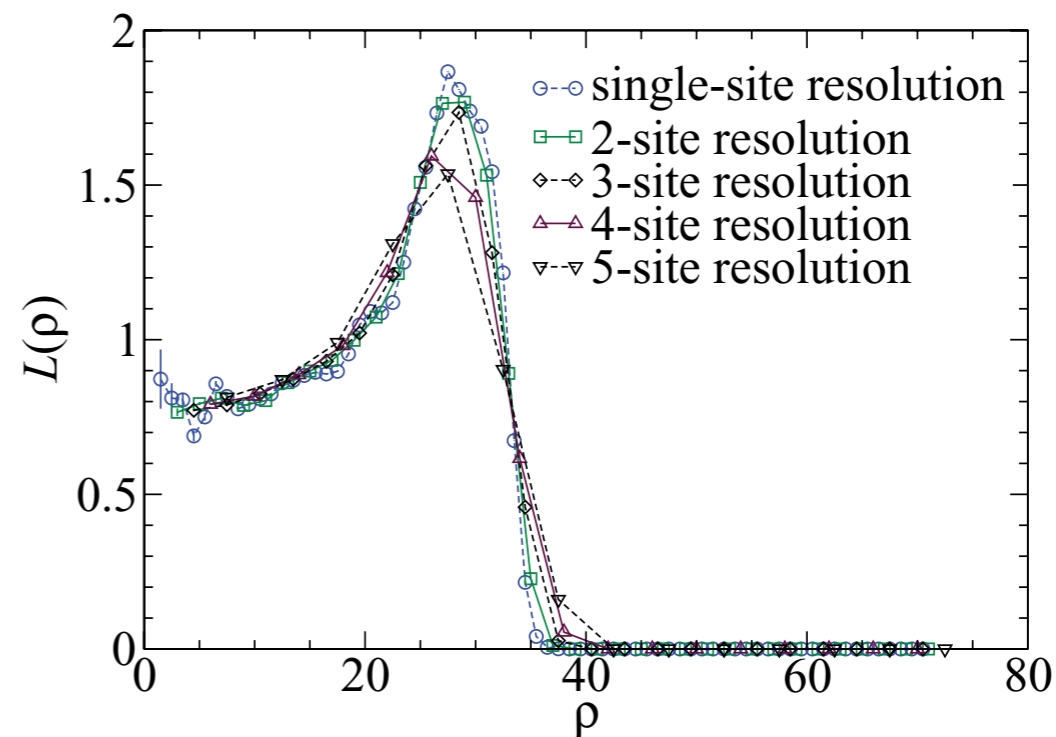
100 shots

Lower Resolution

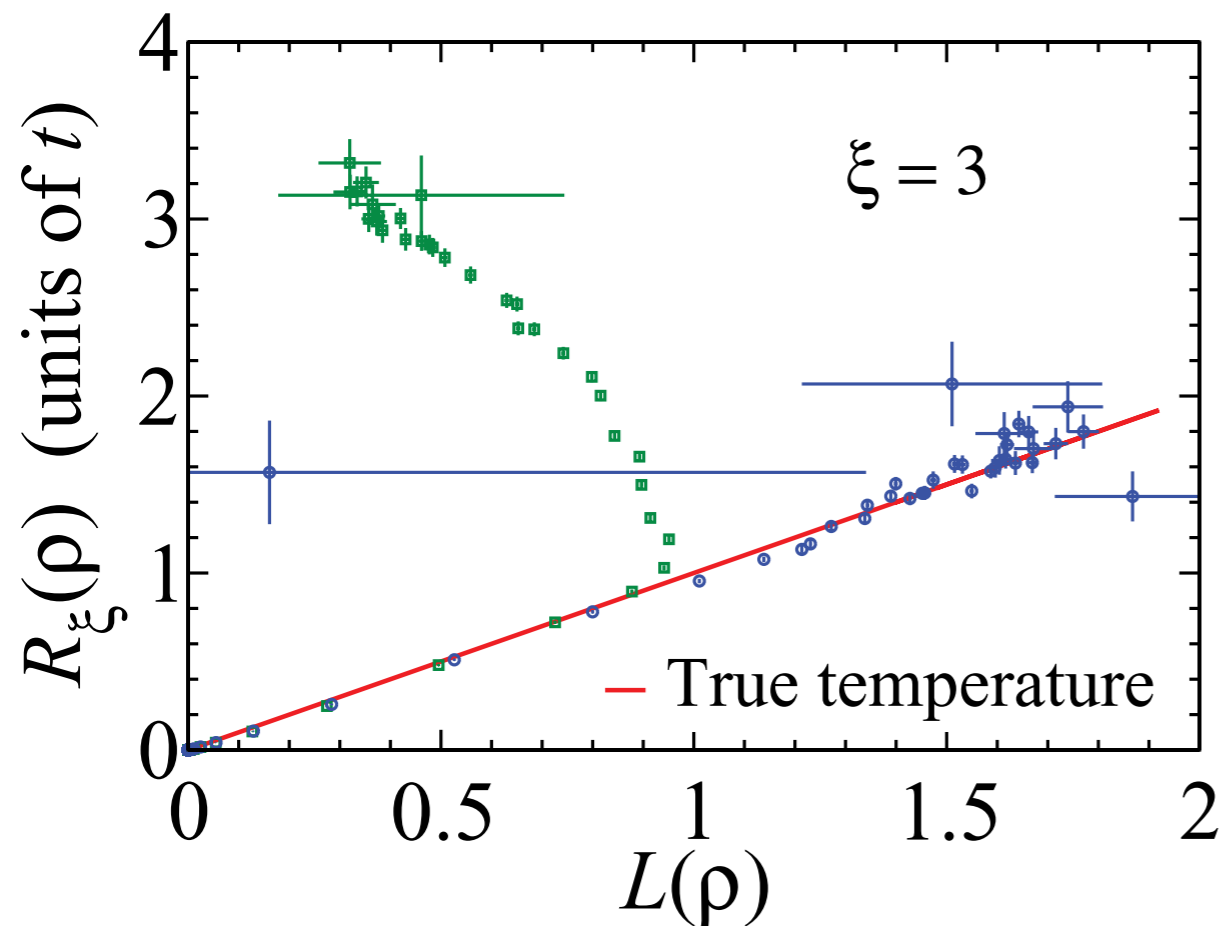
$U/t = 10, T/t = 1.0$



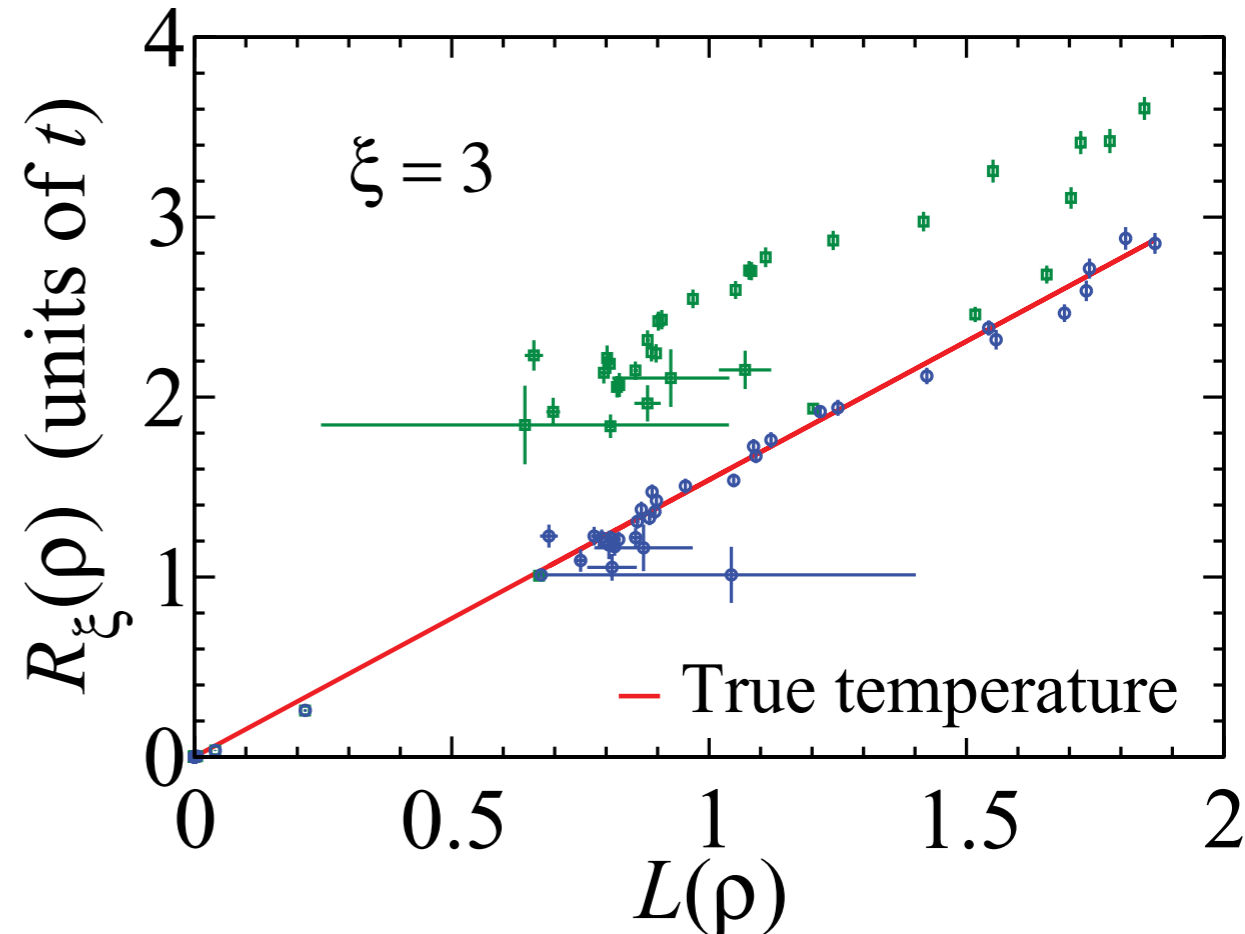
$U/t = 50, T/t = 1.0$



Fluorescence experiments can only detect parity densities



$U/t = 10, T/t = 1.0$



$U/t = 50, T/t = 1.0$

Can only trust measurements with densities $< \sim 0.4 \dots$

- normal measurements
- parity measurements

Wing Thermometry

- To fit the wings of 2D cross sectional density profile against HTE2 (or better) density.
- Expand the partition function exact up to $(\beta t)^2$

HTE0 :

$$\langle n_i^{(0)} \rangle = \frac{1}{Z_i^{(0)}} \sum_{\{n_i\}} n_i e^{-\beta(D_i - \mu_i n_i)}$$

$$Z_i^{(0)} = \sum_{\{n_i\}} e^{-\beta(D_i - \mu_i n_i)}$$

$$D_i = \frac{U}{2} n_i (n_i - 1)$$

-- only valid deep in the normal phase

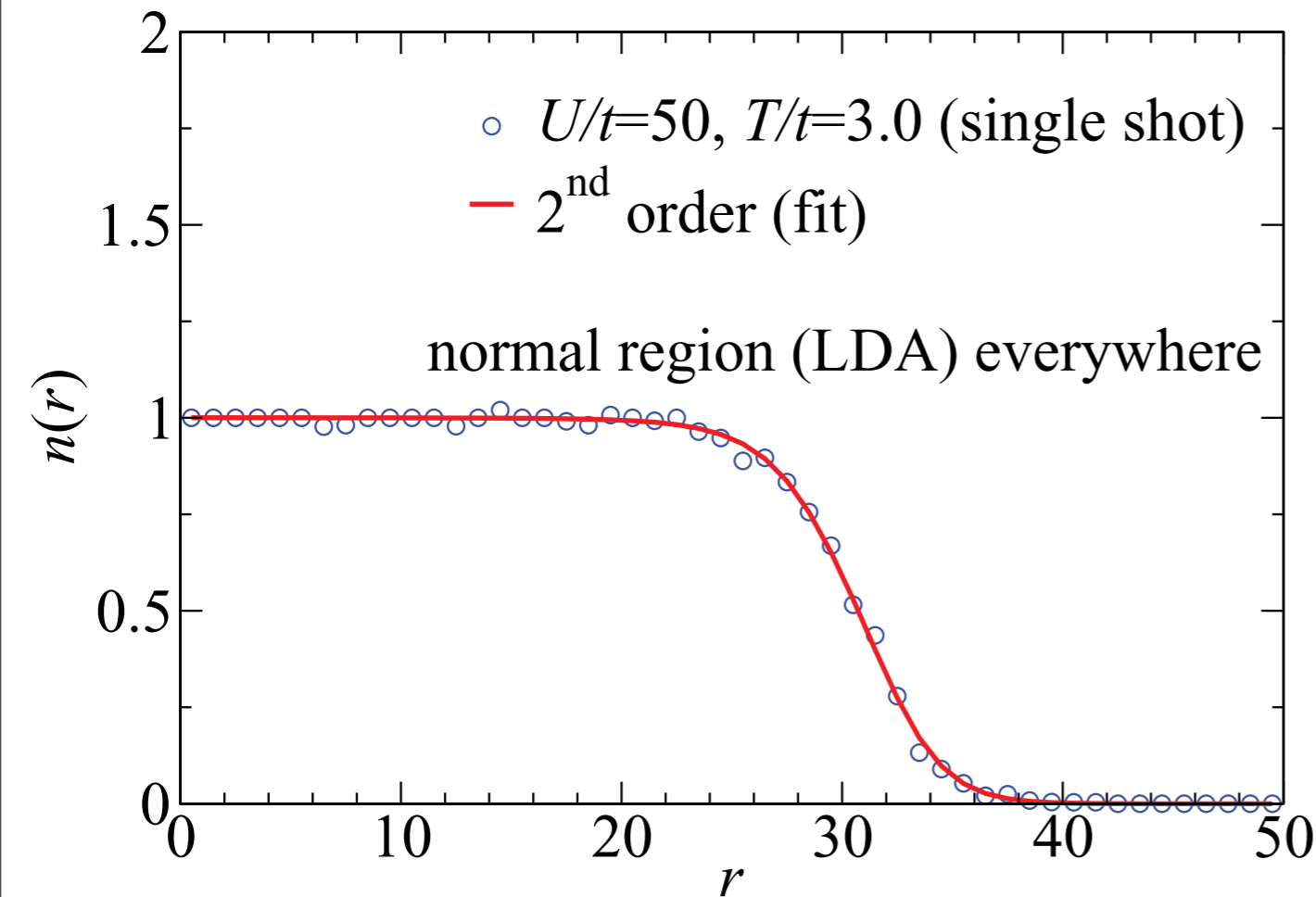
HTE2 :

$$\begin{aligned} \langle n_i \rangle = \langle n_i^{(0)} \rangle + \sum_{\langle i,j \rangle} \frac{(-\beta t)^2}{Z_i^{(0)} Z_j^{(0)}} \\ \times \left[\sum_{\{n_i, n_j\}}^{(-,+)} \left(\delta n_i + \frac{\chi_{ij}^\delta}{\Gamma_{ij}^\delta} \right) n_i n_j^\delta e^{-\beta(D_i + D_j - \mu_i n_i - \mu_j n_j)} \Gamma_{ij}^\delta \right. \\ \left. + \sum_{\{n_i, n_j\}}^{(+,-)} \left(\delta n_i - \frac{\chi_{ji}^\delta}{\Gamma_{ji}^\delta} \right) n_i^\delta n_j e^{-\beta(D_i + D_j - \mu_i n_i - \mu_j n_j)} \Gamma_{ji}^\delta \right] \end{aligned}$$

$$\Gamma_{ij}^\delta = \frac{1 - e^{\beta \gamma_{ij}^\delta}}{(\beta \gamma_{ij}^\delta)(\beta \gamma_{ji})} - \frac{1 - e^{\beta(\gamma_{ij}^\delta + \gamma_{ji})}}{(\beta \gamma_{ij}^\delta + \beta \gamma_{ji})(\beta \gamma_{ji})}$$

$$\begin{aligned} \chi_{ij}^\delta = \frac{e^{\beta \gamma_{ij}^\delta}}{(\beta \gamma_{ij}^\delta)(\beta \gamma_{ji})} + \frac{1 - e^{\beta(\gamma_{ij}^\delta + \gamma_{ji})}}{(\beta \gamma_{ij}^\delta + \beta \gamma_{ji})(\beta \gamma_{ji})^2} \\ - \frac{(1 - e^{\beta \gamma_{ij}^\delta})(\beta \gamma_{ij}^\delta - \beta \gamma_{ji})}{(\beta \gamma_{ij}^\delta)^2 (\beta \gamma_{ji})^2}, \end{aligned}$$

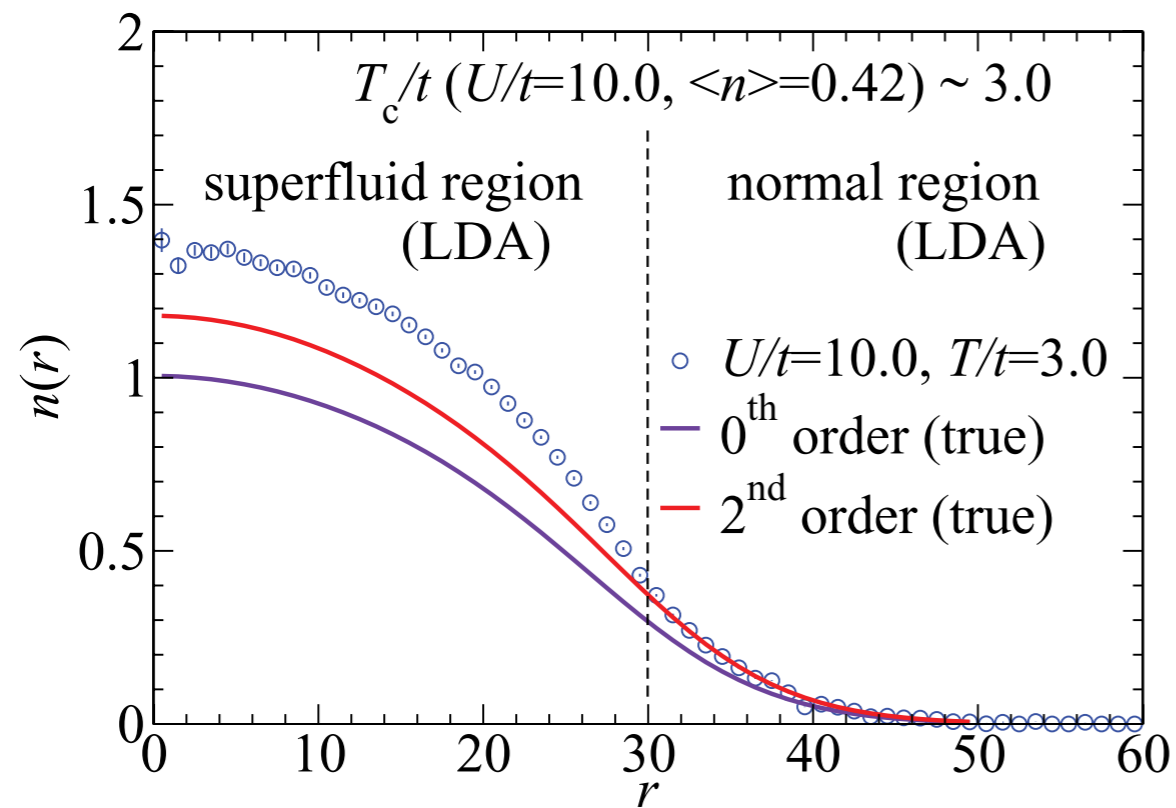
Wing Thermometry



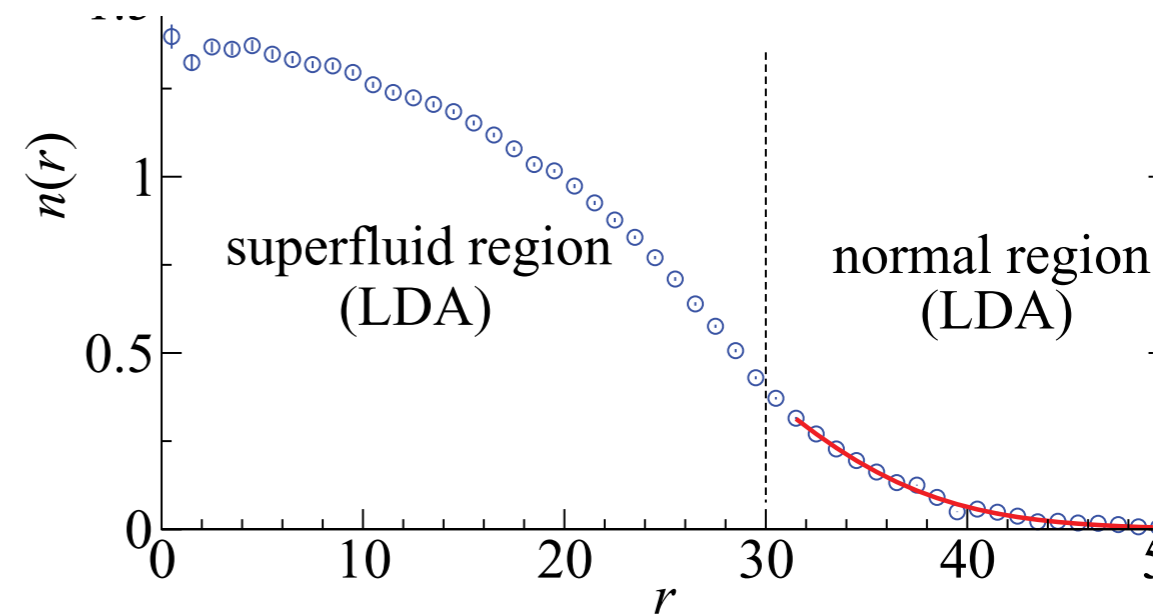
- Should the entire system be in the normal phase, no more than **a single measurement** is needed to estimate the temperature accurately!
- Whenever possible, HTE2 is the choice of preference for thermometry.

Wing Thermometry

HTE0 / HTE2 Theory in a Picture



Fitting density “wings” to HTE2



- HTE0 works poorly.
- HTE2 captures the entire normal phase.
- *HTE2 works better with larger normal region.*

- The wings of 2D cross sectional density profile is fitted to HTE2 density.

Directed worm algorithm

Feynmann perturbation (boson Hubbard model):

$$Z = \sum_{m=0}^{\infty} \sum_{i_1 \dots i_m} e^{-\beta \epsilon_1} \int_0^{\beta} d\tau_1 \dots \int_0^{\tau_{m-1}} d\tau_m (e^{-\tau_1 \epsilon_1} V_{i_1 i_2} e^{\tau_1 \epsilon_2}) \dots (e^{-\tau_m \epsilon_m} V_{i_m i_1} e^{\tau_m \epsilon_1})$$

or simply:

$$Z = \sum_{\mathcal{C}} Z(\mathcal{C})$$

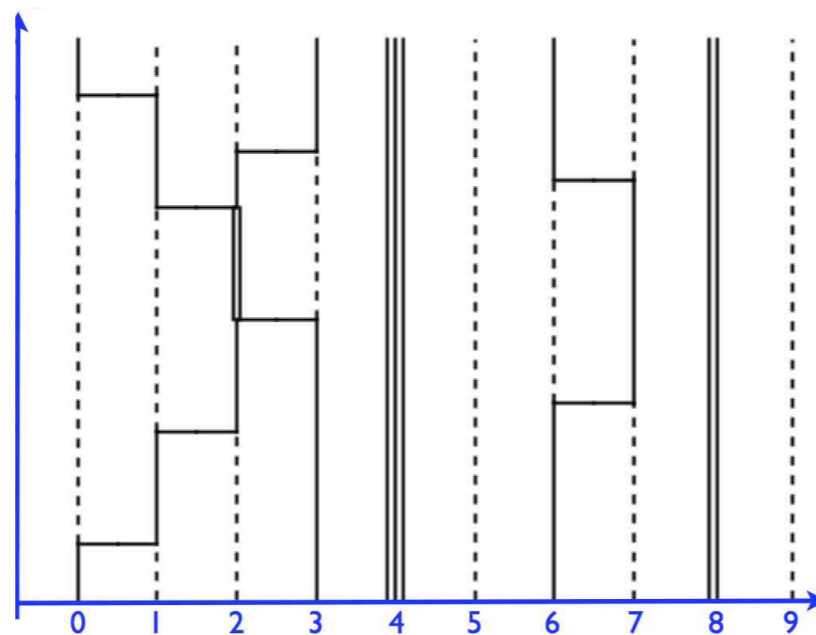
$$\hat{H}_0 = \frac{U}{2} \sum_i n_i(n_i - 1) - \sum_i \mu_i n_i$$

$$\hat{V} = t \sum_{\langle i,j \rangle} \hat{b}_i^\dagger \hat{b}_j$$

$$\hat{H}_0|i\rangle = \epsilon_i|i\rangle$$

$$V_{ij} = \langle i|\hat{V}|j\rangle$$

Worldlines configuration



In this example:

$$|i_1\rangle = |0, 1, 0, 1, 3, 0, 1, 0, 2, 0\rangle$$

$$|i_2\rangle = |0, 0, 1, 1, 3, 0, 1, 0, 2, 0\rangle$$

$$|i_3\rangle = |0, 0, 1, 1, 3, 0, 0, 1, 2, 0\rangle$$

$$|i_4\rangle = |0, 0, 2, 0, 3, 0, 0, 1, 2, 0\rangle$$

$$|i_5\rangle = |0, 1, 1, 0, 3, 0, 0, 1, 2, 0\rangle$$

$$|i_6\rangle = |0, 1, 1, 0, 3, 0, 1, 0, 2, 0\rangle$$

$$|i_7\rangle = |0, 1, 0, 1, 3, 0, 1, 0, 2, 0\rangle$$

$$|i_8\rangle = |1, 0, 0, 1, 3, 0, 1, 0, 2, 0\rangle$$

$$V_{i_1 i_2} = 1, V_{i_2 i_3} = 1, V_{i_3 i_4} = 1, V_{i_4 i_5} = \sqrt{2}$$

$$V_{i_5 i_6} = \sqrt{2}, V_{i_6 i_7} = 1, V_{i_7 i_8} = 1, V_{i_8 i_1} = 1$$

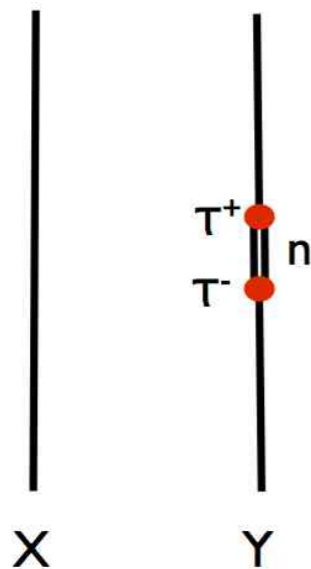
$$N : N(\mathcal{C}) = 8$$

$$E_0 : E_0(\mathcal{C}) = 16$$

Directed worm algorithm

L. Pollet, K.V. Houcke, S. M.A. Rombouts,
Engineering local optimality in QMC algorithms,
J. Comp. Phys. **225/2**, 2249-2266 (2007)

Creation/ Annihilation of worms



$$P_{\text{acceptance}} (X \rightarrow Y) = 1$$

$$P_{\text{acceptance}} (Y \rightarrow X) = 1$$

$$Z(X) = 4\beta L$$

$$Z(Y) = n$$

$$P(X \rightarrow Y) = \frac{1}{4\beta L}$$

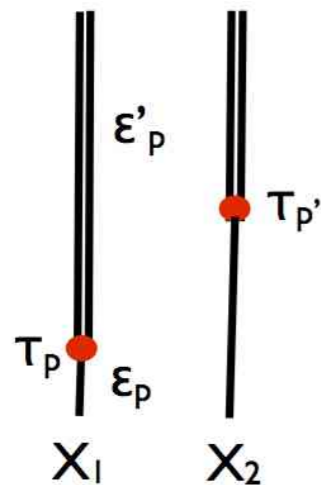
$$P(Y \rightarrow X) = \frac{1}{n}$$

Move is globally balanced.

Directed worm algorithm

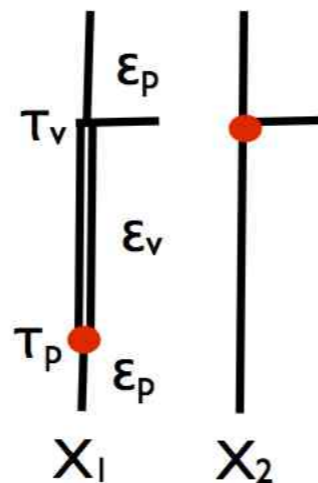
L. Pollet, K.V. Houcke, S. M.A. Rombouts,
Engineering local optimality in QMC algorithms,
J. Comp. Phys. **225/2**, 2249-2266 (2007)

Movement of worms:



1. not halted

$$P(X_1 \rightarrow X_2) = \epsilon_p e^{-\epsilon_p \tau_{p'p}}$$



2. halted

$$P(X_1 \rightarrow X_2) = \int_{\tau_{vp}}^{\infty} \epsilon_p e^{-\epsilon_p \tau_{p'p}} d\tau_{p'p}$$

$$P(X_1 \rightarrow X_2) = e^{-\epsilon_p \tau_{vp}}$$

1. QMC-DWA assigns:

$$\tau_{p'p} \sim \text{Exp}(\epsilon_p)$$

⇒ Choose a exponential random number.

2. It either gets halted or not.

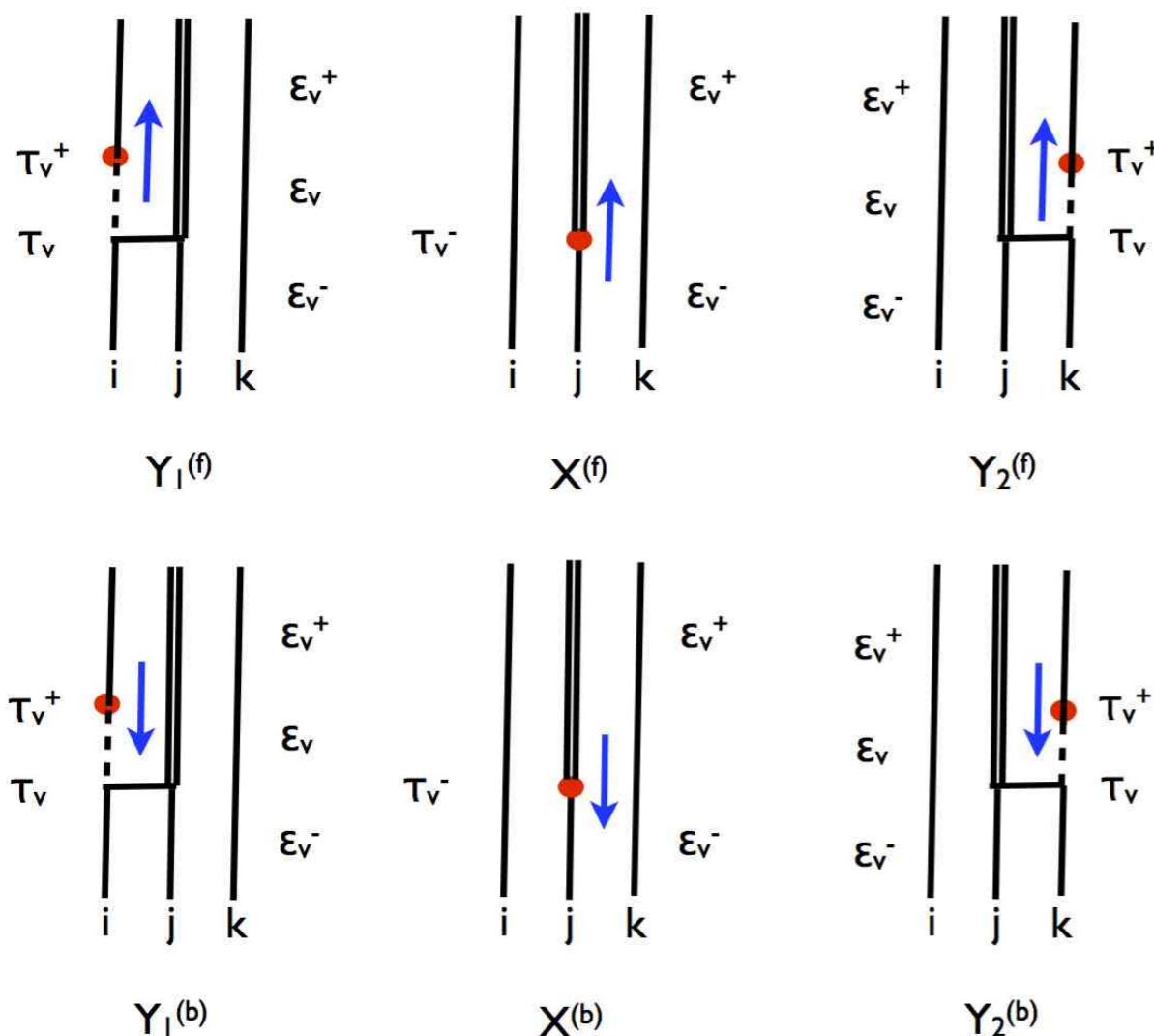
3. Memoryless

Move is **NOT** globally balanced.

Directed worm algorithm

L. Pollet, K.V. Houcke, S. M.A. Rombouts,
Engineering local optimality in QMC algorithms,
J. Comp. Phys. **225/2**, 2249-2266 (2007)

1) Inserting vertex, 2) deleting vertex, 3) relinking vertex, or 4) worm bounce:



1. QMC-DWA assigns:

$$P(X, Y_1, Y_2 \rightarrow X) = \epsilon_{v-} \langle i_{v+} | \hat{b}_j^\dagger | i_{v-} \rangle$$

$$P(X, Y_1, Y_2 \rightarrow Y_1) = t \langle i_{v+} | \hat{b}_i^\dagger | i_v \rangle \langle i_v | \hat{b}_i \hat{b}_j^\dagger | i_{v-} \rangle$$

$$P(X, Y_1, Y_2 \rightarrow Y_2) = t \langle i_{v+} | \hat{b}_k^\dagger | i_v \rangle \langle i_v | \hat{b}_k \hat{b}_j^\dagger | i_{v-} \rangle$$

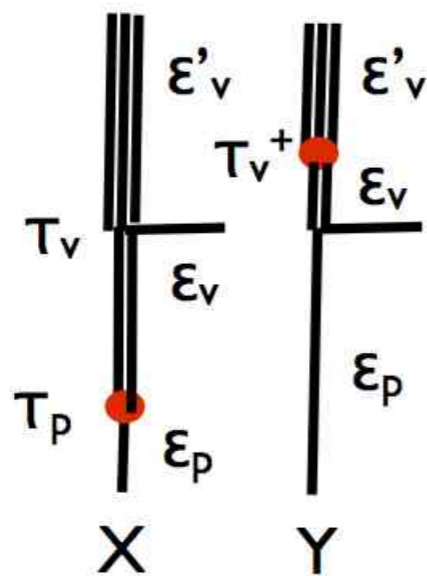
2. The following moves are globally balanced:

- unhalted move + insert vertex/ bounce worm
- halted move + delete/relink vertex/ bounce worm

Directed worm algorithm

L. Pollet, K.V. Houcke, S. M.A. Rombouts,
Engineering local optimality in QMC algorithms,
J. Comp. Phys. **225/2**, 2249-2266 (2007)

Crossing vertex:



1. It gets halted by like-vertex.
2. It crosses the vertex with acceptance probability 1

$$Z(X) = e^{-\epsilon_p \tau_p} \langle i_v | \hat{b}^\dagger | i_p \rangle e^{\epsilon_v \tau_p} \times e^{-\epsilon_v \tau_v} \langle i'_v | \hat{b}^\dagger | i_v \rangle e^{\epsilon'_v \tau_v}$$

$$Z(Y) = e^{-\epsilon_p \tau_v} \langle i_v | \hat{b}^\dagger | i_p \rangle e^{\epsilon_v \tau_v} \times e^{-\epsilon_v \tau_v^+} \langle i'_v | \hat{b}^\dagger | i_v \rangle e^{\epsilon'_v \tau_v^+}$$

$$\frac{Z(Y)}{Z(X)} = \frac{e^{-\epsilon_p \tau_{vp}}}{e^{-\epsilon_v \tau_{vp}}}$$

$$P(X \rightarrow Y) = e^{-\epsilon_p \tau_{vp}}$$

$$P(Y \rightarrow X) = e^{-\epsilon_v \tau_{vp}}$$

Move is globally balanced.

ALPS-2.2: QMC-DWA

Implementing QMC-DWA is easy and convenient within ALPS Python!

1. Setup the parameters:

```
import pyalps
parms = {
  'LATTICE' : 'inhomogeneous simple cubic lattice' ,
  'L'       : 60 ,

  'MODEL'   : 'boson Hubbard' ,
  'Nmax'    : 20 ,

  't'       : 1. ,
  'U'       : 60. ,
  'mu'      : '40. - (0.09416*(x-(L-1)/2.)*(x-(L-1)/2.) + 0.12955*(y-(L-1)/2.)*(y-(L-1)/2.) + 0.11496*(z-(L-1)/2.)*(z-(L-1)/2.)'
  'T'       : 1. ,

  'THERMALIZATION' : 1000000 ,
  'SWEEPS'          : 3000000 ,
  'SKIP'            : 1000 ,

  'MEASURE[Local Density]': 1
}
```

2. Run simulation:

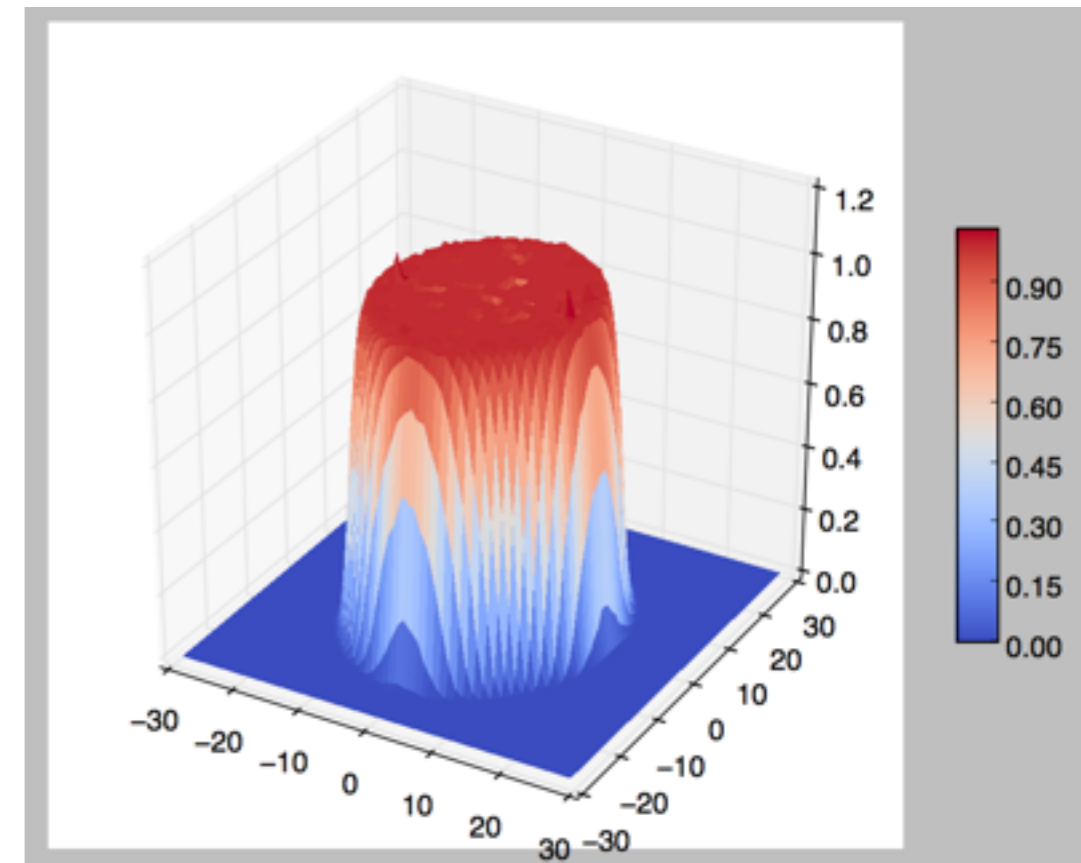
```
input_file = pyalps.writeInputFiles('parm2b', parms)
res = pyalps.runApplication('dwa', input_file)
```

3. Evaluate results:

```
import pyalps
data = pyalps.loadMeasurements(pyalps.getResultFiles(prefix='parm2b'), 'Local Density');
```

4. Visualize:

```
import pyalps.plot as aplt;
aplt.plot3D(data, centeredAtOrigin=True, layer="center")
```



Tutorial example: https://alps.comp-phys.org/mediawiki/index.php/ALPS_2_Tutorials:DWA-02_Density_Profile

Conclusion/Outlook

1. Magnetism in optical lattices

P. N. Ma, S. Pilati, M. Troyer, and X. Dai,
Density functional theory for atomic Fermi gases,
Nature Phys. **8**, 601 (2012)

- ▶ **Density Functional Theory (for shallow fermionic optical lattices)**
- ▶ **Magnetism is stabilized by lattice bandstructure effects**
- ▶ **Phase diagram, ferromagnetism/ antiferromagnetism, SDW gap as indirect probe**

2. Thermometry in optical lattices

P. N. Ma, L. Pollet, and M. Troyer,
Measuring the equation of state of trapped
ultracold bosonic systems in an optical lattice
with in-situ density imaging ,
Phys. Rev. A. **82**, 033627 (2010)

- ▶ **Fluctuation-dissipation thermometry -- feasible via window sizing**
- ▶ **Wing thermometry -- HTE2 valid entirely in normal region.**

3. QMC-DWA implementation in ALPS-2.2

- ▶ **easy and convenient within ALPS Python**