



Application of Tensor Renormalization Group to Quantum Field Theories

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Plan of Talk

- Introduction
- Tensor Renormalization Group (TRG)
- TRG Approaches to Quantum Field Theories
- Application of TRG method to
 - 2D, 4D Complex ϕ^4 at Finite Density
 - 4D Nambu–Jona-Lasinio (NJL) Model at Finite Density
- Summary



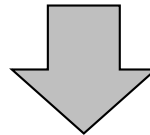
Tensor Network Scheme

What is Tensor Network (TN) Scheme?

Theoretical and numerical methods for high precision analyses of many body problems with tensor network formalism

Advantages of Tensor Renormalization Group (TRG)

Free from sign problem and complex action problem in Monte Carlo method
Computational cost for L^D system size $\propto D \times \log(L)$
Direct treatment of Grassmann numbers
Direct evaluation of partition function Z itself



Applications in particle physics:

Finite density QCD, QFTs w/ θ -term, Lattice SUSY etc.

Also, in condensed matter physics

Hubbard model (Mott transition, High T_c superconductivity) etc.



Tensor Renormalization Group (TRG)

Levin-Nave

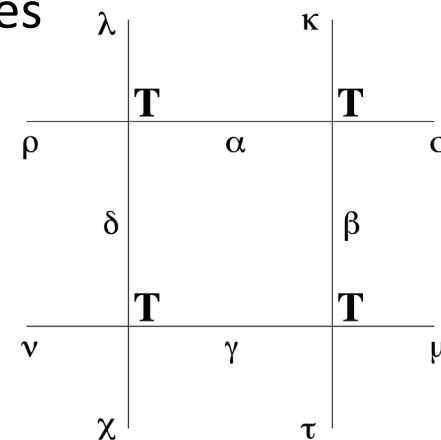
PRL99(2007)120601

Explain the algorithm with 2D Ising model with N sites

$$\text{Hamiltonian } H = \sum_{\langle i,j \rangle} s_i s_j \quad s_i \pm 1$$

$$\text{Partition Function } Z = \sum_{\{s_i\}} \exp(-\beta H)$$

$$= \sum_{\alpha, \beta, \gamma, \delta, \dots=1}^2 T_{\alpha, \lambda, \rho, \delta} T_{\sigma, \kappa, \alpha, \beta} T_{\mu, \beta, \gamma, \tau} T_{\gamma, \delta, \nu, \chi} \dots$$



Tensor Network representation

Details of model are specified in initial tensor

The algorithmic procedure is independent of models

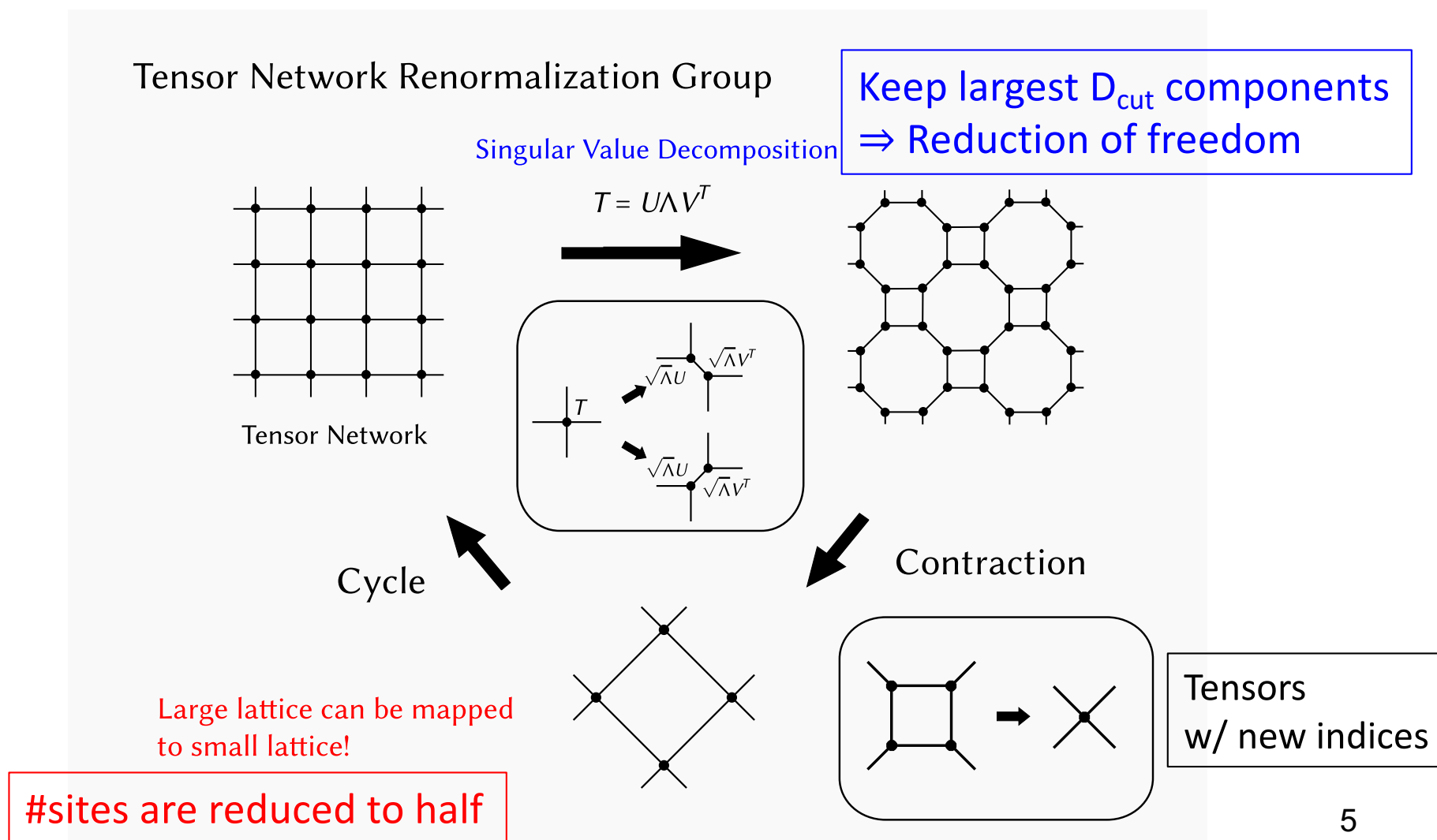
Of course, direct contraction is impossible for large N even with current fastest supercomputer

⇒ How to evaluate the partition function?



Schematic View of TRG Algorithm

1. Singular Value Decomposition of local tensor T
2. Contraction of old tensor indices (coarse-graining)
3. Repeat the iteration





Development of TRG method

Original TRG algorithm (Levin-Nave) is applicable to only 2D models

Applicable to ≥ 3 D models

Higher Order TRG (HOTRG): Xie+, PRB86(2012)045139

Anisotropic TRG (ATRG): Adachi-Okubo-Todo, PRB102(2020)054432

Triad TRG (TTRG): Kadoh-Nakayama, arXiv:1912.02414

Grassmann versions

Grassmann TRG (GTRG): Shimizu-YK, PRD90(2014)014508

Grassmann HOTRG (GHOTRG): Sakai-Takeda-Yoshimura, PTEP2017(2017)063B07

Grassmann ATRG (GATRG): Akiyama-YK-Yamashita-Yoshimura, JHEP01(2021)121

TRG method/approach refers to all the above algorithms
(not restricted to the original one)



Collaborators

Y. Kuramashi, S. Akiyama

U. Tsukuba

Y. Nakamura, (Y. Shimizu)

R-CCS

S. Takeda, Y. Yoshimura

Kanazawa U.

R. Sakai(→Syracuse U.)

D. Kadoh

Doshisha U.

Collaborations are dynamically changed depending on
the research topics



TRG Approaches to QFTs (1)

2D models

Real ϕ^4 theory:

Shimizu, Mod.Phys.Lett.A27(2012)1250035

Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP05(2019)184

Complex ϕ^4 theory at finite density:

Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP02(2020)161

U(1) gauge theory+ θ :

YK-Yoshimura, JHEP04(2020)089

Schwinger, Schwinger+ θ :

Shimizu-YK, PRD90(2014)014508, PRD90(2014)074503,
PRD97(2018)034502

Gross-Neveu model at finite density:

Takeda-Yoshimura, PTEP2015(2015)043B01

N=1 Wess-Zumino model:

Kadoh-YK-Nakamura-Sakai-Takeda-Yoshimura, JHEP03(2018)141

- Free from sign/complex action problems
- Development of numerical algorithms for scalar, fermion, gauge theories



TRG Approaches to QFTs (2)

3D models

Free Wilson fermion :

Sakai-Takeda-Yoshimura, PTEP2017(2017)063B07,

Yoshimura-YK-Nakamura-Takeda-Sakai, PRD97(2018)054511

Z_2 gauge theory at finite temperature :

YK-Yoshimura, JHEP1908(2019)023

4D models

Ising : Akiyama-YK-Yamashita-Yoshimura, PRD100(2019)054510

Complex ϕ^4 theory at finite density :

Akiyama-Kadoh-YK-Yamashita-Yoshimura, JHEP09(2020)177

NJL model at finite density :

Akiyama-YK-Yamashita-Yoshimura, JHEP01(2021)121

Real ϕ^4 theory :

Akiyama-YK-Yoshimura, PRD104(2021)034507

⇒ Now our research target is moving from 2D models to 4D ones



TRG Approaches to QFTs (3)

Condensed matter physics

Similarity btw NJL model and Hubbard model

Action consists of hopping term and four-fermi interaction

$$S = \sum_{n \in \Lambda_{d+1}} \epsilon \left\{ \bar{\psi}(n) \left(\frac{\psi(n + \hat{\tau}) - \psi(n)}{\epsilon} \right) - t \sum_{\sigma=1}^d (\bar{\psi}(n + \hat{\sigma}) \psi(n) + \bar{\psi}(n) \psi(n + \hat{\sigma})) + \frac{U}{2} (\bar{\psi}(n) \psi(n))^2 - \mu \bar{\psi}(n) \psi(n) \right\}$$

First principle calculation at finite chemical potential

(1+1)D Hubbard model: [Akiyama-YK, PRD104\(2021\)014504](#)

(2+1)D Hubbard model: [Akiyama-YK-Yamashita, arXiv:2109.14149](#)

Two examples in this talk

2D, 4D Complex ϕ^4 at Finite Density

4D Nambu–Jona-Lasinio (NJL) Model at Finite Density



2D Complex ϕ^4 Theory at Finite Density

Kadoh+, JHEP02(2020)161

Continuum action of 2D complex ϕ^4 theory at finite μ

$$S_{\text{cont}} = \int d^2x \left\{ |\partial_\rho \phi|^2 + (m^2 - \mu^2) |\phi|^2 + \mu (\phi^* \partial_2 \phi - \partial_2 \phi^* \phi) + \lambda |\phi|^4 \right\}$$

Introduction of finite chemical potential \Rightarrow complex action

Lattice action

$$Z(\text{original}) = \int \mathcal{D}\phi_1 \mathcal{D}\phi_2 \exp(-S)$$

$$S = \sum_n \left[(4 + m^2) |\phi_n|^2 + \lambda |\phi_n|^4 - \sum_{\rho=1}^2 \left(e^{\mu \delta_{\rho,2}} \phi_n^* \phi_{n+\hat{\rho}} + e^{-\mu \delta_{\rho,2}} \phi_{n+\hat{\rho}}^* \phi_n \right) \right]$$

First step is to construct TN representation



Tensor Network Representation

Kadoh+, JHEP02(2020)161

Boltzmann weight is expressed as

$$e^{-S} = \prod_{n \in \Gamma} \prod_{\nu=1}^2 f_{\nu}(\phi_n, \phi_{n+\hat{\nu}})$$

$$f_{\nu}(z, z') = \exp \left\{ -\frac{1}{4} (4 + m^2) (|z|^2 + |z'|^2) - \frac{\lambda}{4} (|z|^4 + |z'|^4) + e^{\mu\delta_{\nu,2}} z^* z' + e^{-\mu\delta_{\nu,2}} z z'^* \right\}$$

⇒ Need to discretize the continuous d. o. f.

Use of Gauss-Hermite quadrature

$$\int_{-\infty}^{\infty} \int_{-\infty}^{\infty} dz_1 dz_2 e^{-z_1^2 - z_2^2} h(z) \approx \sum_{\alpha, \beta=1}^K w_{\alpha} w_{\beta} h\left(\frac{y_{\alpha} + iy_{\beta}}{\sqrt{2}}\right)$$

Discretized version of partition function

$$Z \approx Z(K) = \sum_{\{\alpha, \beta\}} \prod_{n \in \Gamma} w_{\alpha_n} w_{\beta_n} \exp(y_{\alpha_n}^2 + y_{\beta_n}^2) \prod_{\nu=1}^2 f_{\nu}\left(\frac{y_{\alpha_n} + iy_{\beta_n}}{\sqrt{2}}, \frac{y_{\alpha_{n+\hat{\nu}}} + iy_{\beta_{n+\hat{\nu}}}}{\sqrt{2}}\right)$$



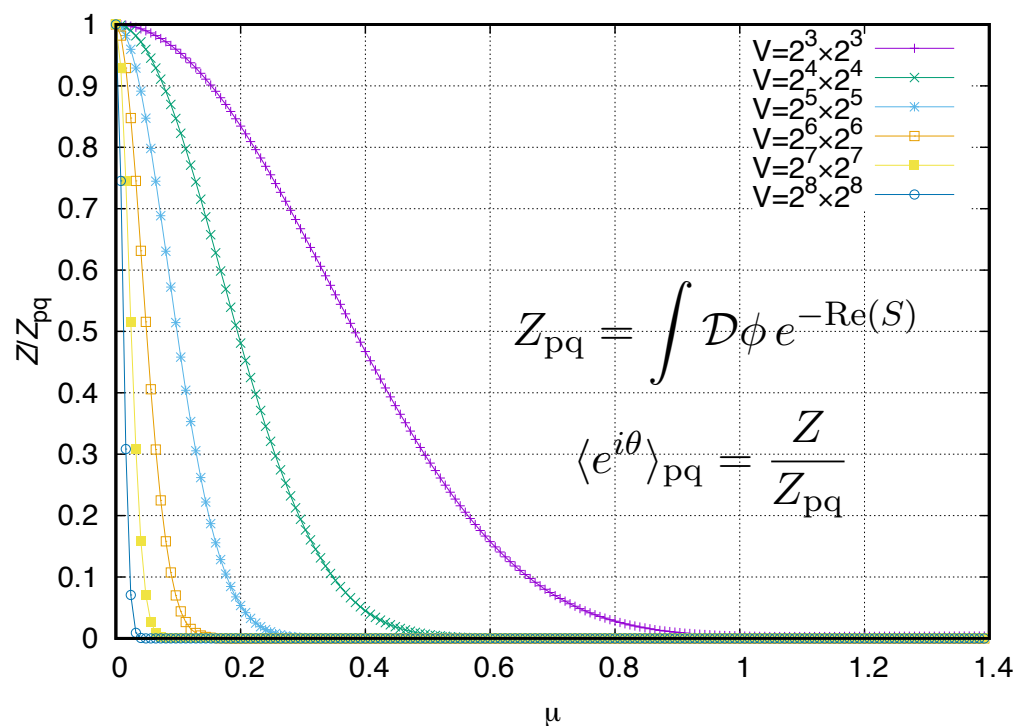
Results for Z(original) with TRG

Kadoh+, JHEP02(2020)161

Parameters: $m^2=0.01$, $\lambda=1$, $K=64$, $D_{\text{cut}}=64$

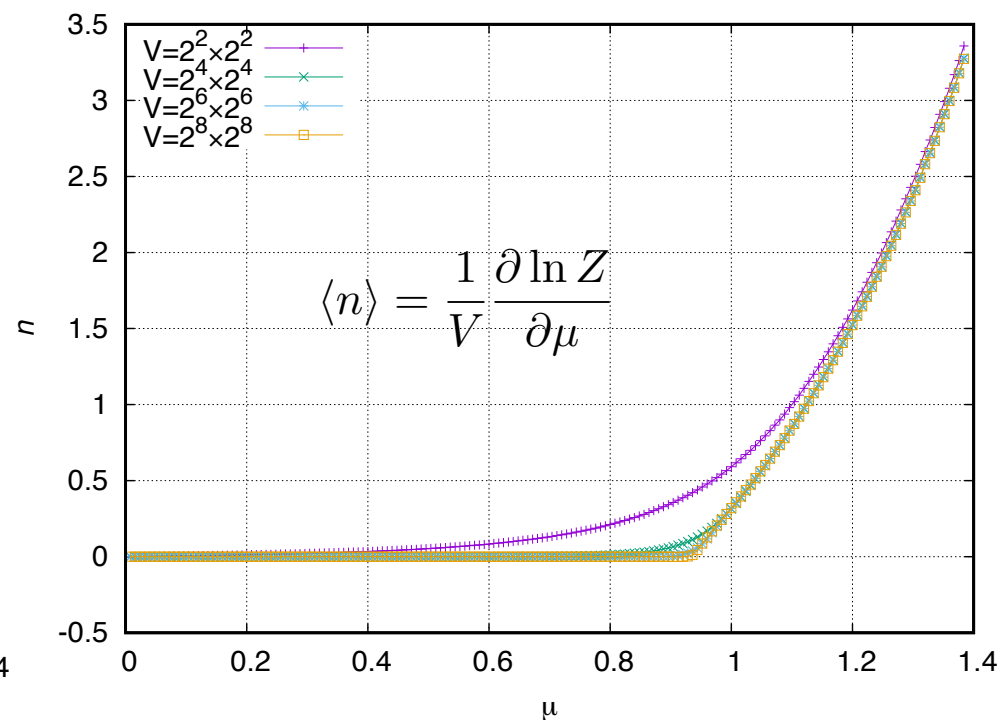
$V=L \times L$ is changed from 4×4 to 256×256

Average phase factor



Sign problem: $\langle e^{i\theta} \rangle_{\text{pq}} \ll 1$

Number density



Silver Blaze feature

Bose condensation @ $\mu \gtrsim 0.95$



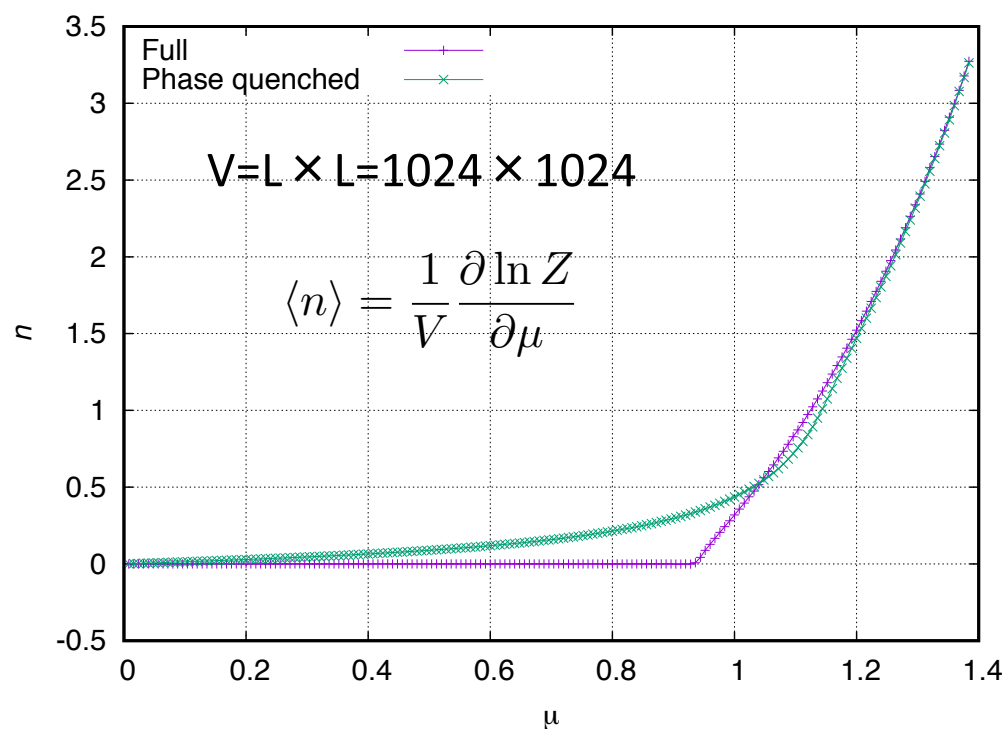
Effects of Phase

Kadoh+, JHEP02(2020)161

Parameters: $m^2=0.01$, $\lambda=1$, $K=64$, $D_{\text{cut}}=64$

$$Z_{\text{pq}} = \int \mathcal{D}\phi_1 \mathcal{D}\phi_2 \exp(-\text{Re}(S))$$

$\langle n \rangle$ w/ and w/o phase



No Silver Blaze feature in phase quenched case

\Rightarrow Clear phase effect



Sign-Problem-Free Representation

Endres, PRD75(2007)065012

Mathematical tools

- Polar coordinate

$$\phi_n = (\phi_{n,1}, \phi_{n,2}) \rightarrow (r_n \cos \theta_n, r_n \sin \theta_n)$$

- Character expansion

$$\exp(x \cos z) = \sum_{k=-\infty}^{\infty} I_k(x) \exp(ikz) \quad x \in R, \quad z \in C$$

Partition function can be expressed in a sign-problem-free form

$$\begin{aligned} Z(\text{positive}) &= \left(\prod_n \sum_{k_{n,1}, k_{n,2}=-\infty}^{\infty} \right) \left(\prod_n \int_0^{\infty} dr_n \right) \prod_n 2\pi r_n \prod_{\rho=1}^2 e^{-\frac{1}{4}(4+m^2)(r_n^2 + r_{n+\hat{\rho}}^2) - \frac{\lambda}{4}(r_n^4 + r_{n+\hat{\rho}}^4)} \\ &\quad \cdot I_{k_{n,\rho}}(2r_n r_{n+\hat{\rho}}) e^{k_{n,\rho} \mu \delta_{\rho,2}} \delta_{(k_{n,1} + k_{n,2} - k_{n-\hat{1},1} - k_{n-\hat{2},2}), 0} \end{aligned}$$

Apply TRG to Z(positive)

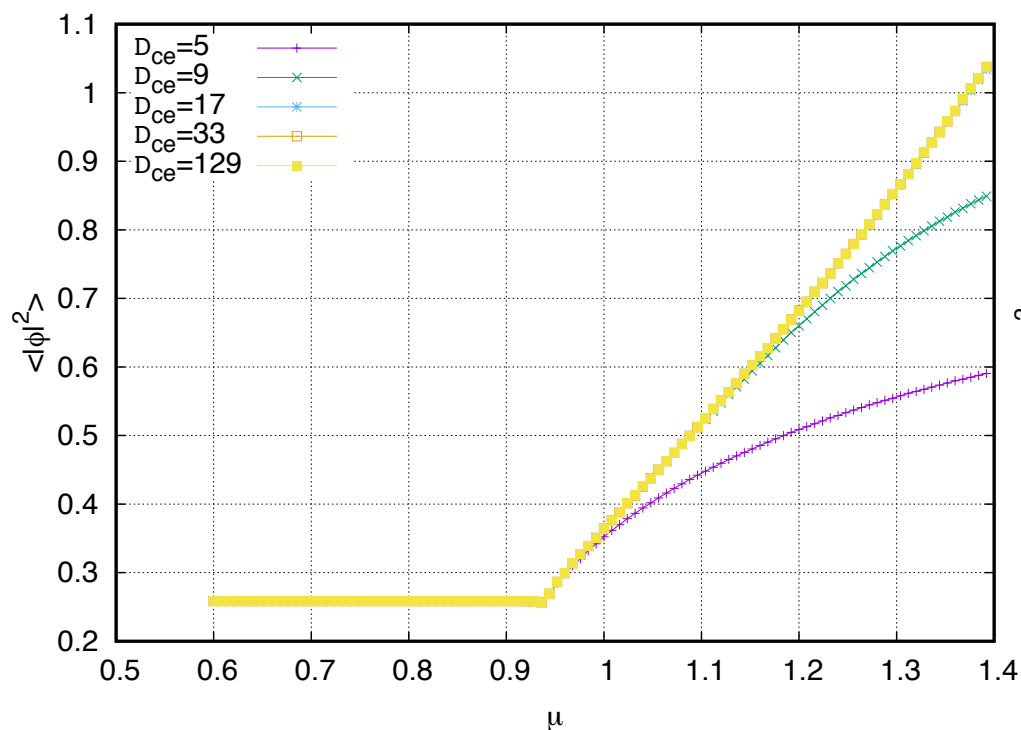
Consistency check btw the results for Z(original) and Z(positive)



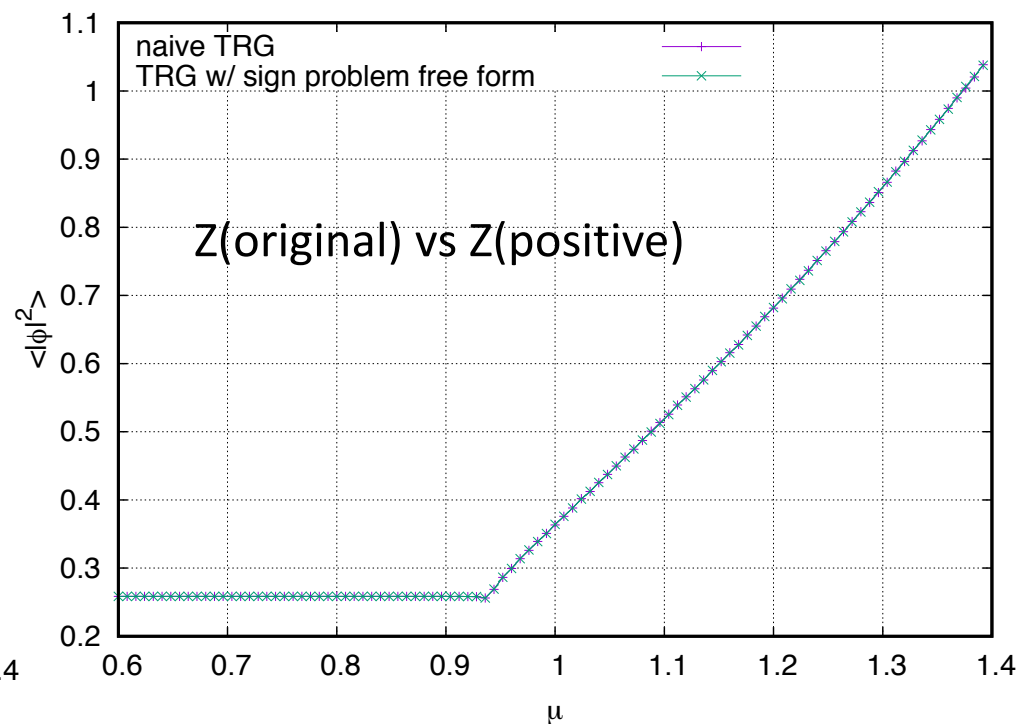
Comparison btw Z(original) and Z(positive)

Kadoh+, JHEP02(2020)161

Parameters: $m^2=0.01$, $V=1024 \times 1024$, $\lambda=1$, $K=256$, $D_{\text{cut}}=64$



Good convergence
in character expansion



Good agreement (degenerate)
 \Rightarrow Free from sign problem



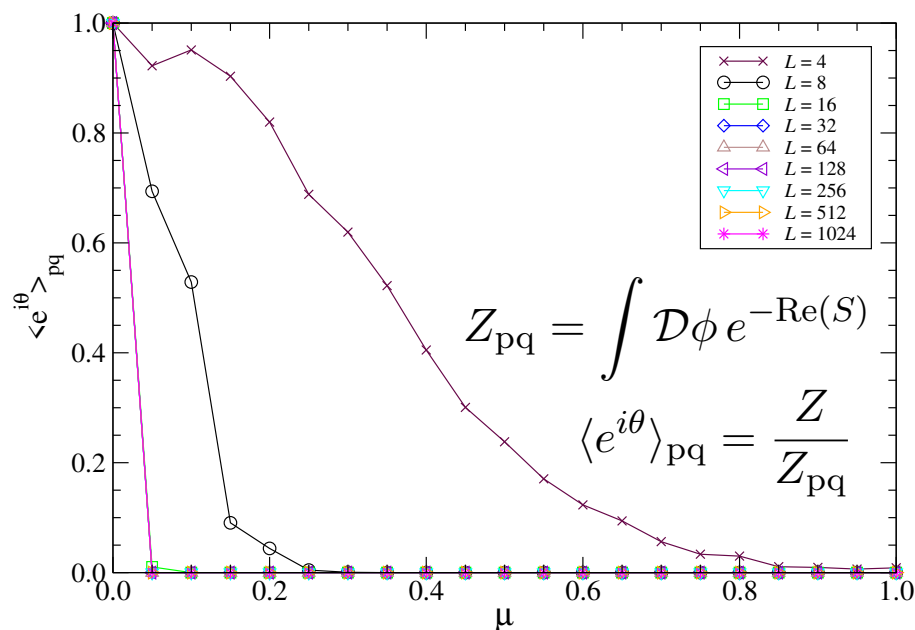
Extension to 4D

Akiyama+, JHEP09(2020)177

Parameters: $m^2=0.01$, $\lambda=1$, $K=64$, $D_{\text{cut}}=45$

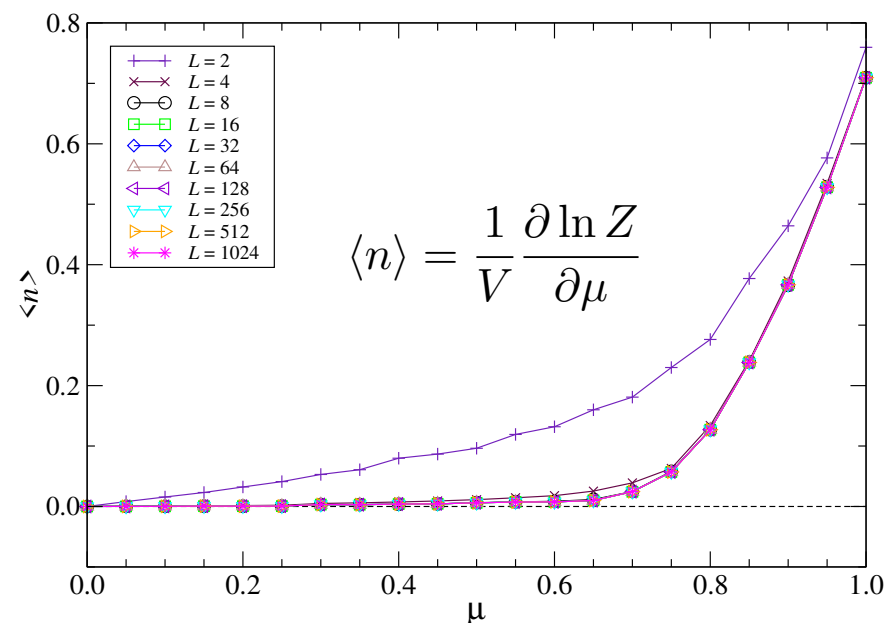
$V=L^4$ is changed from 2^4 to 1024^4

Average phase factor



Sign problem: $\langle e^{i\theta} \rangle \ll 1$

Number density



Silver Blaze feature

Bose condensation @ $\mu \gtrsim 0.65$

($\mu_c \approx 0.7$ by mean field theory)



NJL Model at Finite Density

Akiyama+, JHEP01(2021)121

NJL model at zero density in the continuum

$$\mathcal{L} = \bar{\psi}(x)\gamma_\nu\partial_\nu\psi(x) - g_0 \left\{ (\bar{\psi}(x)\psi(x))^2 + (\bar{\psi}(x)i\gamma_5\psi(x))^2 \right\}$$

NJL model at finite density on the lattice w/ Kogut-Susskind fermion

$$S = \frac{1}{2}a^3 \sum_{n \in \Lambda} \sum_{\nu=1}^4 \eta_\nu(n) \left[e^{\mu a \delta_{\nu,4}} \bar{\chi}(n) \chi(n + \hat{\nu}) - e^{-\mu a \delta_{\nu,4}} \bar{\chi}(n + \hat{\nu}) \chi(n) \right] \\ + m a^4 \sum_{n \in \Lambda} \bar{\chi}(n) \chi(n) - g_0 a^4 \sum_{n \in \Lambda} \sum_{\nu=1}^4 \bar{\chi}(n) \chi(n) \bar{\chi}(n + \hat{\nu}) \chi(n + \hat{\nu})$$

μ : chemical potential

m : fermion mass

g_0 : coupling constant of four-fermi interaction

a : lattice spacing

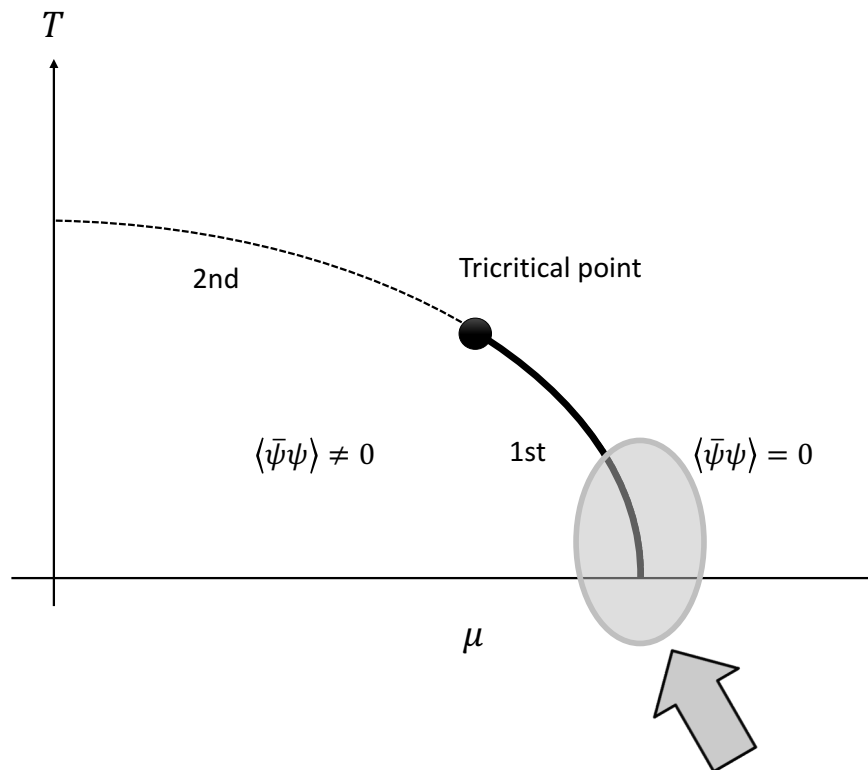


Phase Diagram of NJL Model at Finite Density

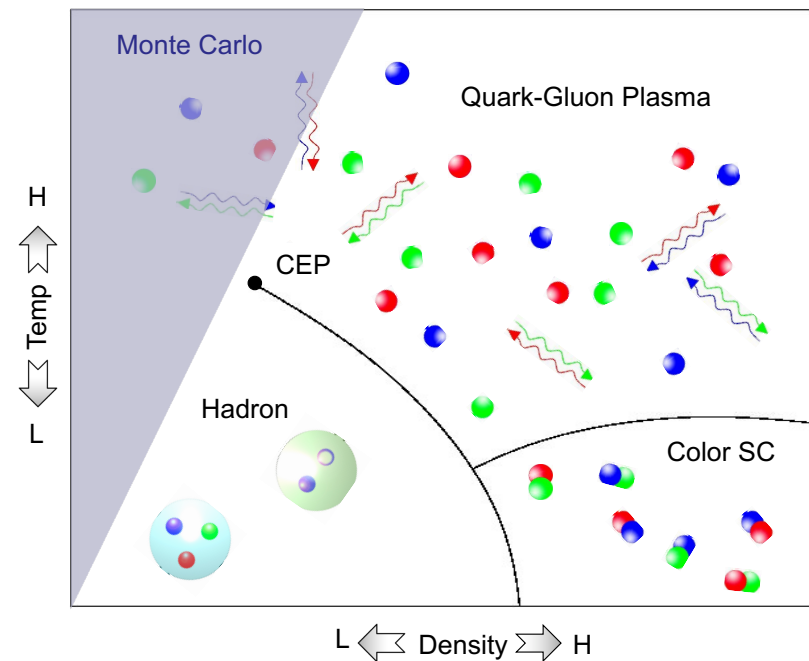
Akiyama+, JHEP01(2021)121

NJL model as a prototype of QCD

Expected phase diagram for NJL model



Expected phase diagram for QCD



Check the first-order phase transition at cold and dense region



Algorithm and Parameters

Akiyama+, JHEP01(2021)121

TN representation

$$\begin{aligned} \mathcal{T}_{n;i_4(n)i_1(n)i_2(n)i_3(n)i_4(n-\hat{4})i_1(n-\hat{1})i_2(n-\hat{2})i_3(n-\hat{3})} \\ = \int d\chi d\bar{\chi} e^{-m\bar{\chi}\chi} \prod_{\nu=1}^4 \left(\frac{e^{\frac{\mu}{2}\delta_{\nu,4}}}{\sqrt{2}} \eta_{\nu}(n) \bar{\chi} d\Phi_{\nu}(n) \right)^{i_{\nu,1}(n)} \left(\frac{e^{\frac{\mu}{2}\delta_{\nu,4}}}{\sqrt{2}} \chi d\bar{\Phi}_{\nu}(n) \right)^{i_{\nu,1}(n-\hat{\nu})} \\ \times \left(\frac{e^{-\frac{\mu}{2}\delta_{\nu,4}}}{\sqrt{2}} \eta_{\nu}(n) \chi d\Psi_{\nu}(n) \right)^{i_{\nu,2}(n)} \left(\frac{e^{-\frac{\mu}{2}\delta_{\nu,4}}}{\sqrt{2}} \bar{\chi} d\bar{\Psi}_{\nu}(n) \right)^{i_{\nu,2}(n-\hat{\nu})} (\sqrt{g_0}\bar{\chi}\chi)^{i_{\nu,3}(n)} \\ \times (\sqrt{g_0}\bar{\chi}\chi)^{i_{\nu,3}(n-\hat{\nu})} \left(\bar{\Phi}_{\nu}(n+\hat{\nu})\Phi_{\nu}(n) \right)^{i_{\nu,1}(n)} \left(\bar{\Psi}_{\nu}(n+\hat{\nu})\Psi_{\nu}(n) \right)^{i_{\nu,2}(n)}. \end{aligned}$$

$$Z = \sum_{\{t,x,y,z\}} \int \prod_{n \in \Lambda} \mathcal{T}_{n;txyzt'x'y'z'} \quad (x = i_1, y = i_2, z = i_3, t = i_4)$$

Coarse-graining procedure: GATRG w/ $D_{\text{cut}}=55$

Parameters

$$V = L \times \beta = (aN_{\sigma}) \times (aN_{\tau}) = 2^4, \dots, (1024)^4 \quad \left(\beta = \frac{1}{T} \right)$$

Periodic BC for spatial direction and anti-periodic BC for temporal direction

a is fixed at finite value ($a=1$)

$g_0 = 32$ for coupling constant of four-fermi interaction



Heavy Dense Limit as a Benchmark

Akiyama+, JHEP01(2021)121

Heavy dense limit: $m, \mu \rightarrow \infty$ while e^μ/m kept fixed

Chiral condensate and number density in the heavy dense limit

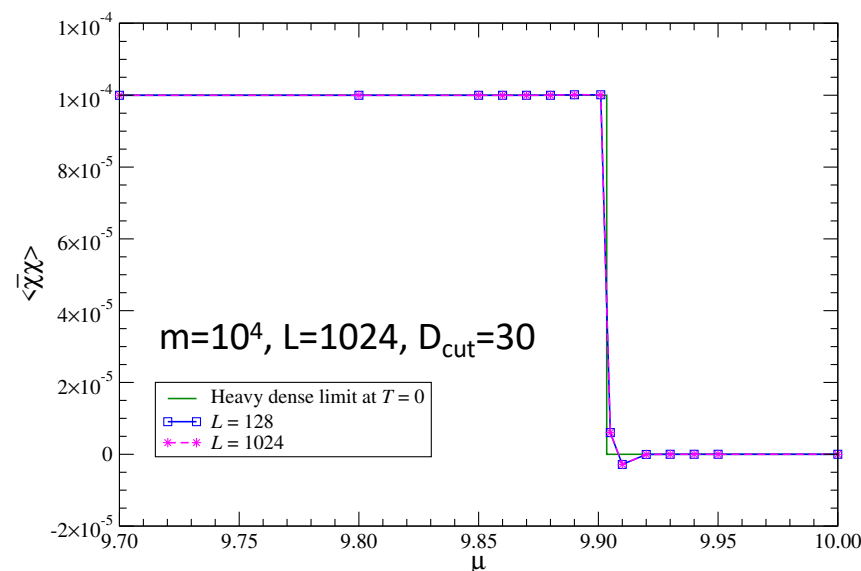
$$\langle \bar{\chi}(n)\chi(n) \rangle = \frac{1}{m} \Theta(\mu_c - \mu) \quad \langle n \rangle = \Theta(\mu - \mu_c)$$

Pawlowski-Zielinski,
PRD87(2013)094509

Analytical solutions are step function at $\mu_c = \ln(2m)$

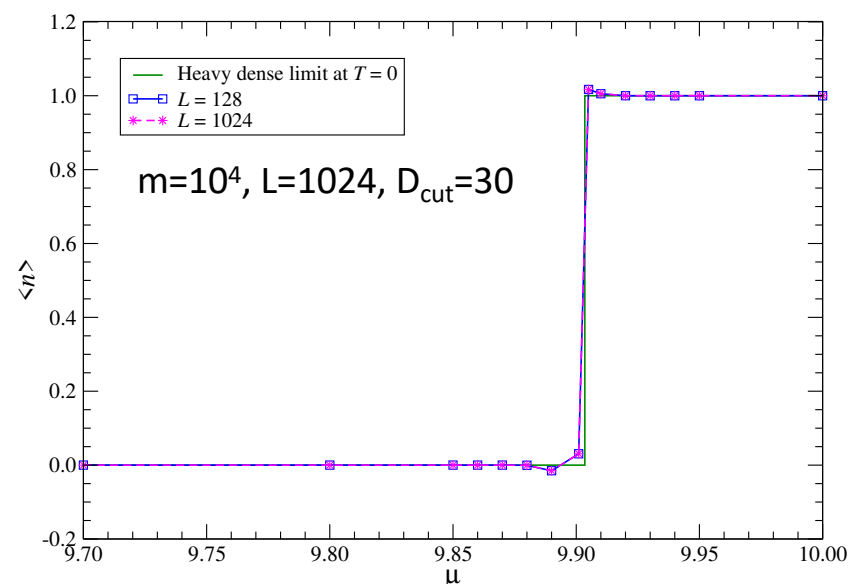
Chiral condensate

$$\langle \bar{\chi}(n)\chi(n) \rangle|_{m=10^4} = \frac{1}{V} \frac{\ln Z(m + \Delta m) - \ln Z(m)}{\Delta m} \Big|_{m=10^4}$$



Number density

$$\langle n \rangle = \frac{1}{V} \frac{\partial \ln Z(\mu)}{\partial \mu} \approx \frac{1}{V} \frac{\ln Z(\mu + \Delta \mu) - \ln Z(\mu)}{\Delta \mu}$$



Good consistency with analytical solutions



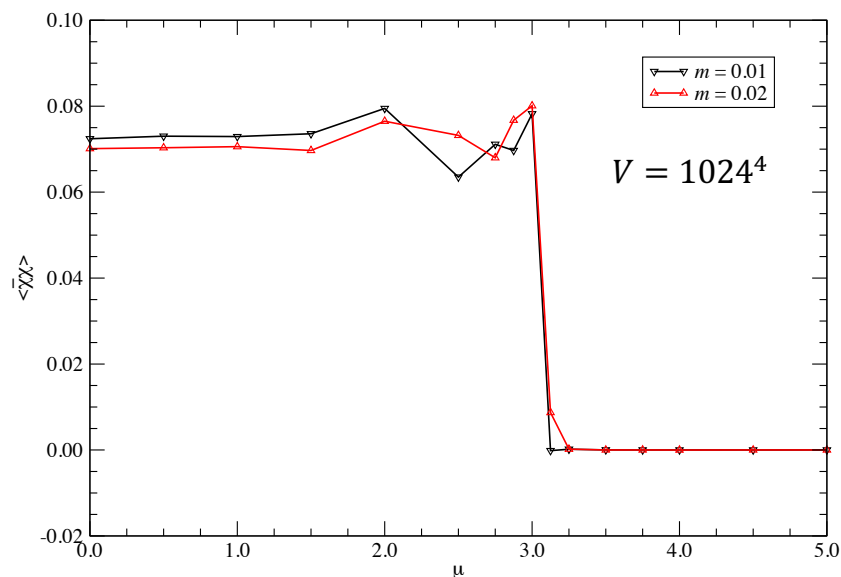
μ Dependence of Chiral Condensate

Akiyama+, JHEP01(2021)121

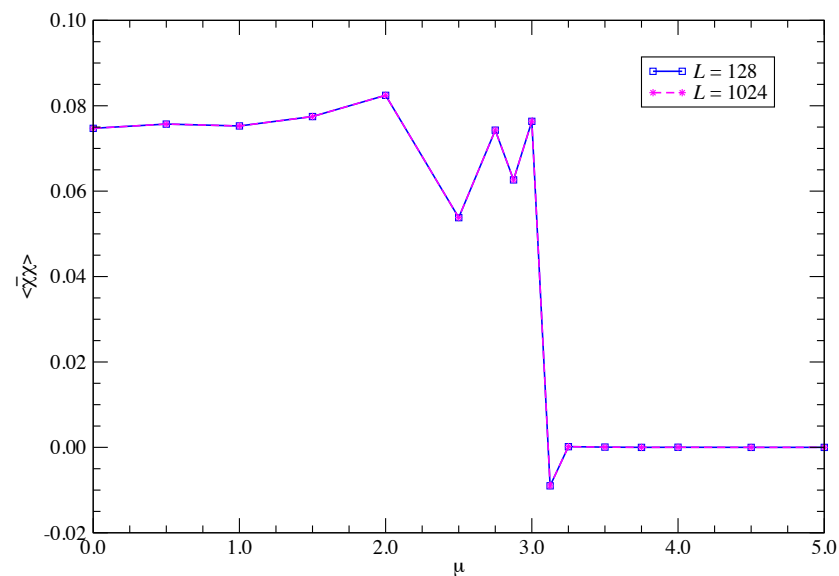
Order parameter of chiral phase transition

$$\langle \bar{\chi}(n)\chi(n) \rangle = \lim_{m \rightarrow 0} \lim_{V \rightarrow \infty} \frac{1}{V} \frac{\partial}{\partial m} \ln Z$$

Mass dependence@L=1024



Volume dependence@m=0



Jump around $\mu \approx 3.0 \Rightarrow$ First-order phase transition



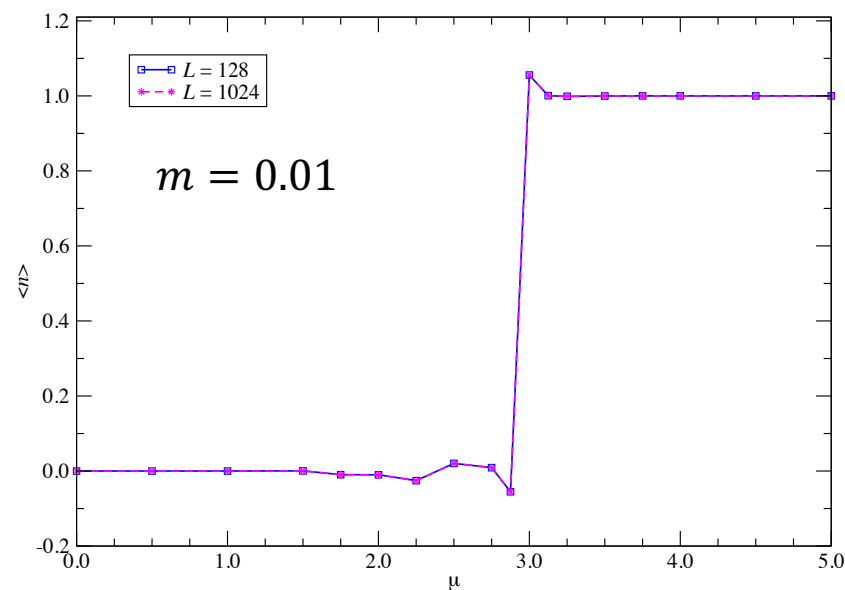
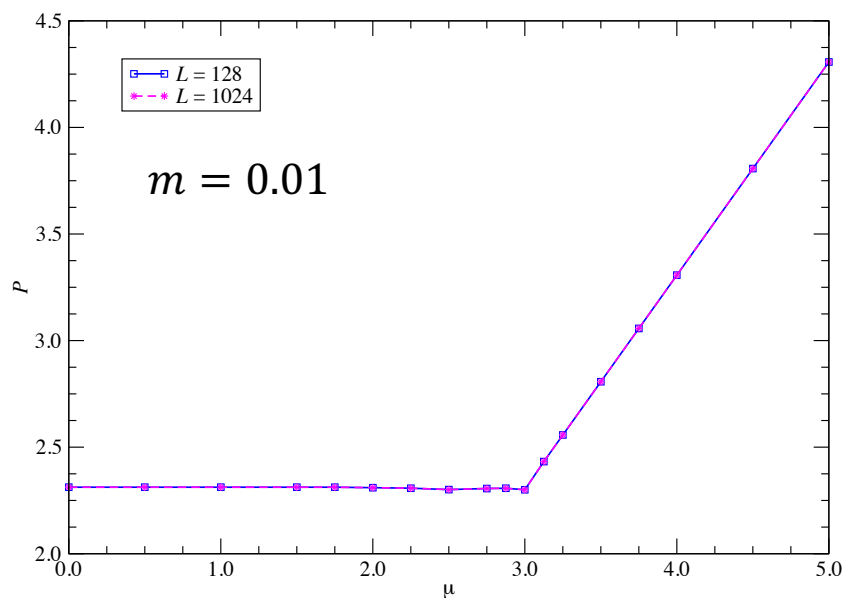
μ Dependence of Number Density

Akiyama+, JHEP01(2021)121

Pressure and number density (EOS)

$$P = \frac{\ln Z}{V}$$

$$\langle n(\mu) \rangle = \frac{\partial P(\mu)}{\partial \mu} \approx \frac{P(\mu + \Delta\mu) - P(\mu)}{\Delta\mu}$$



Jump around $\mu \approx 3.0 \Rightarrow$ Another evidence of first-order phase transition



Summary

What we have achieved so far

- Studies of various 2D models
 - Show that the TRG method is free from sign problems
 - Development of algorithms for scalar, fermion, gauge theories
- Studies of 4D models
 - Ising model
 - Complex ϕ^4 theory at finite density
 - NJL model at finite density
 - Real ϕ^4 theory

Current status

- Research topics is moving from 2D models to 4D ones
- A new research direction: Hubbard model in condensed matter physics