

# Complex Langevin and QCD Thermodynamics

Benjamin Jäger

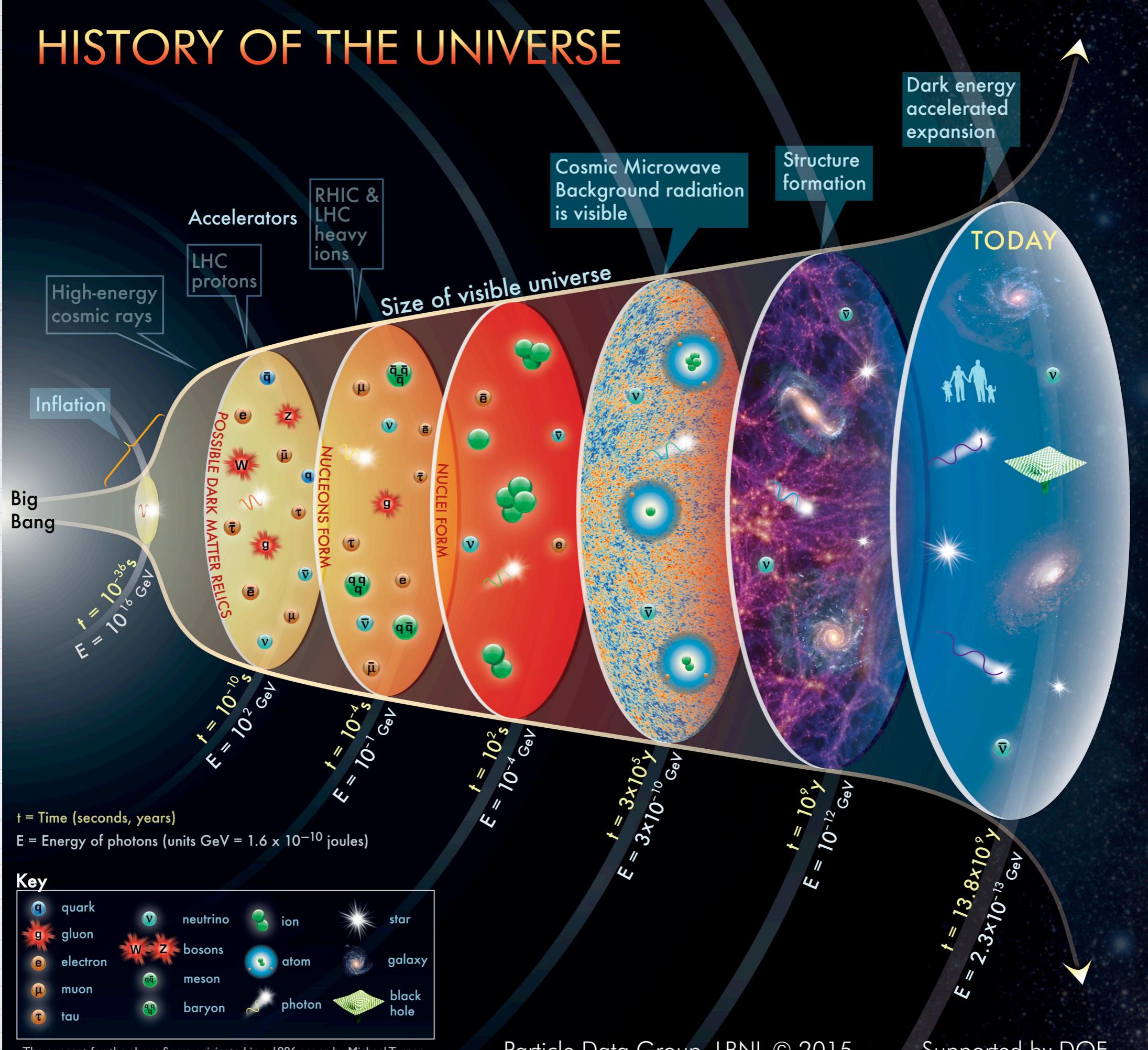


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$\hbar$  QUANTUM  
THEORY CENTER

DIAS

# HISTORY OF THE UNIVERSE

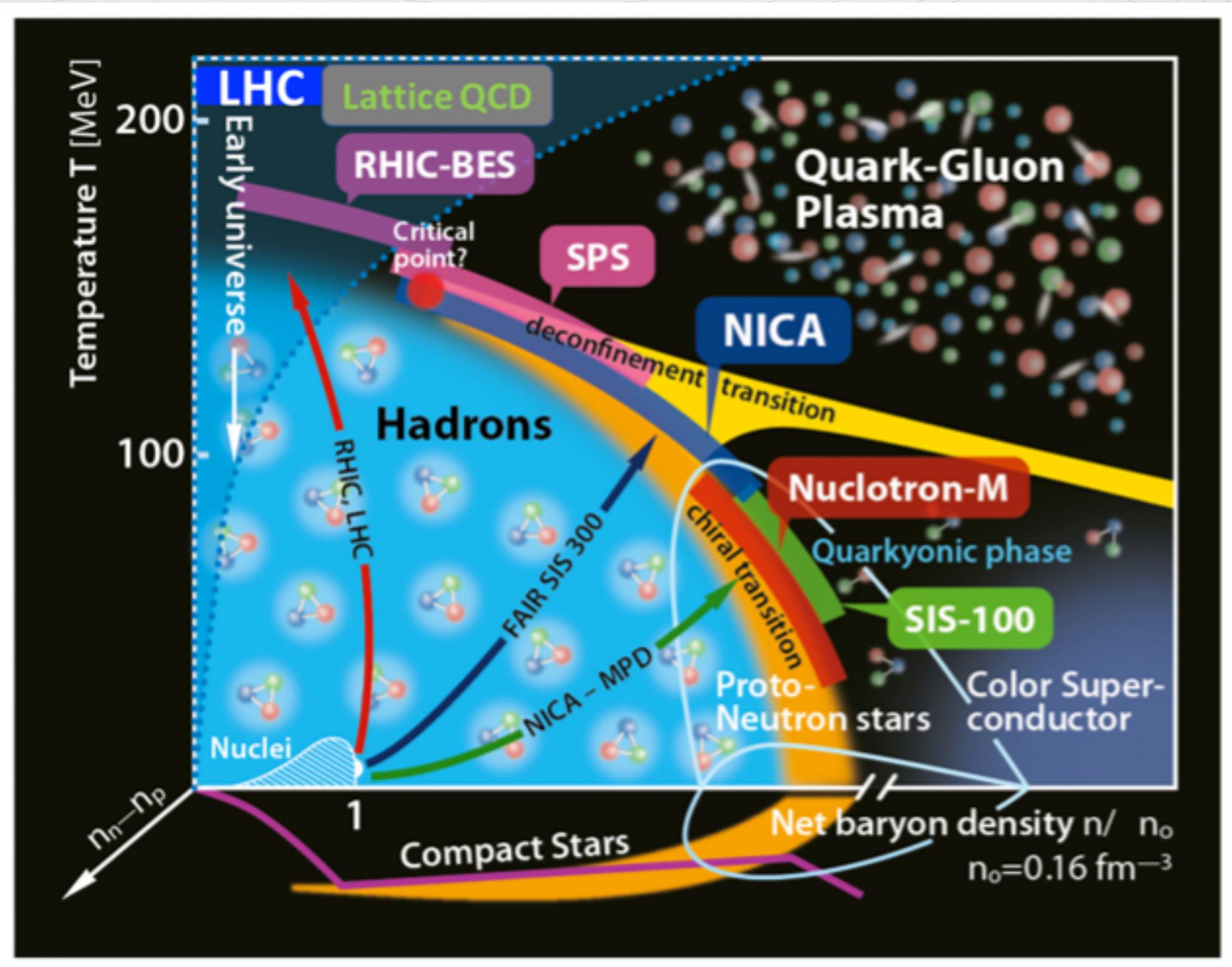


The concept for the above figure originated in a 1986 paper by Michael Turner.

Particle Data Group, LBNL © 2015

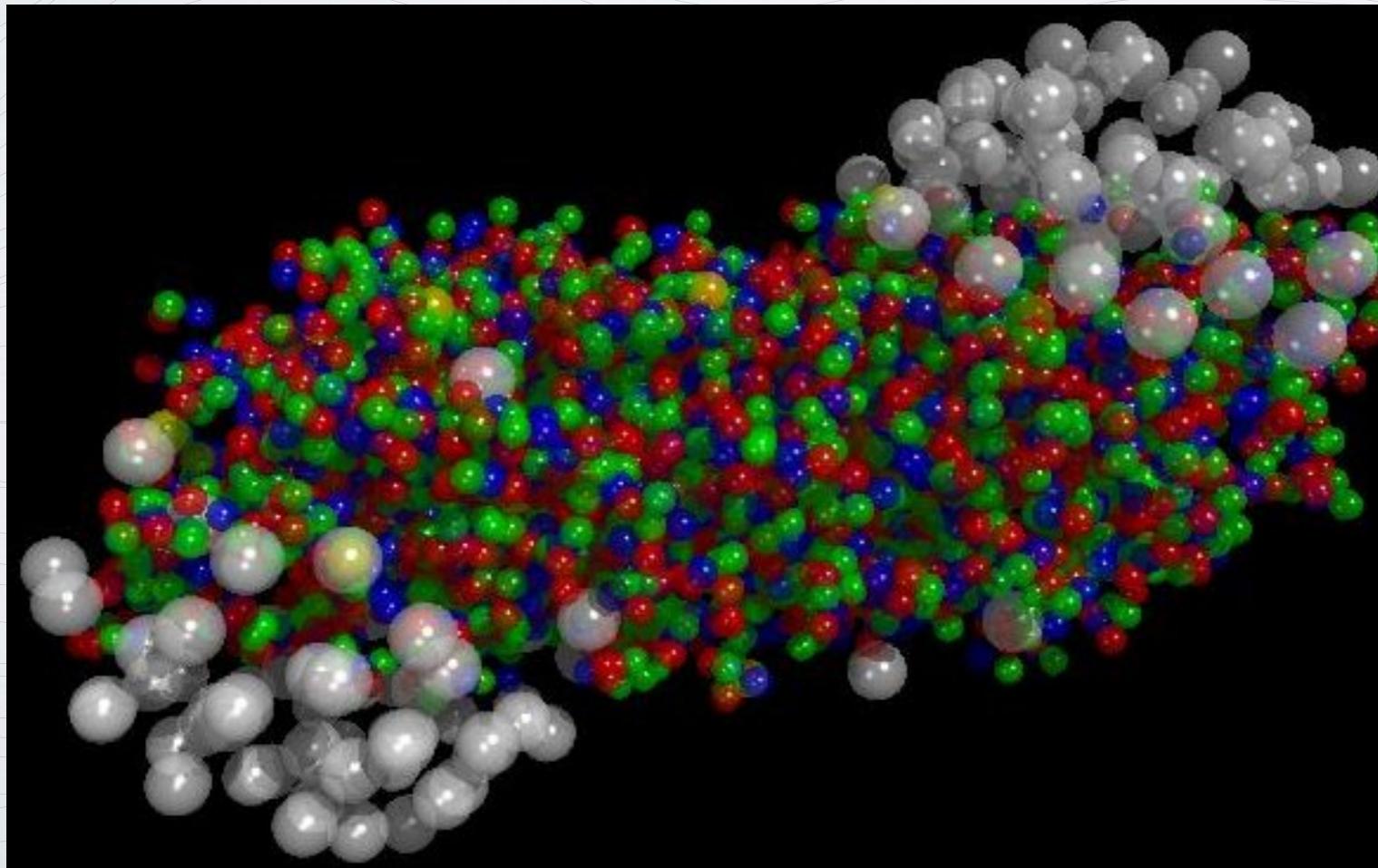
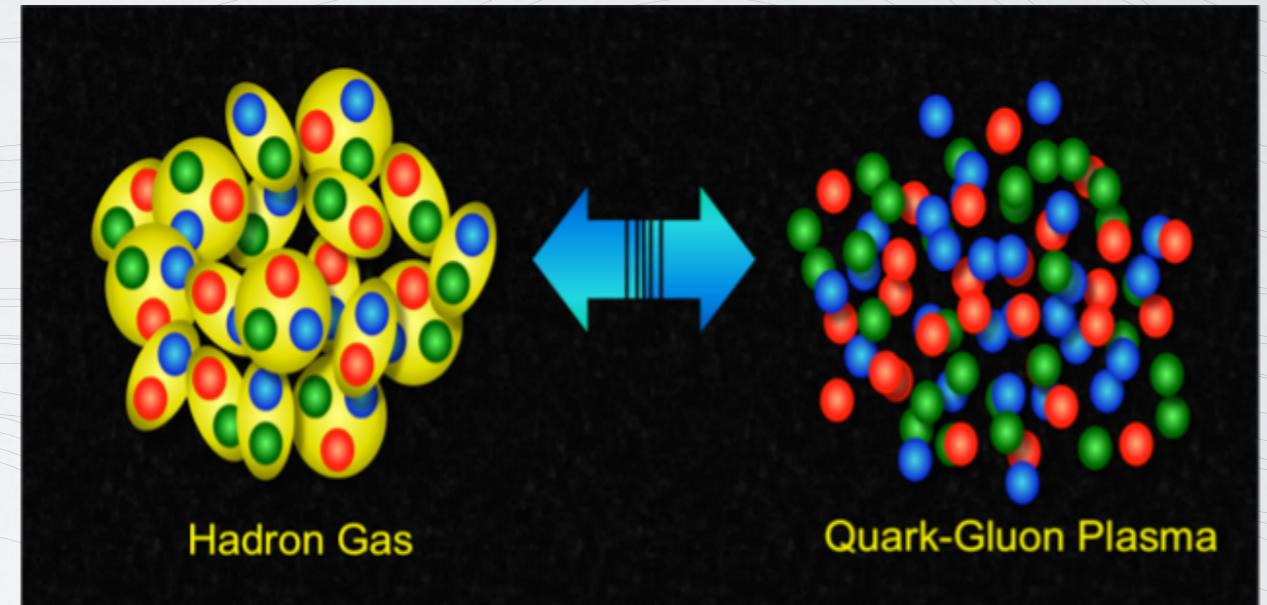
Supported by DOE

# QCD Thermodynamics



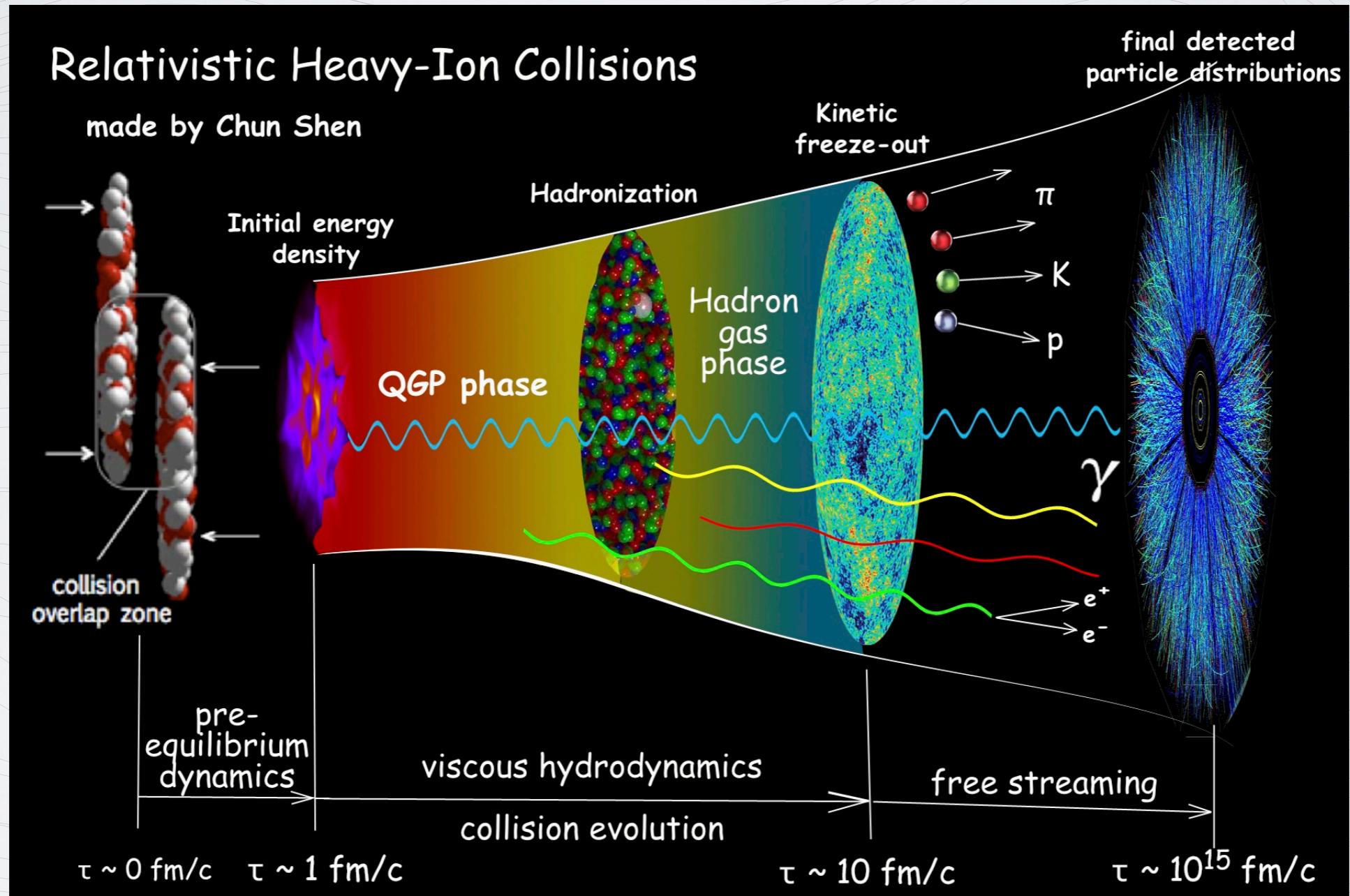
# QCD Thermodynamics

Understand the transition

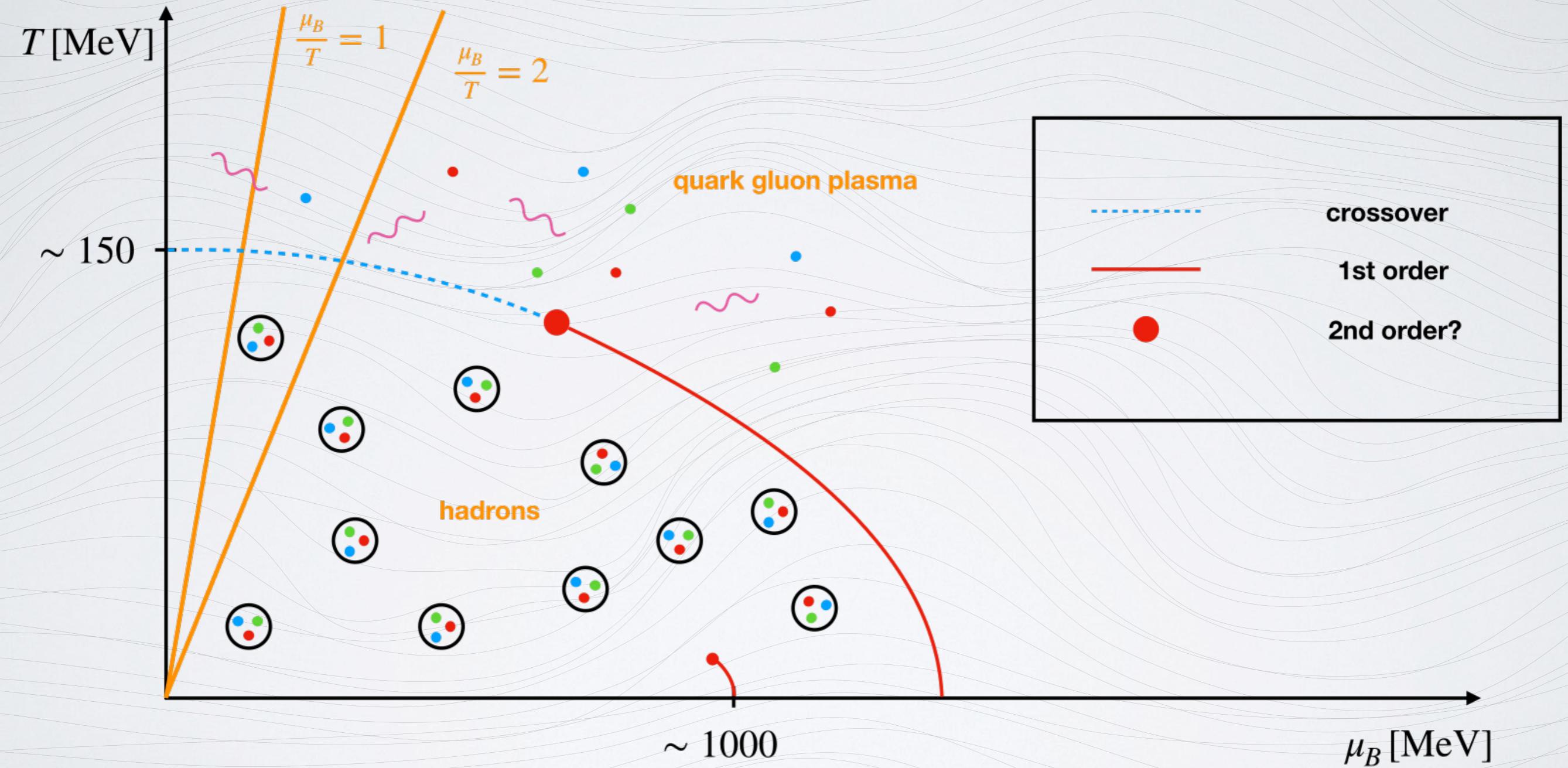


Heavy-Ion  
Collision  
Experiments

# Heavy-Ion Collision Experiments

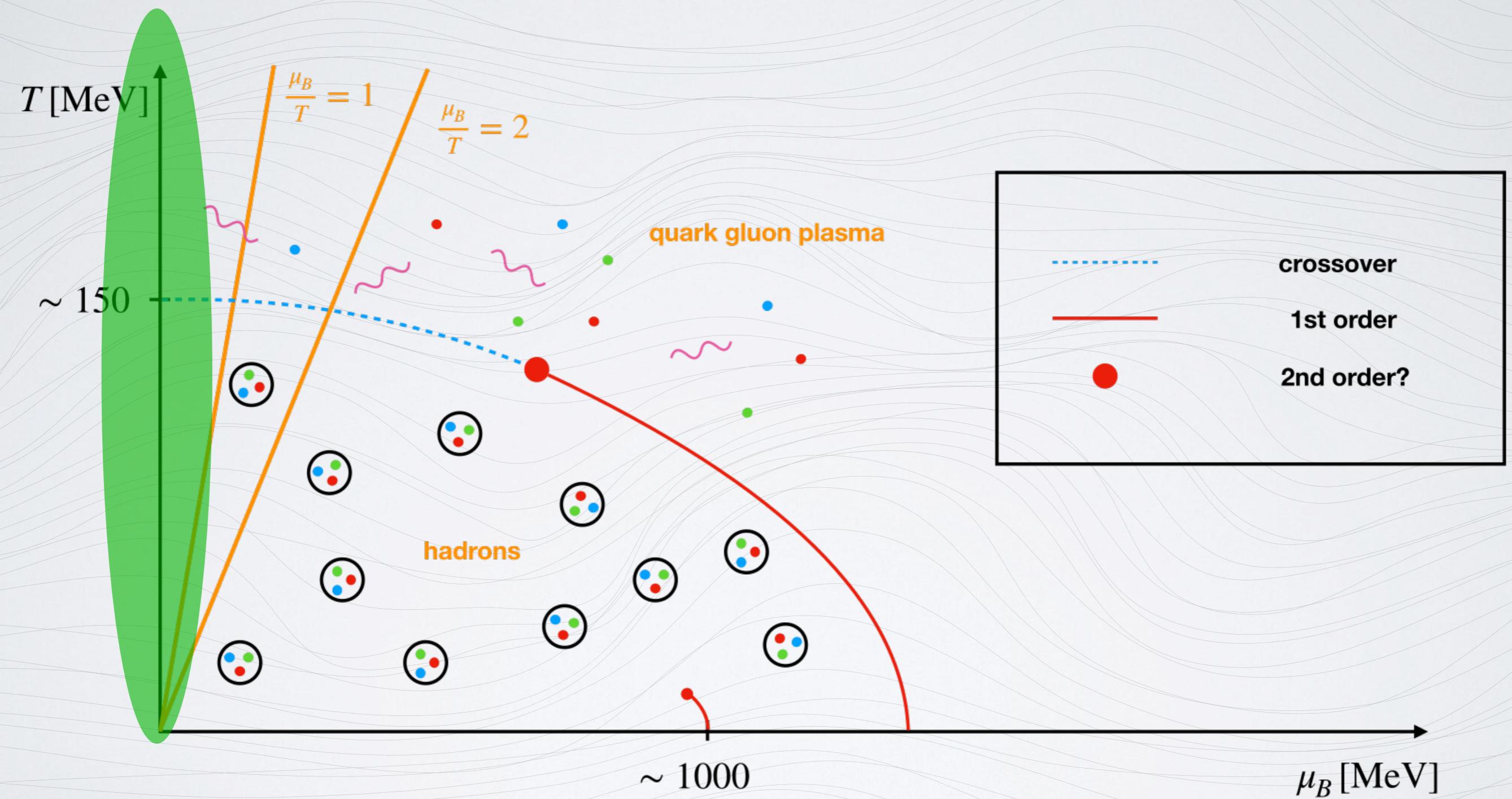


# QCD phase diagram



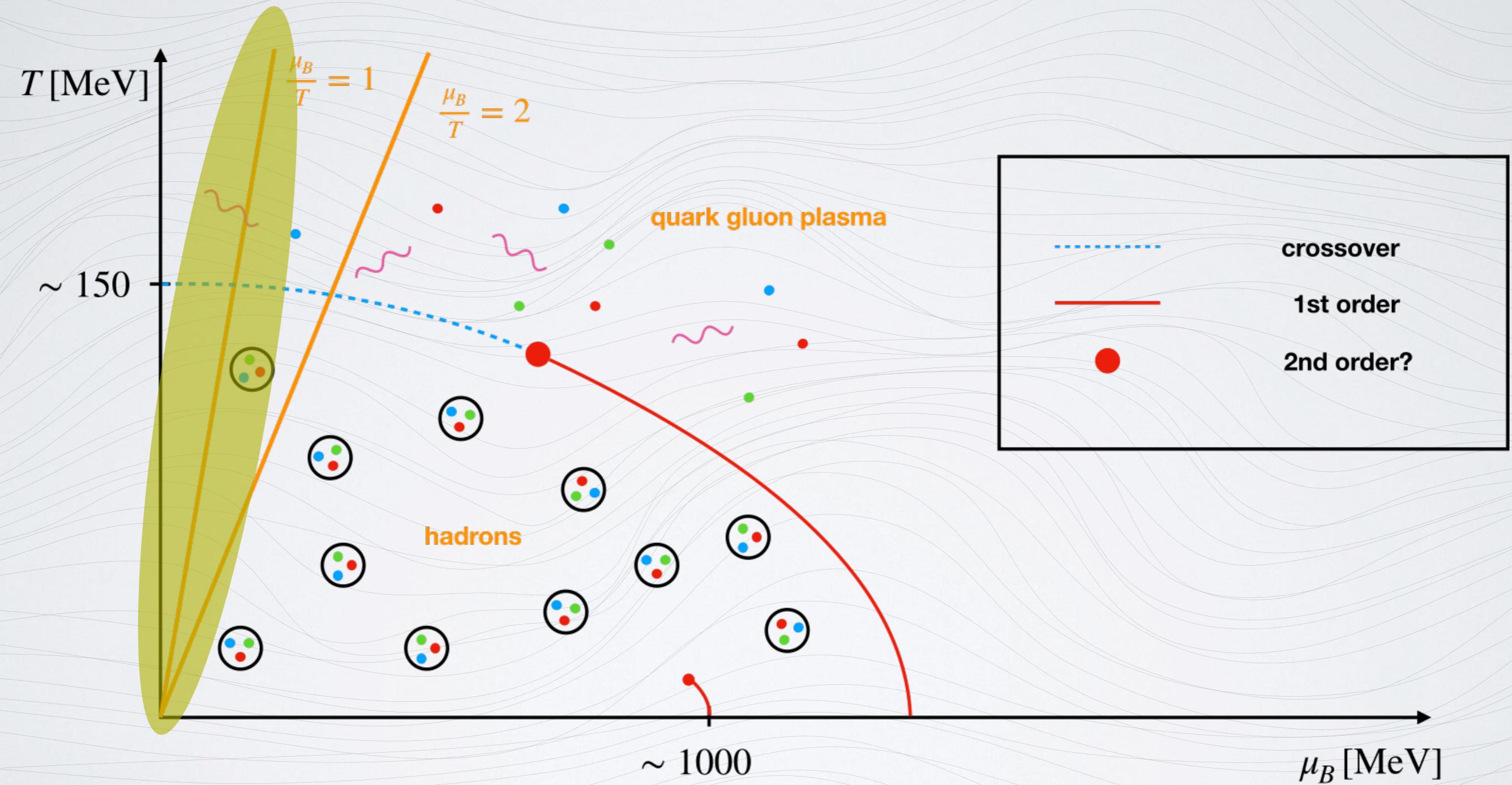
Here: Focus on QCD phase diagram with complex Langevin

# QCD phase diagram



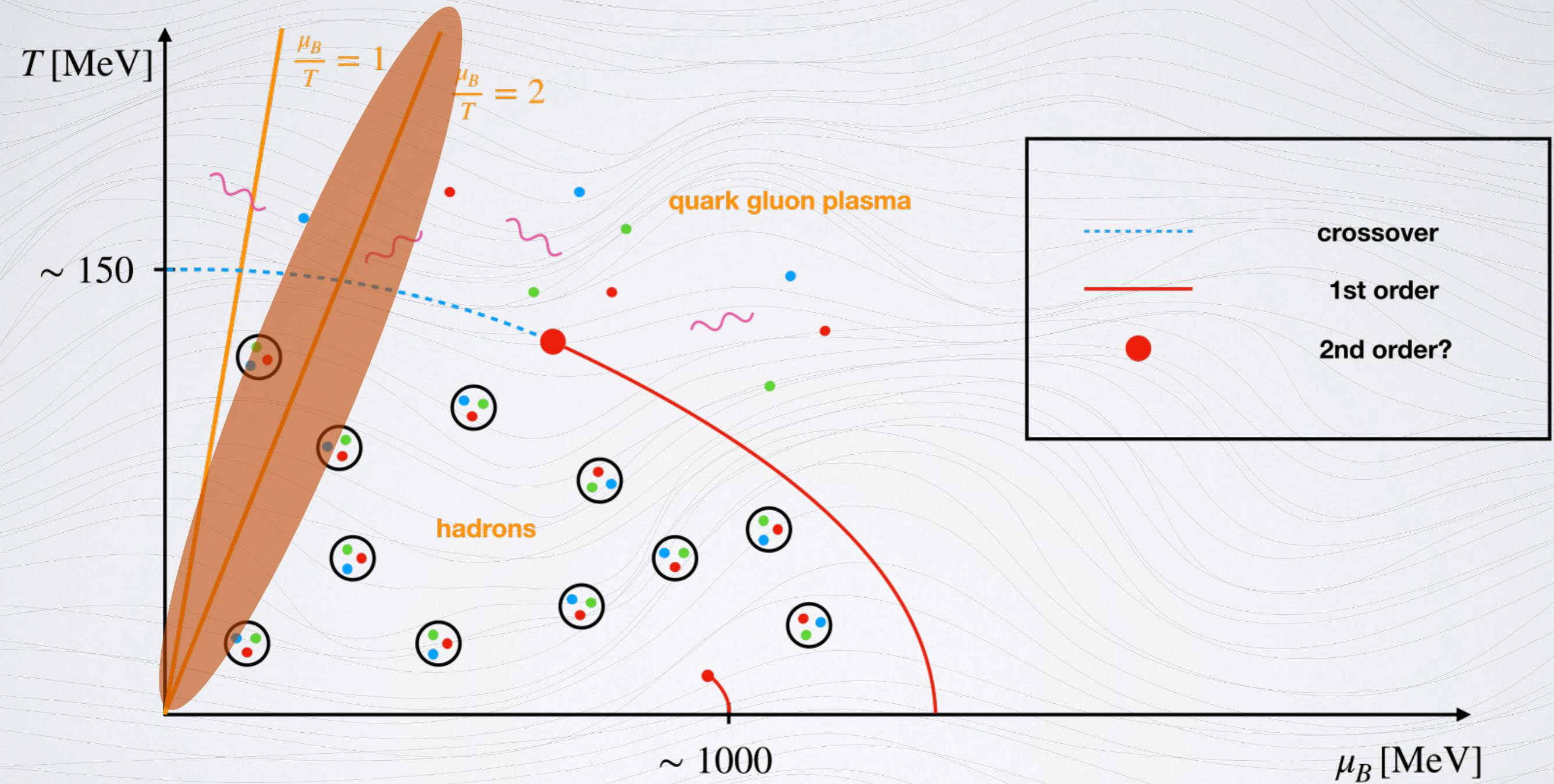
Thermodynamics ( $\mu = 0$ ) - Easy

# QCD phase diagram



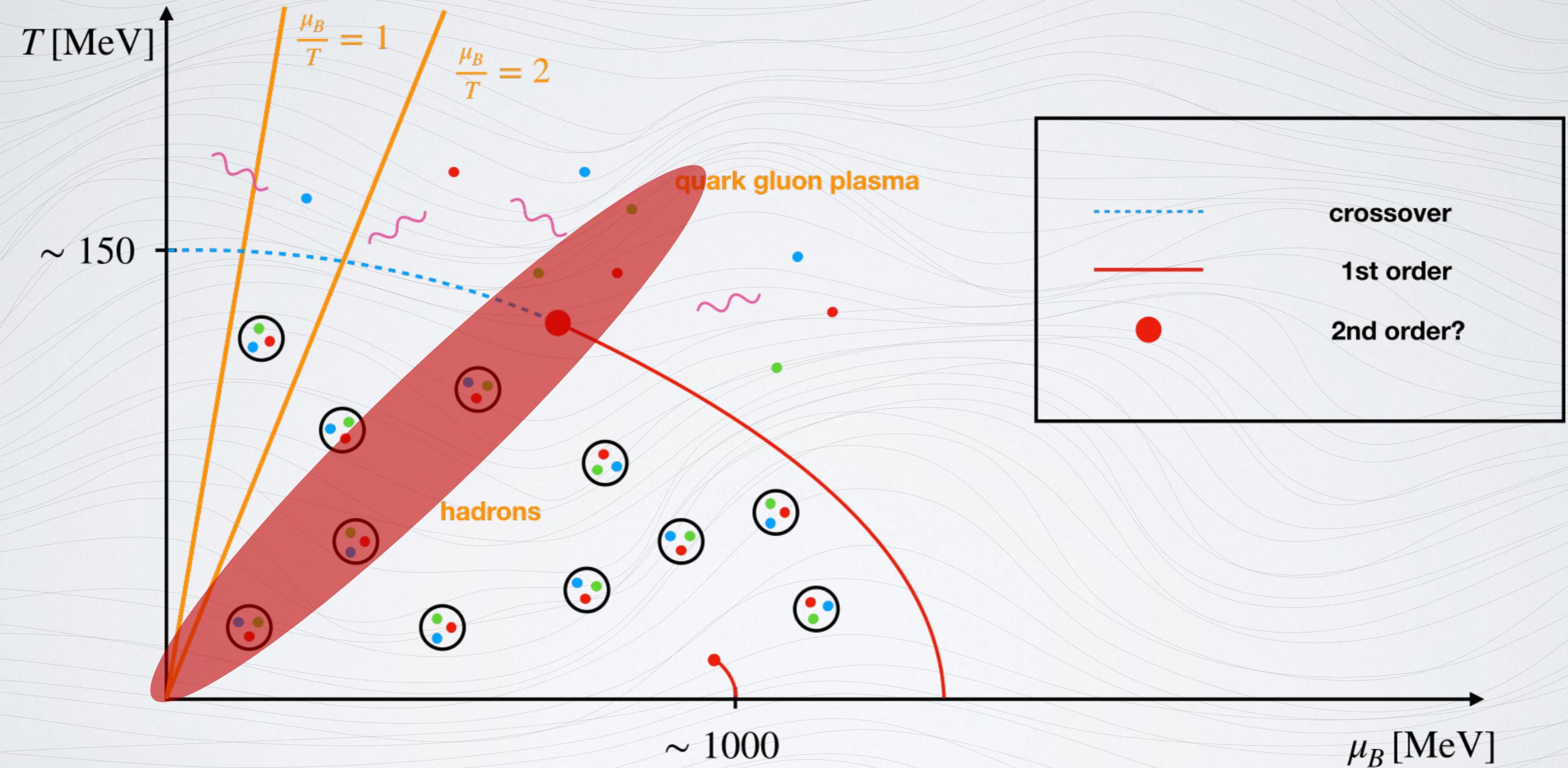
Small expansions - Medium

# QCD phase diagram



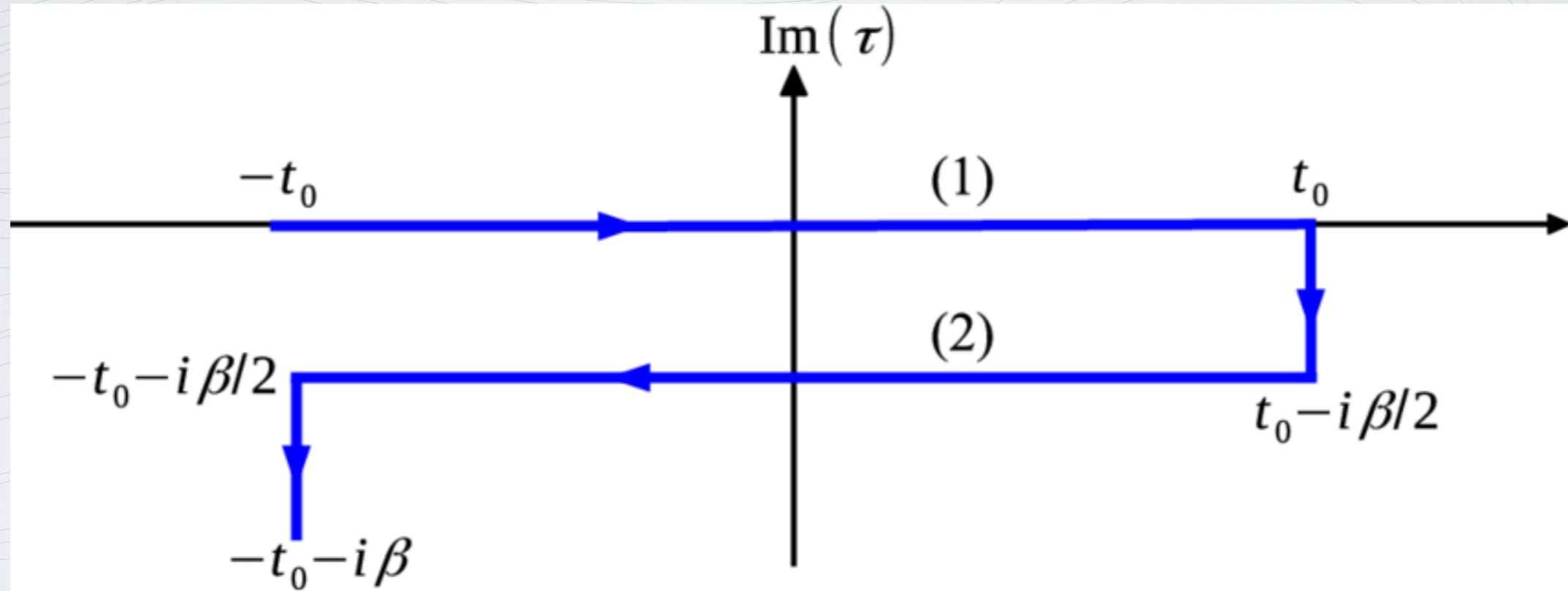
Larger expansions - Hard

# QCD phase diagram



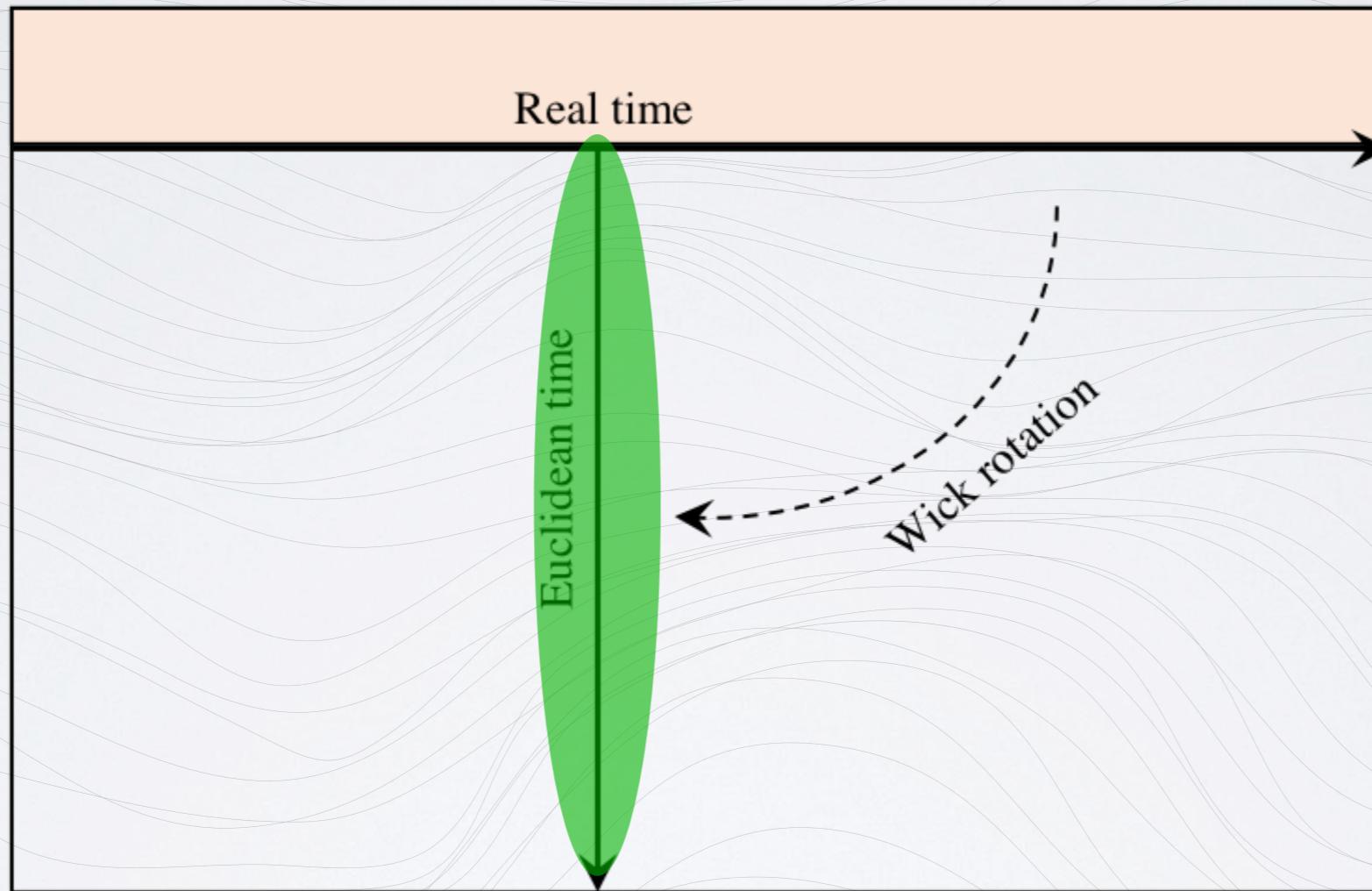
Finite  $\mu$  - Very hard (exponential in volume)

# Real-time QCD



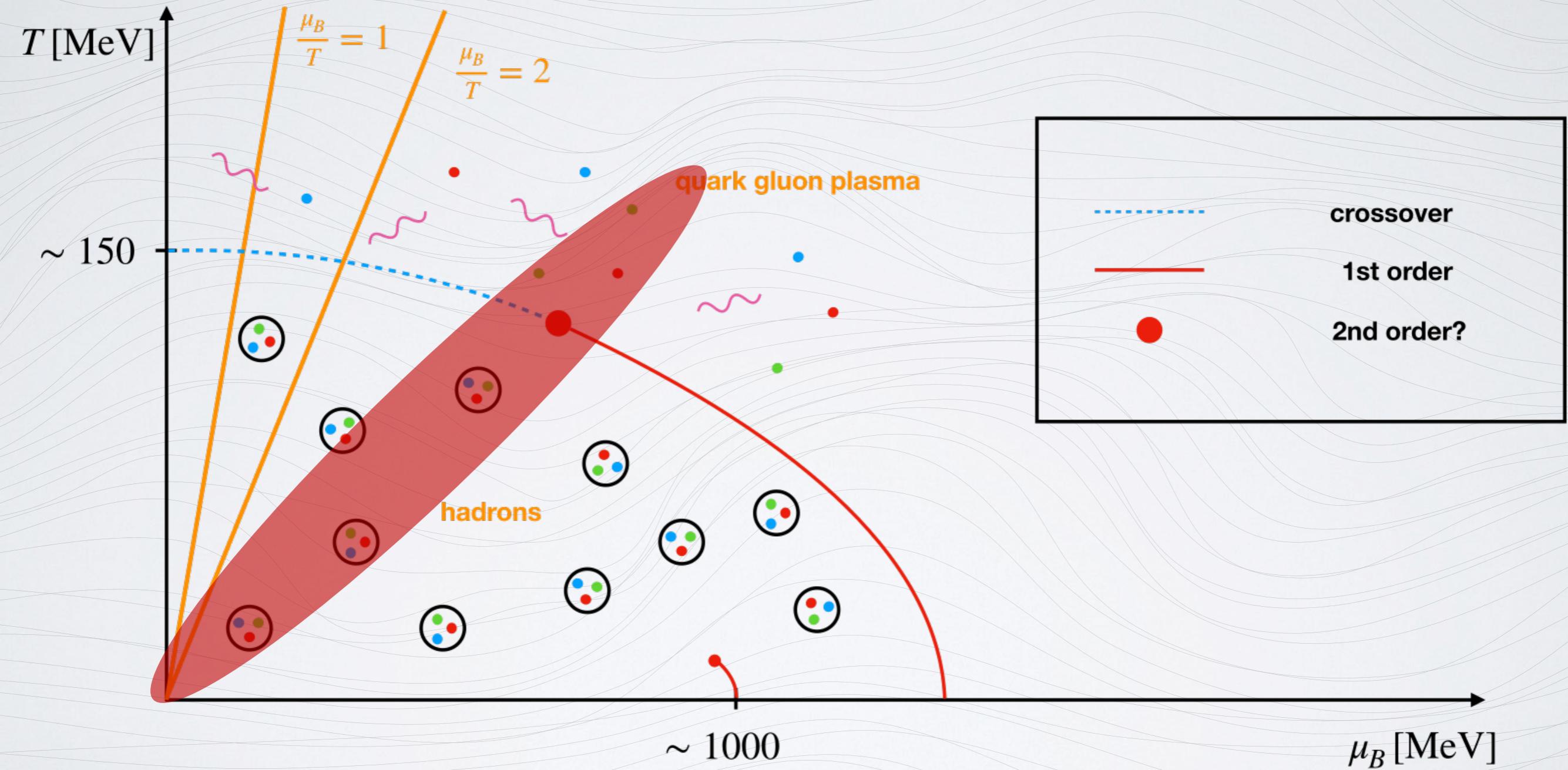
Schwinger-Keldysh contour - Extremely hard

# In Minkowski space-time



In Minkowski space-time - Currently impossible

# Back to QCD phase diagram



Finite  $\mu$  - Very hard (exponential in volume)

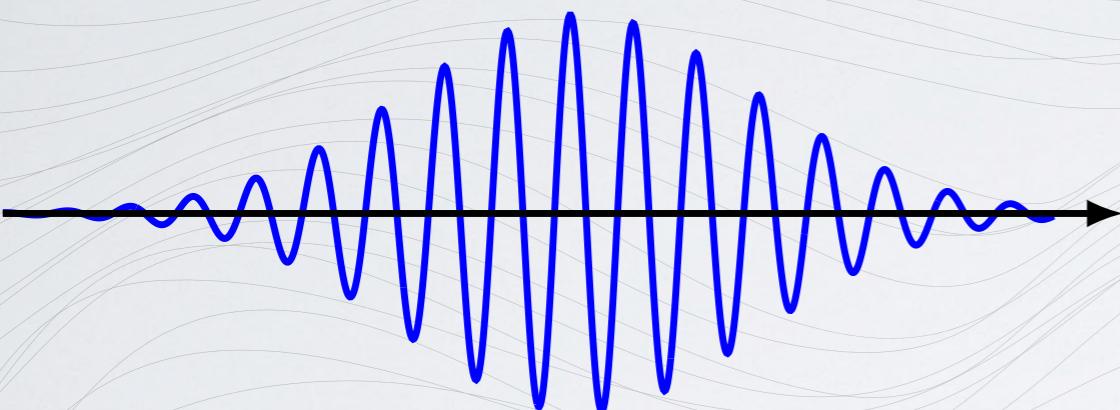
# Sign Problem

## Sign Problem

- With  $\mu_B \neq 0$  the path integral becomes complex
- Reason:  $\det(D) \in \mathbb{C}$

$$\langle O \rangle = \frac{1}{Z} \int \mathcal{D}[U] O(U) |\det D| e^{i\phi} e^{-S_G(U)}$$

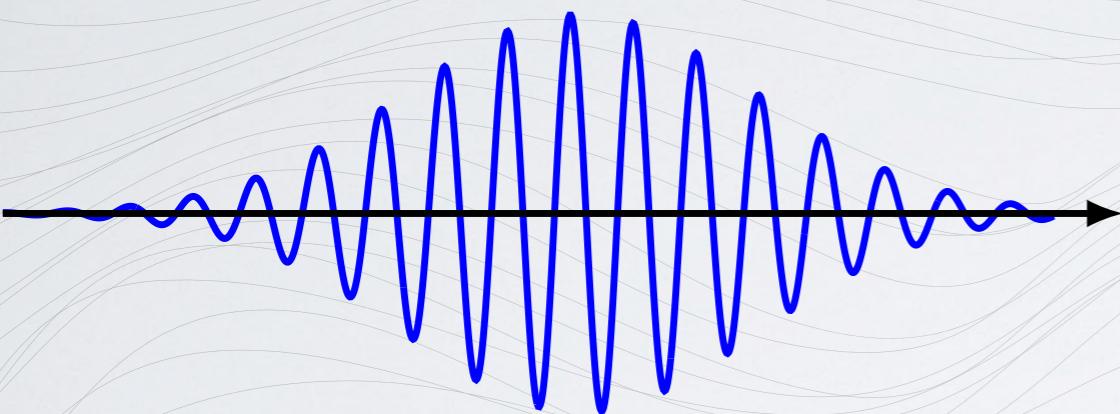
- Importance Sampling Monte Carlo not applicable :(



# Sign Problem

## Example

- Simple one-dim. integral
- Exact integration:  $Z = \sqrt{\pi} e^{-\lambda^2/4}$



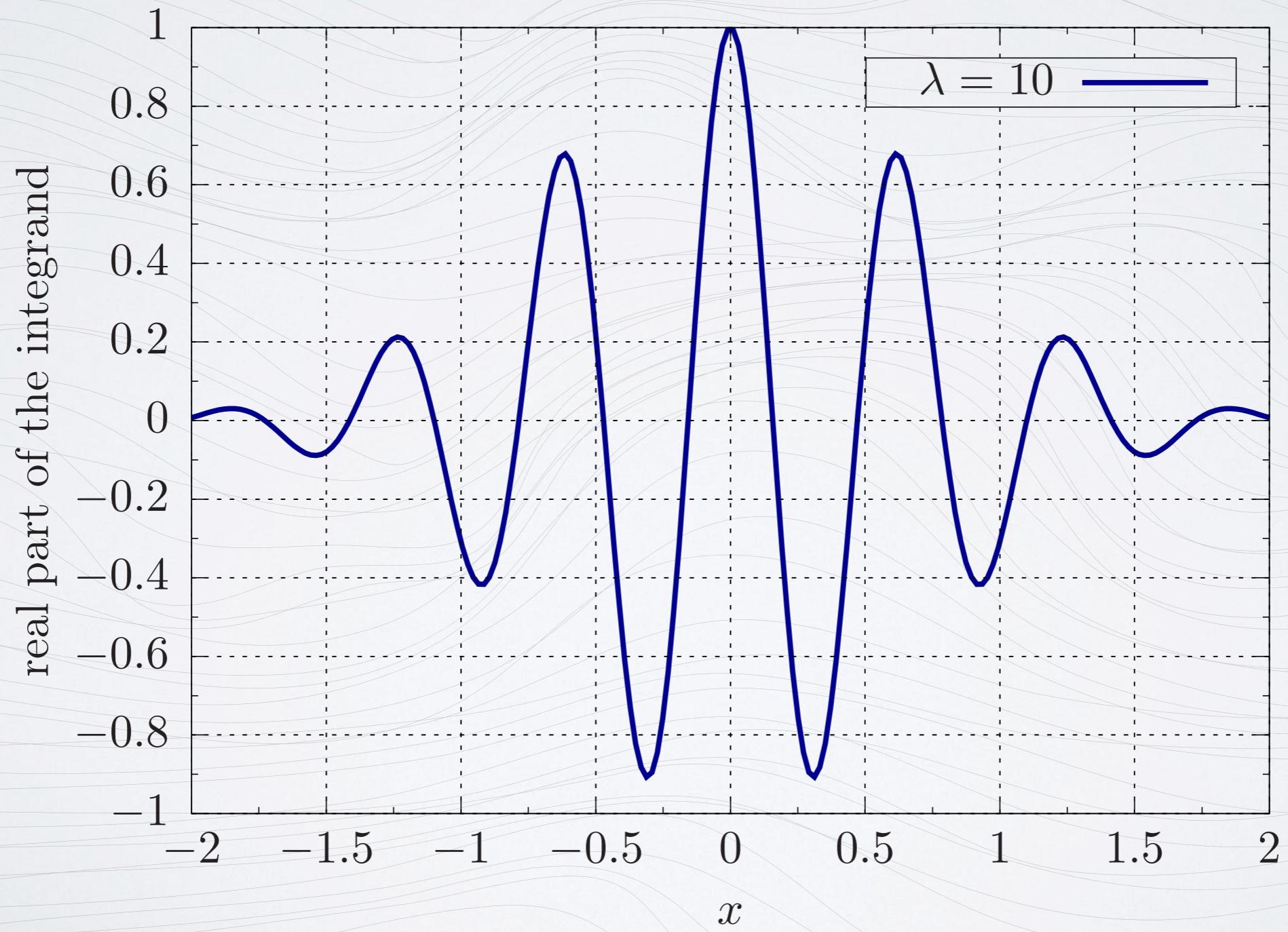
$$Z = \int dx e^{-x^2 + i \lambda x}$$

$$\Re(Z) = \int dx \exp(-x^2) \cos(\lambda x)$$

# Sign Problem

**Example** ( $\lambda = 10$ )

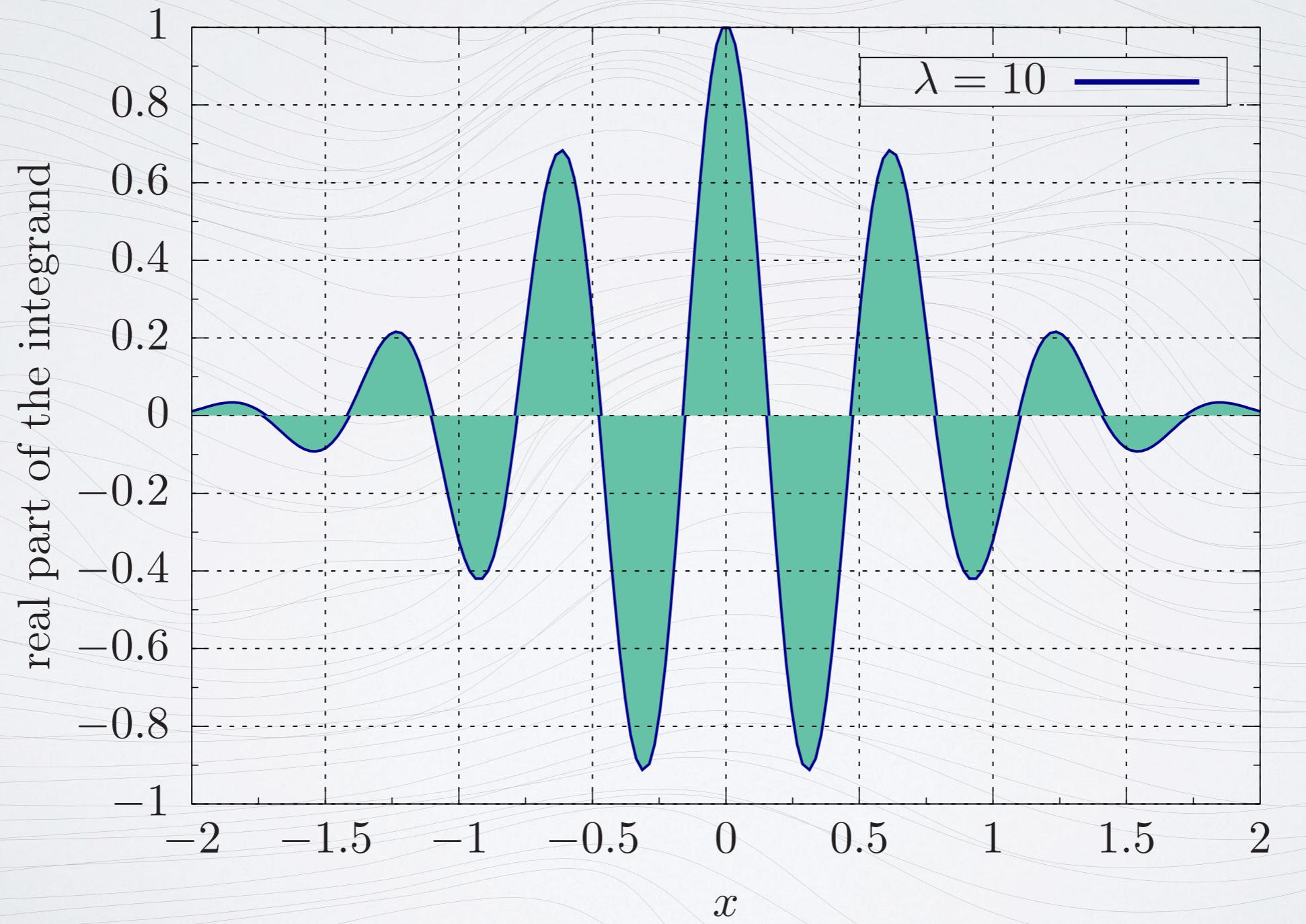
$$Z = \int dx e^{-x^2 + i \lambda x}$$



# Sign Problem

**Example** ( $\lambda = 10$ )

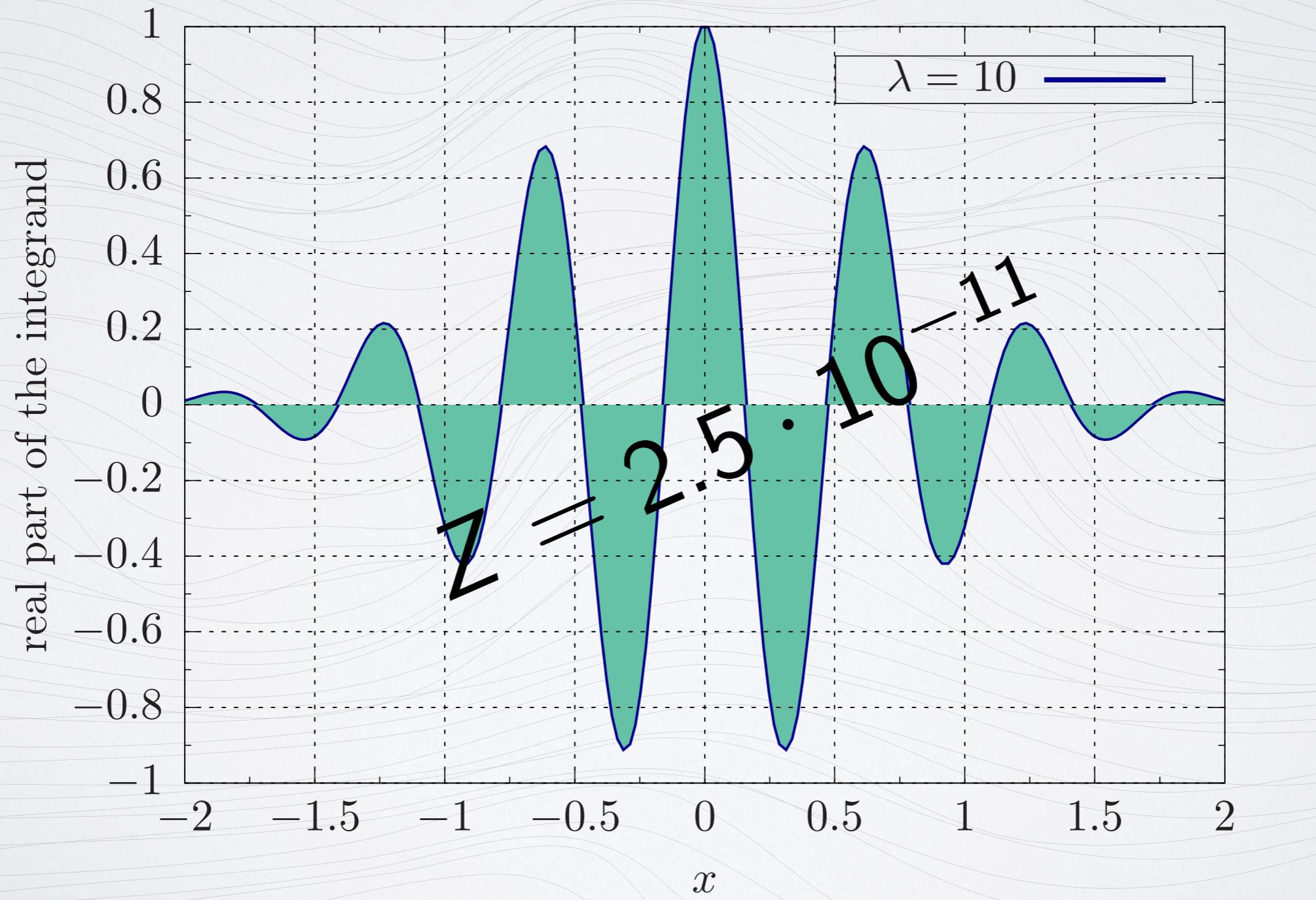
$$Z = \int dx e^{-x^2 + i \lambda x}$$



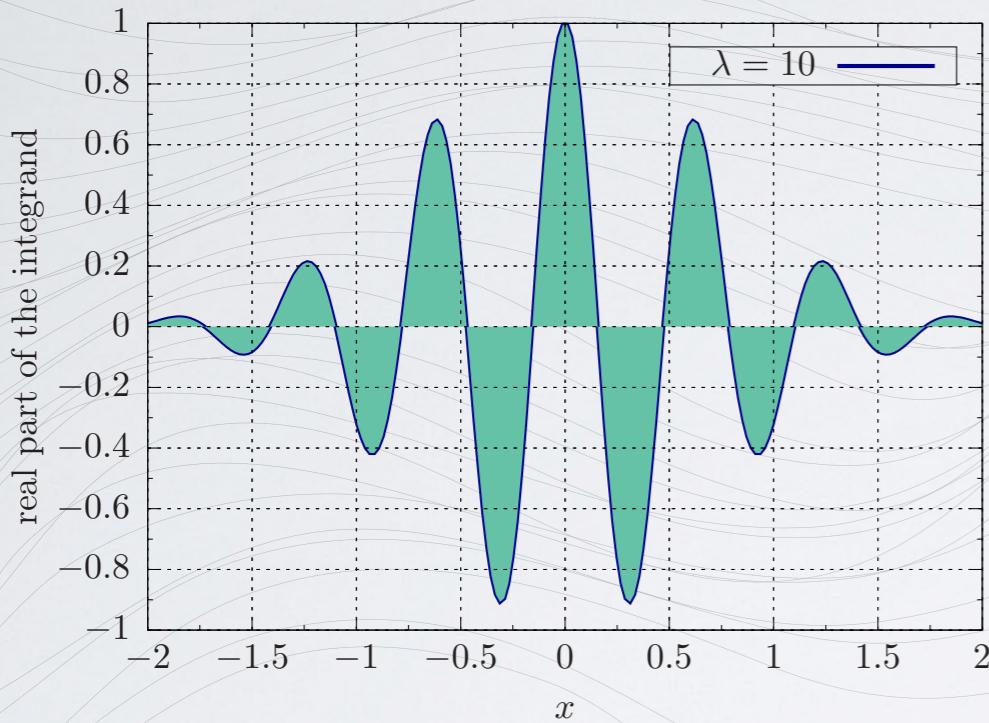
# Sign Problem

**Example** ( $\lambda = 10$ )

$$Z = \int dx e^{-x^2 + i \lambda x}$$



# Sign Problem



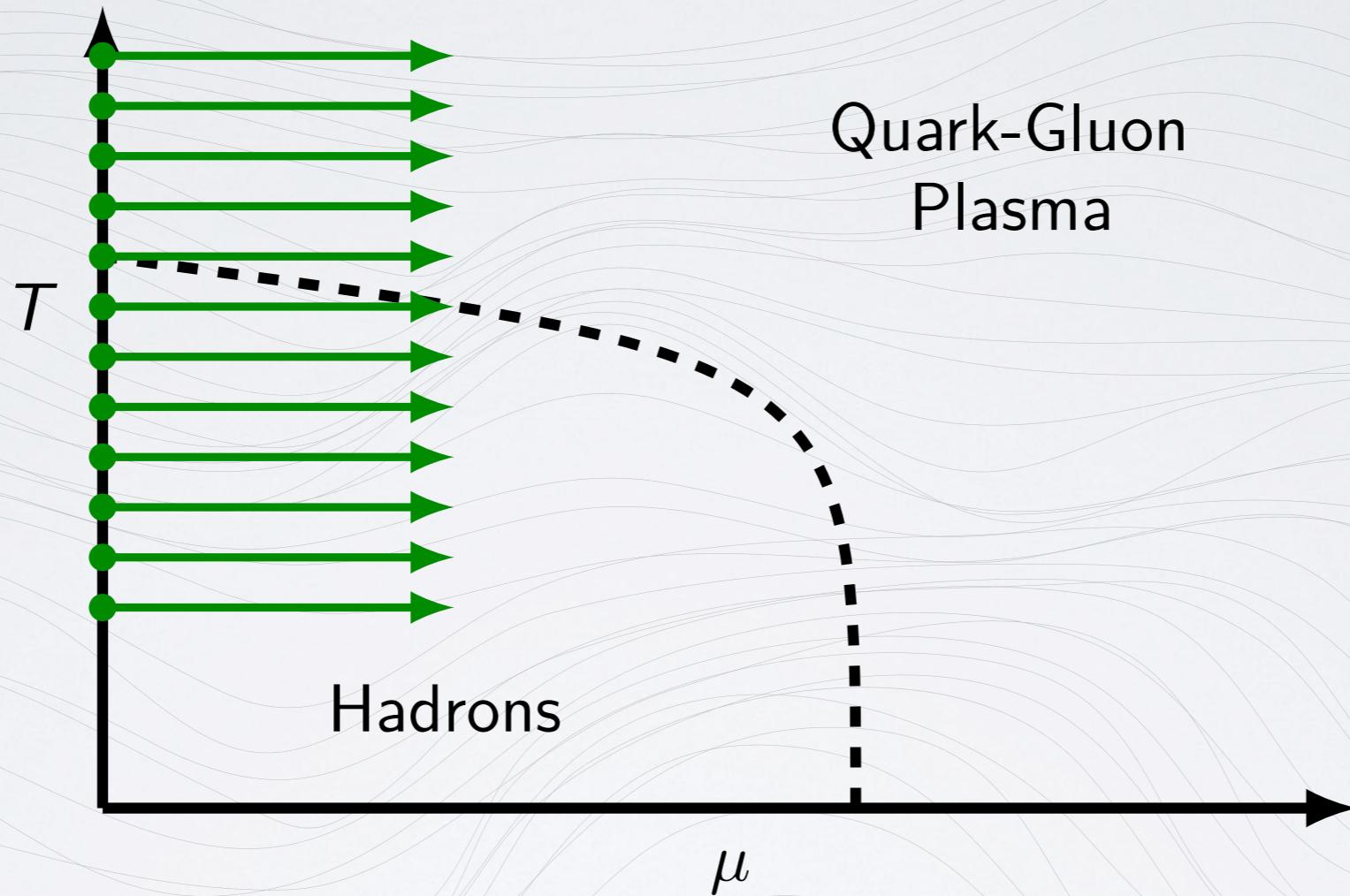
## Sign Problem

- Relies on precise cancellations
- Numerical very challenging
- For QCD:

$$\langle O \rangle = \frac{1}{Z} \int \mathcal{D}[U] O(U) |\det D| e^{i\phi} e^{-S_G(U)}$$

- New methods needed and developed:
  - Taylor Expansion, Imaginary  $\mu$ , Deforming the contour, ...
  - Focus here: Complex Langevin

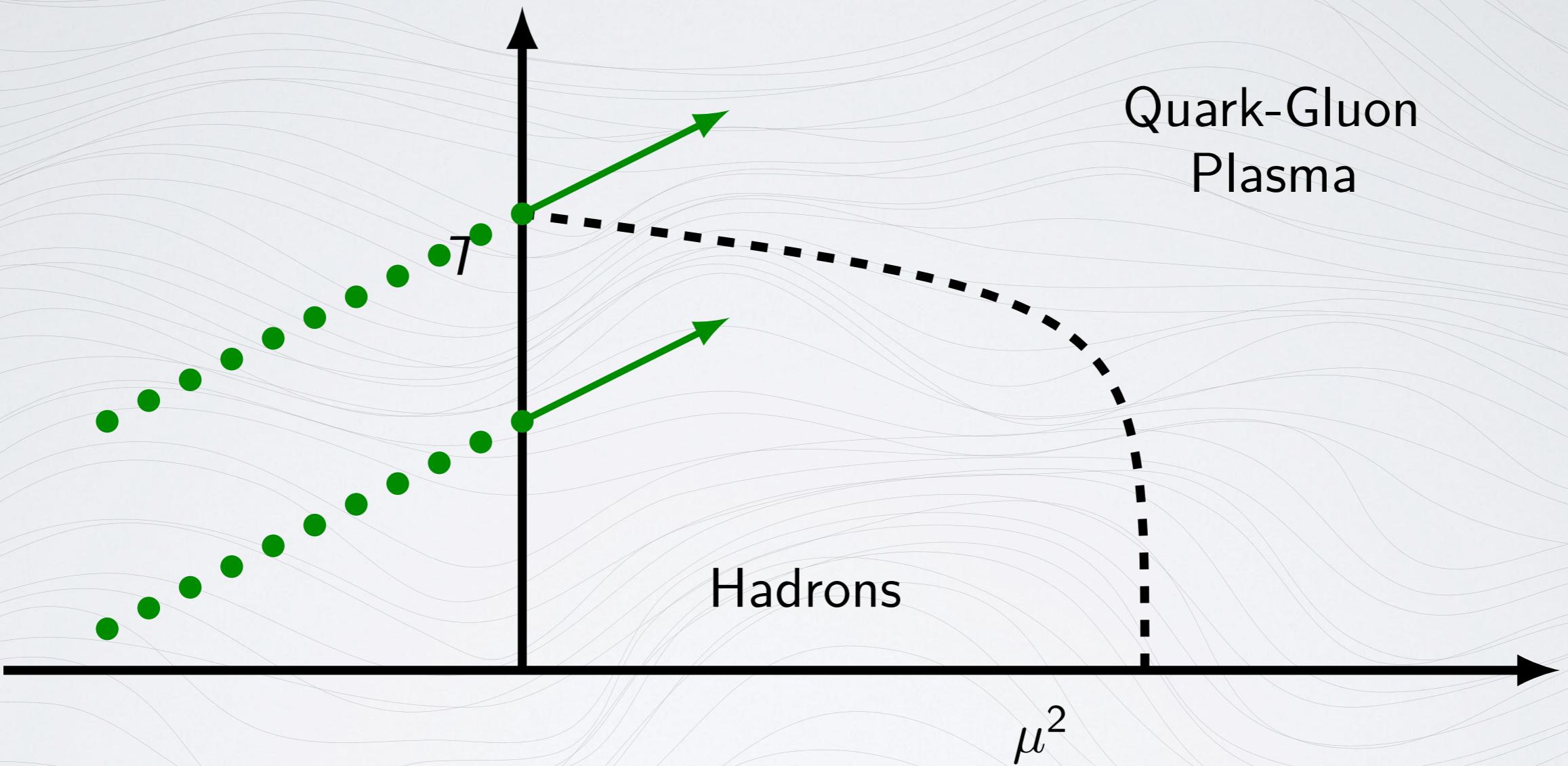
# Taylor Expansion



- Simulate at zero chemical potential and expand

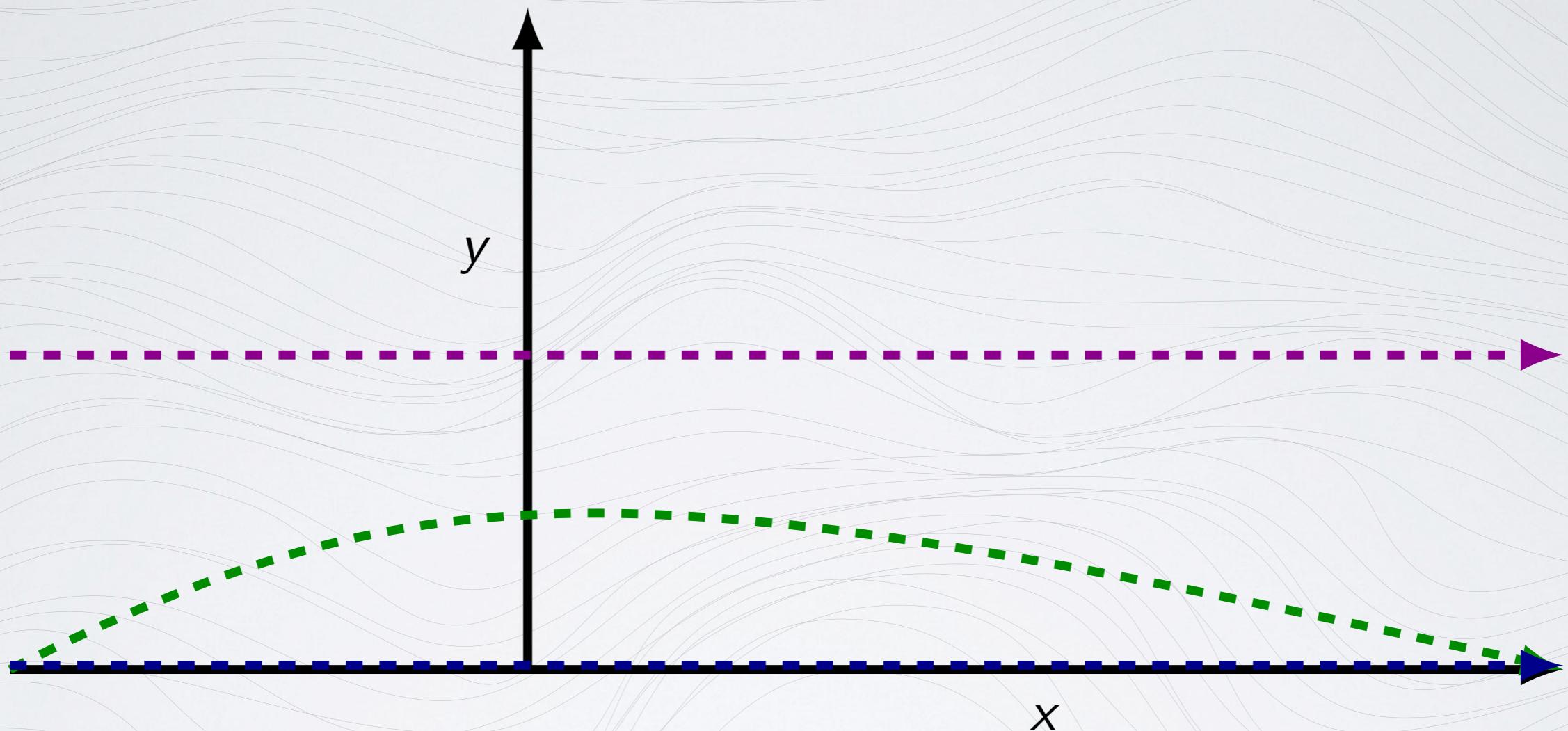
$$\frac{p}{T^4} = \sum_k c_k(T) \left(\frac{\mu}{T}\right)^k, \quad k = 0, 2, \dots$$

# Imaginary $\mu$



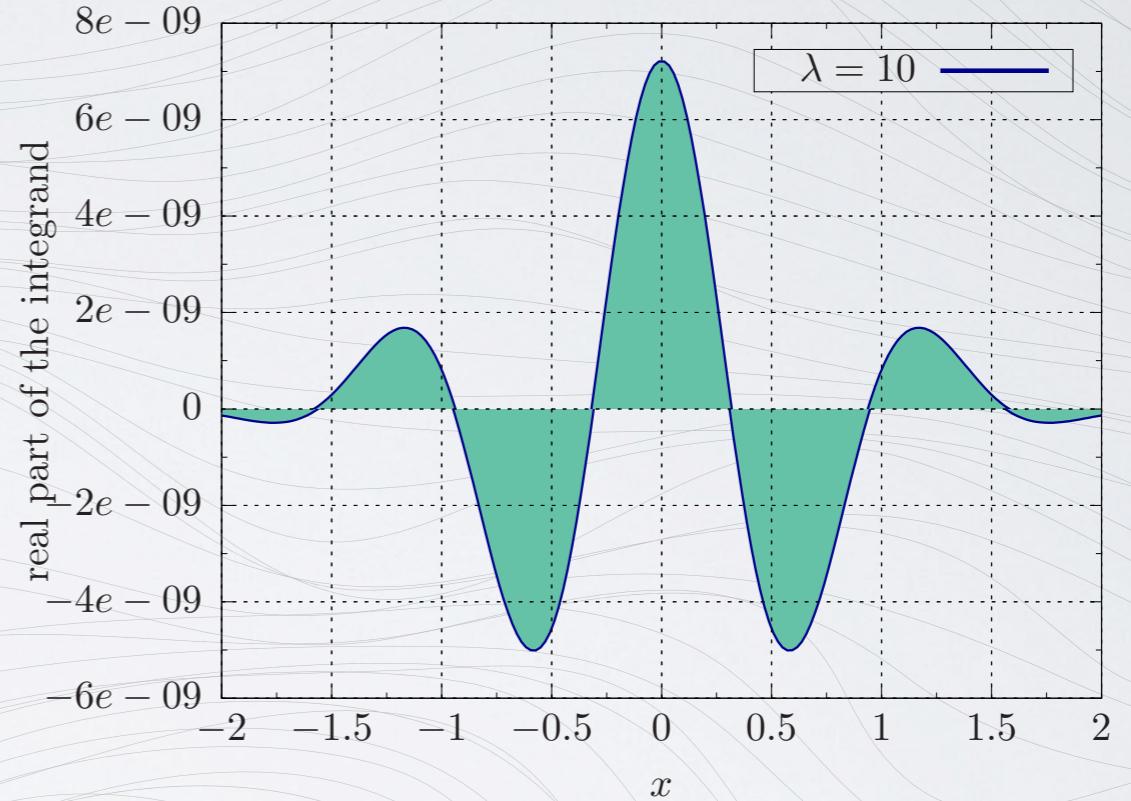
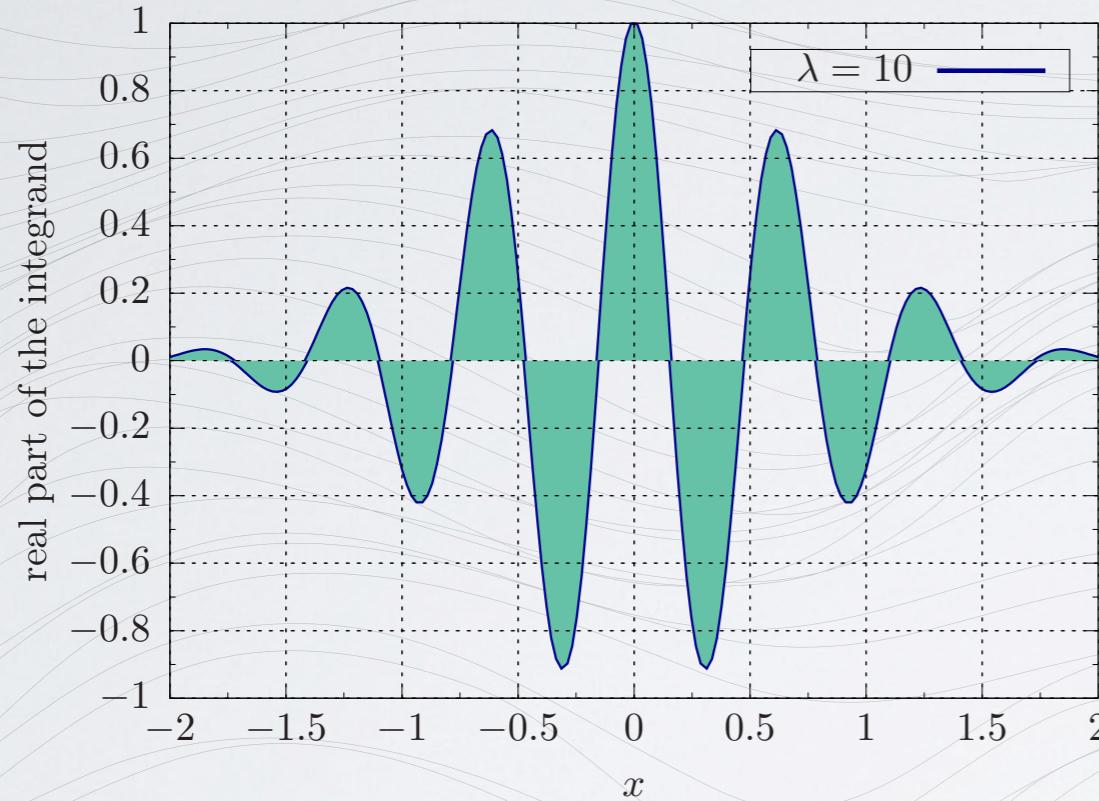
- Simulate at imaginary chemical potential and extrapolate to the QCD phase diagram

# Complex Deformation



- **Go complex!**
- Deform the integration contour to reduce sign problem

# Complex Deformation



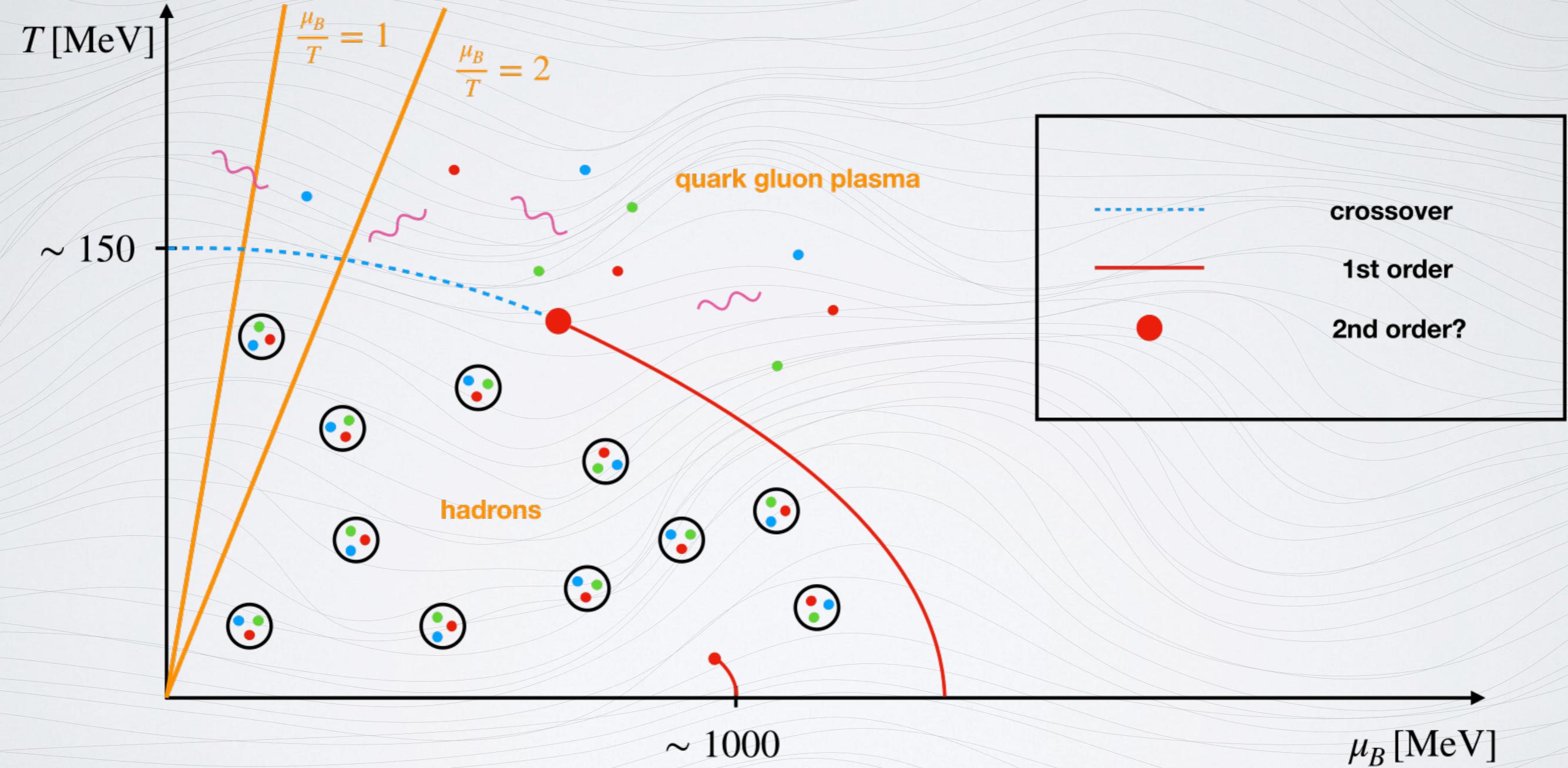
$$z = x - \frac{1}{4} i \lambda$$

$$Z = \int dx e^{-x^2 + i \lambda x}$$

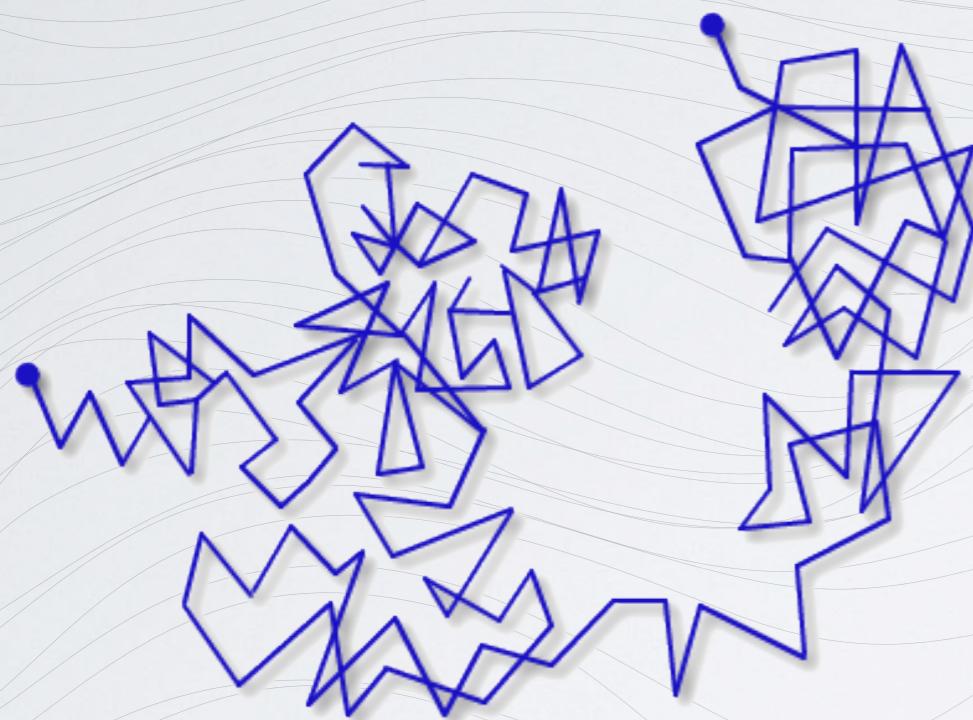
$$Z = \int dz e^{-z^2 + i \lambda z}$$

- Previous example: Deform contour

# QCD phase diagram



# Complex Langevin



- Complexify degrees of freedom

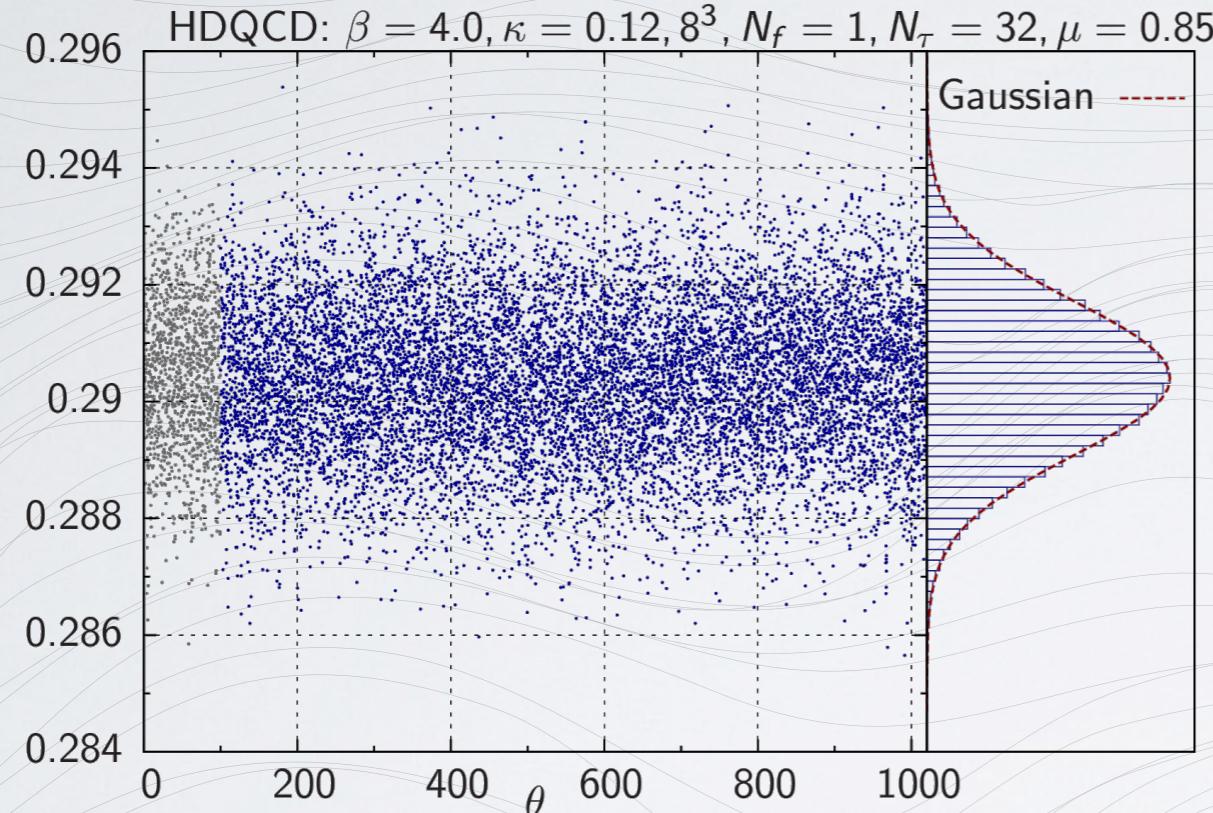
$$x \rightarrow z = x + i y$$

- Stochastic Quantization:  
Langevin Eq:

$$\frac{\partial z}{\partial \theta} = \frac{\partial S}{\partial z} + \eta(\theta)$$

- Sign problem can be circumvented, even if it is severe! :)
- However, convergence only when:
  - Action and observables are holomorphic
  - Extension into the non-SU(3) manifold is compact

# Complex Langevin



- Gauge theories (QCD)

$$SU(3) \rightarrow SL(3, \mathbb{C})$$

- Non-compact gauge group

$$U_{x,\mu} = \exp[i a \lambda_c (A_{x,\mu}^c + i B_{x,\mu}^c)]$$

- Update scheme (First order discretisation)

$$U_{x,\mu}(\theta + \epsilon) = \exp[i a \lambda_c (-\epsilon D_{x,\mu}^c S + \sqrt{\epsilon} \eta_{x,\mu}^c)] U_{x,\mu}(\theta)$$

- Accept-reject step not possible, but extrapolation  $\epsilon \rightarrow 0$

# Foundation

- Complex Langevin  $\leftrightarrow$  Fokker-Plank equation
  - Stationary solution of FP is equilibrium solution  $e^{-S}$
- Mathematical foundations  $\leftrightarrow$  Criteria of correctness
  - Aarts & Stamatescu, JHEP 09 (2008) 018
  - Seiler et.al., Phys. Lett. B723 (2013)
  - Nishimura et.al., Phys. Rev. D 92 (2015)
  - Scherzer et. al., Phys. Rev. D 101 (2020)
- More work on the foundation needed, but getting there :)
- Criteria more or less known, but can only be checked afterwards ...

# Stablising complex Langevin

- Complexification creates enlarged space, i.e.  $SL(3, \mathbb{C})$  - Doubling of degrees of freedom
- Keep simulations close to  $SU(3)$  with small excursions
- Potential issues (seen in models and simulations):
  - Runaway trajectories observed (exploring all of  $SL(3, \mathbb{C})$ )
  - Convergence to wrong result (stable)
  - $\log \det M$  has multiple branch cuts (non-holomorphic)
  - Extrapolation in step-size  $\epsilon$  needed
  - For large  $\mu$  condition number of  $M$  explodes
  - ...

# Stablising complex Langevin

- Methods (actively developed):

- Adaptive step - small steps for large forces

Aarts et. al.,  
Eur. Phys. J.A 49 (2013)

- Gauge cooling - use gauge transformations

Seiler et. al.,  
Phys. Lett. B 723 (2013)

- Dynamic stabilization - add force to get closer to SU(3),  
unfortunately non-holomorphic, but  $a \rightarrow 0$

Attanasio & Jäger,  
Eur. Phys. J. C 79 (2019)

- Implicit solvers - needed for stiff SDE

Alvestad, Larsen & Rothkopf  
JHEP 08 (2021) 138

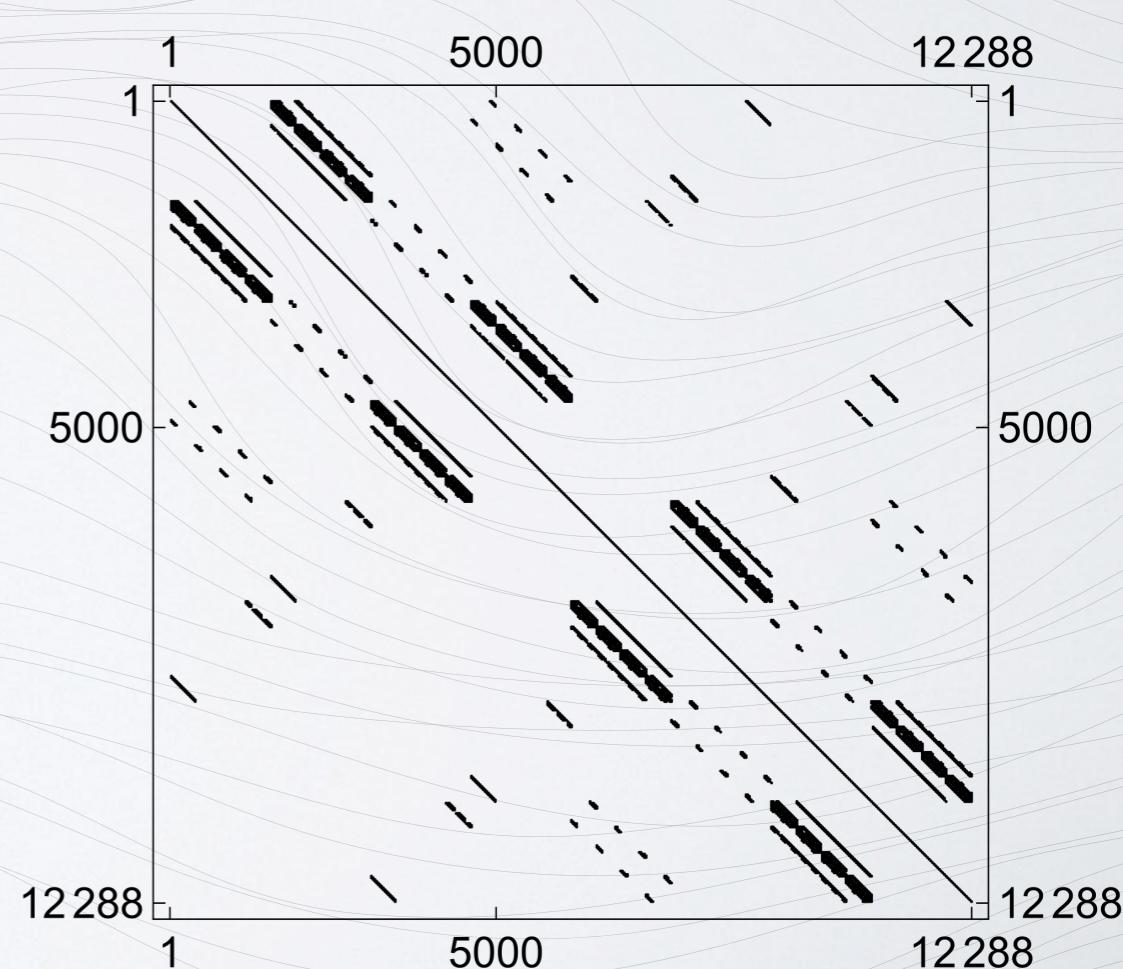
- Kernelled complex Langevin - use a symmetry of Fokker-  
Plank equation, add a kernel in the CL eq.

Alvestad, Larsen & Rothkopf  
JHEP 04 (2023) 057

# Computations: Forces

- Gauge drift (straightforward)
  - $-D_{x,\mu}^a S_G$  combination of plaquettes with derivatives
- Fermionic drift
  - Bilinear noise scheme (not exact)
$$-D_{x,\mu}^a S_F = N_f \text{Tr} \left[ M^{-1} D_{x,\mu}^a M \right]$$
- Update scheme
  - Update gauge more frequently
  - Fermion inversion costly
  - Fermions inversion becomes very expensive (cond. number)

D. Sexty Phys.Lett.B 729 (2014)



# Some QCD Success stories :)

- **Heavy-Dense approximation of QCD**

- Quarks very heavy → Quarks only move in time
- Full Wilson gauge action
- Phase Diagram known (Good check)
- Simpler theory, but still has phase structure

Aarts, Attanasio, Jäger & Sexty,  
JHEP 09, 087 (2016)

- **Full QCD in a small box & small  $\mu$**

- Staggered quarks
- Expected plateaus from quark numbers
- Individual quarks

Ito et. al.,  
JHEP 10, 144, (2020)

# Some QCD Success stories :)

- **Full QCD at small chemical potential**

- Quarks still heavy ( $m_\pi \sim 1400\text{MeV}$ )
- Comparison to Taylor expansion
- Improved action
- Effects of smearing studied

D. Sexty,

Phys. Rev. D 100, 074503 (2019)

- **Full QCD at moderate T and higher densities**

- Lighter quarks ( $m_\pi \sim 480\text{MeV}$ )
- Wilson gauge action and fine lattices ( $a \sim 0.06\text{fm}$ )
- Naive Wilson fermions
- More later!

Attanasio, Jäger & Ziegler,  
2203.13144

# Real-time QCD Success stories :)

- **Kernelled complex Langevin**
  - Strongly coupled quantum anharmonic oscillator
  - Introduction of kernels to Langevin
  - Machine Learning to optimise kernels
  - More later
- **Anisotropic kernel for SU(2) YM**
  - Using anisotropic kernel
  - SU(2) Yang-Mills in 3+1 dimensions
  - Large time extents possible

Alvestad, Larsen & Rothkopf,  
JHEP 04, 057 (2023)

Boguslavski, Hotzy and Müller,  
JHEP 06, 011 (2023)

# Non-QCD success stories...

- **Ultra-cold atoms**
  - Spin-Orbit coupling
  - Bosons with quartic interaction
  - Lattice formulation leads to non-abelian background
  - Time derivative makes action complex
- **Polymers and Complex Fluids**
  - Mixtures require non-equilibrium processing
  - Hamiltonian complex for their model
  - Complex Langevin used to study the model

Attanasio & Drut,  
Phys. Rev. A 101 (2020)

Fredrickson, Ganesan, & Drolet,  
*Macromolecules*, 35, 2002.

# Some of our recent results

F.Attanasio, B. Jäger and F. Ziegler



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# Lattice Setup

- **Lattice setup**

- Wilson plaquette action  $\beta = 5.8 \leftrightarrow a = 0.06 \text{ fm}$
- Two-flavour dynamical fermions Wilson Fermions ( $c_{sw} = 0$ )
- Pion mass  $\kappa = 0.1544 \leftrightarrow m_\pi \sim 480 \text{ MeV}, m_N = 1.3 \text{ GeV}$
- Volume  $V = 24^3 \leftrightarrow m_\pi L = 3.5$

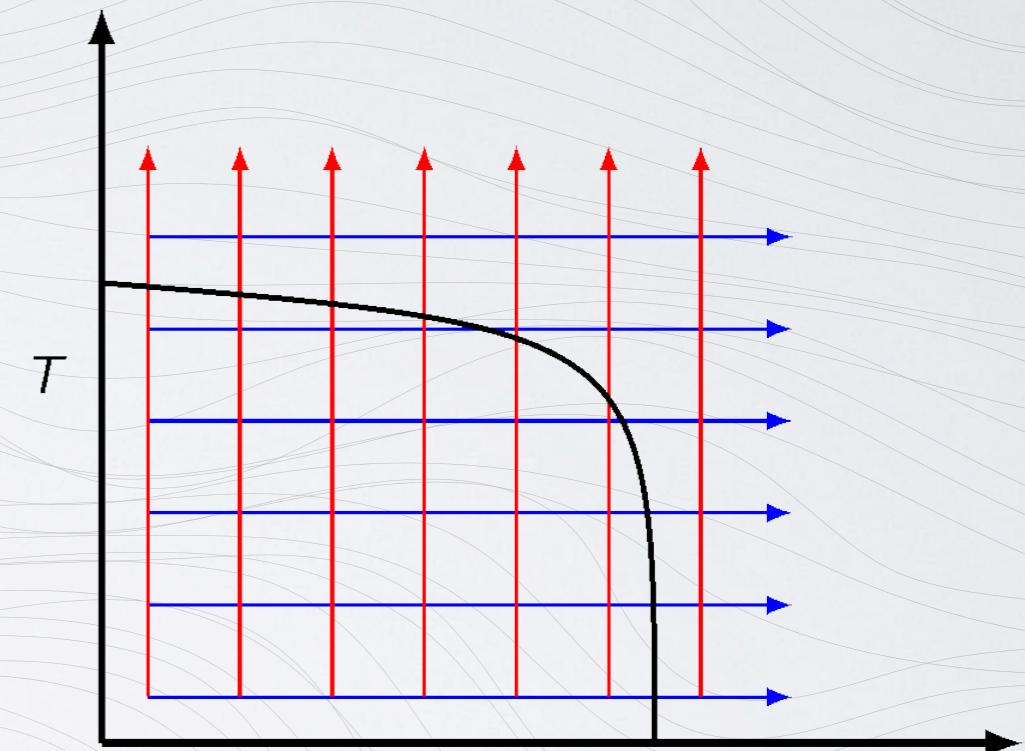
parameters based on  
hep-lat:0512021

- **Phase diagram scan**

- Temperature  $N_\tau = 4 - 128 \leftrightarrow 25 - 800 \text{ MeV}$
- Chemical potential  $a\mu = 0 - 2 \leftrightarrow \mu = 0 - 6500 \text{ MeV}$
- Gauge Cooling, Adaptive Stepsize & Dynamic Stabilisation

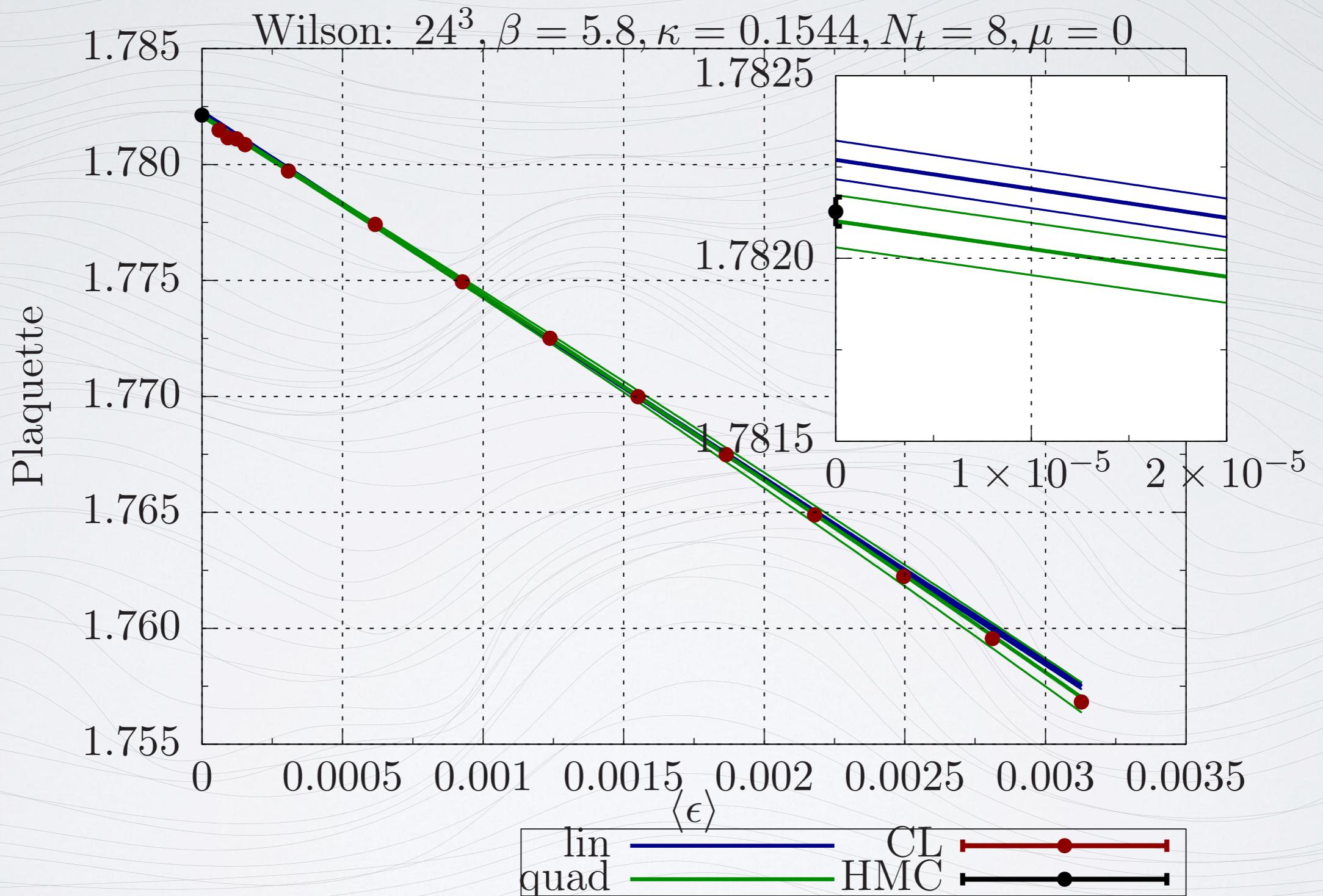
# Results

- **Consistency checks @  $\mu = 0$** 
  - HMC vs. CL
- Histograms
- Observables
  - Fermion density
  - Polyakov loop
- Numerics / Stability
  - Unitarity norm (distance to SU(3))
  - Iterations (Conjugate Gradient)
- Equation of state



Wilson @  $m_\pi^\mu \sim 480 \text{ MeV}$

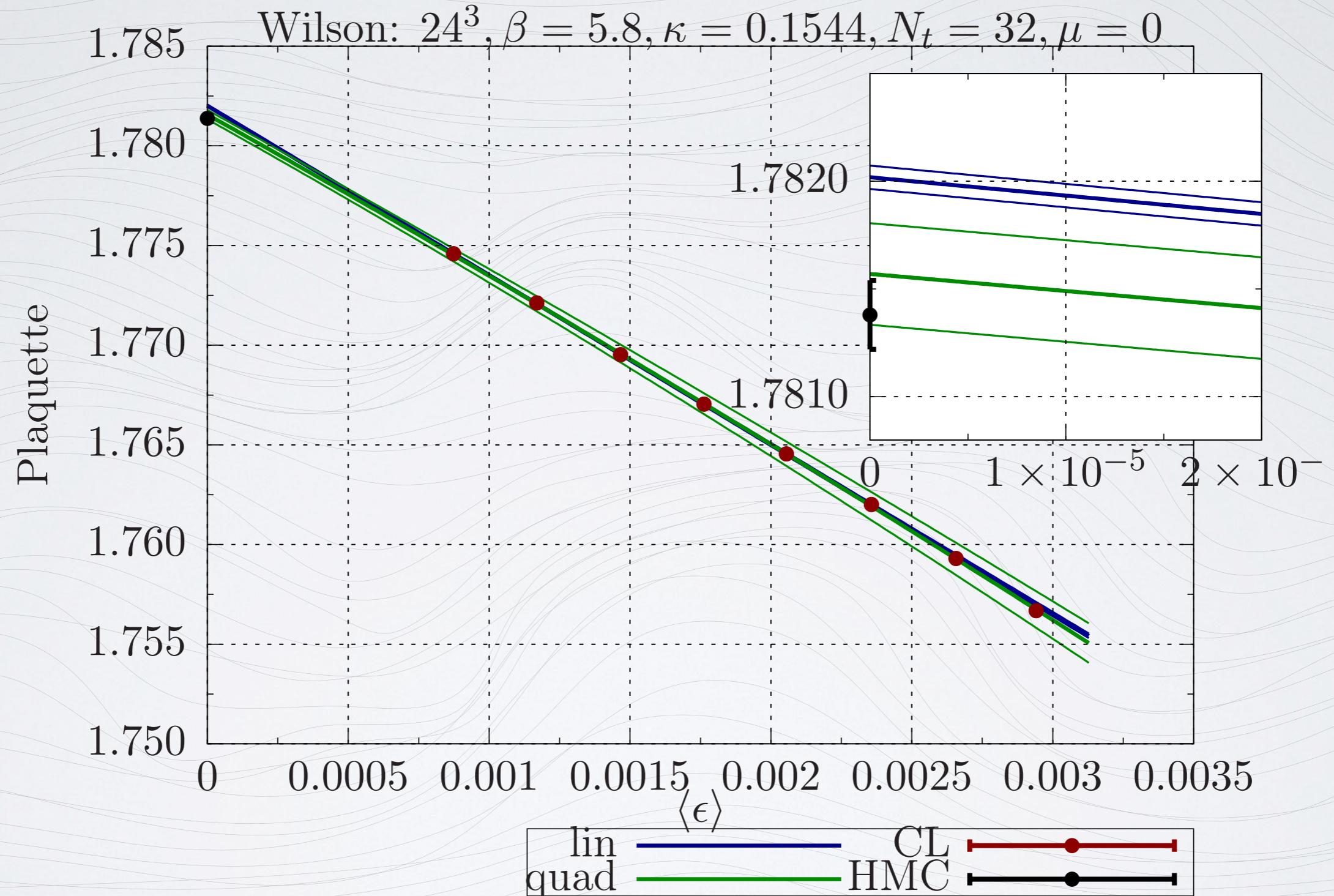
# HMC vs CL - deconfined phase



@  $\mu = 0$

$N_t = 8 \leftrightarrow T = 400 \text{ MeV}$

# HMC vs CL - confined phase

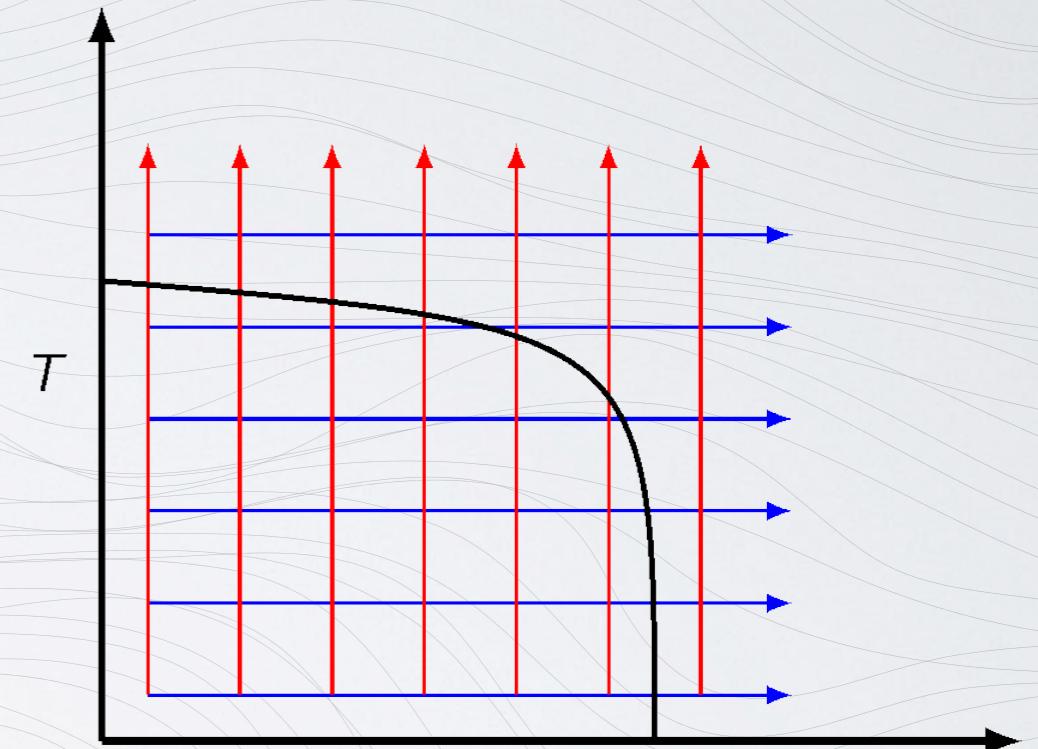


@  $\mu = 0$

$N_t = 32 \leftrightarrow T = 100 \text{ MeV}$

# Results

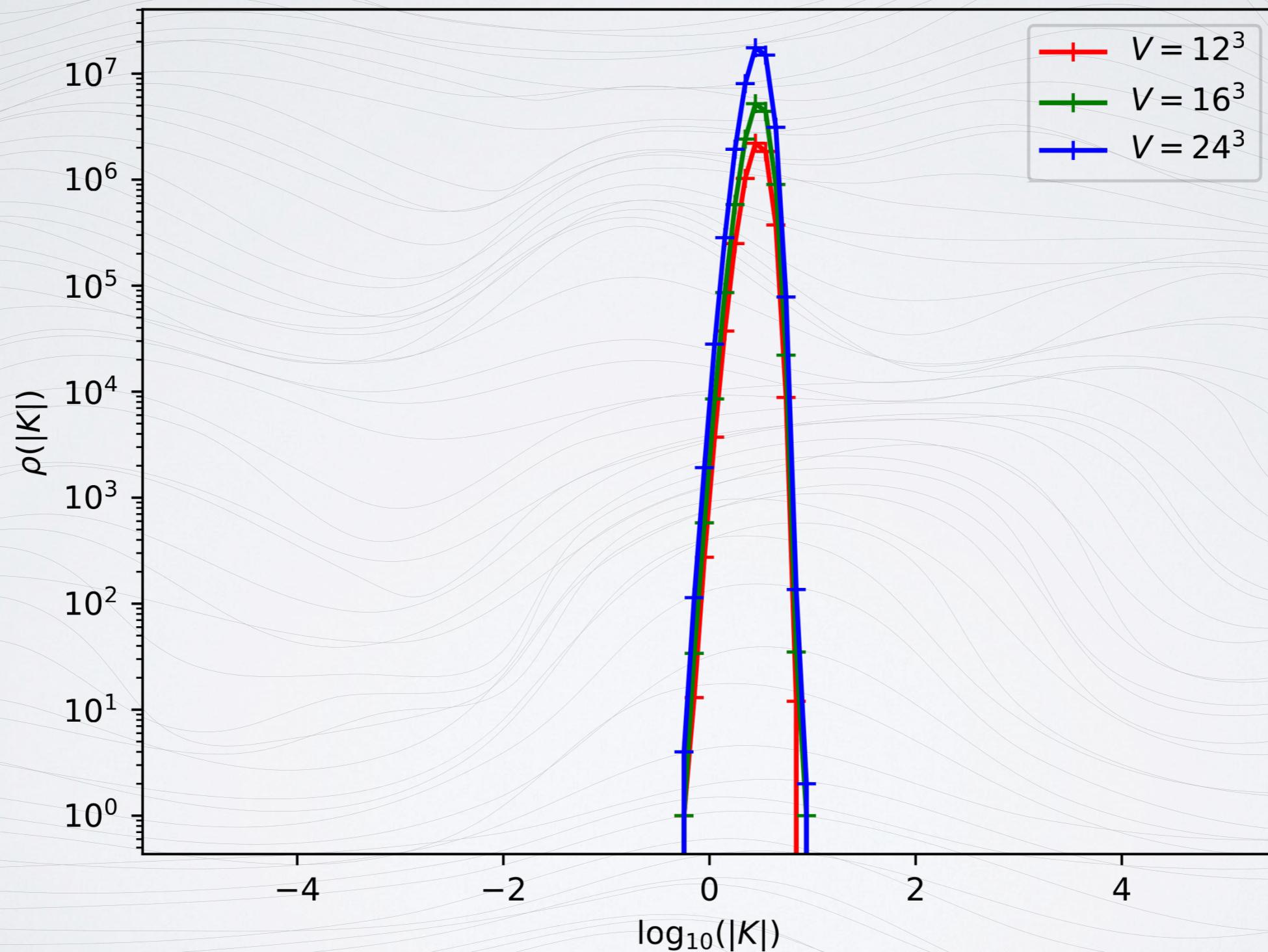
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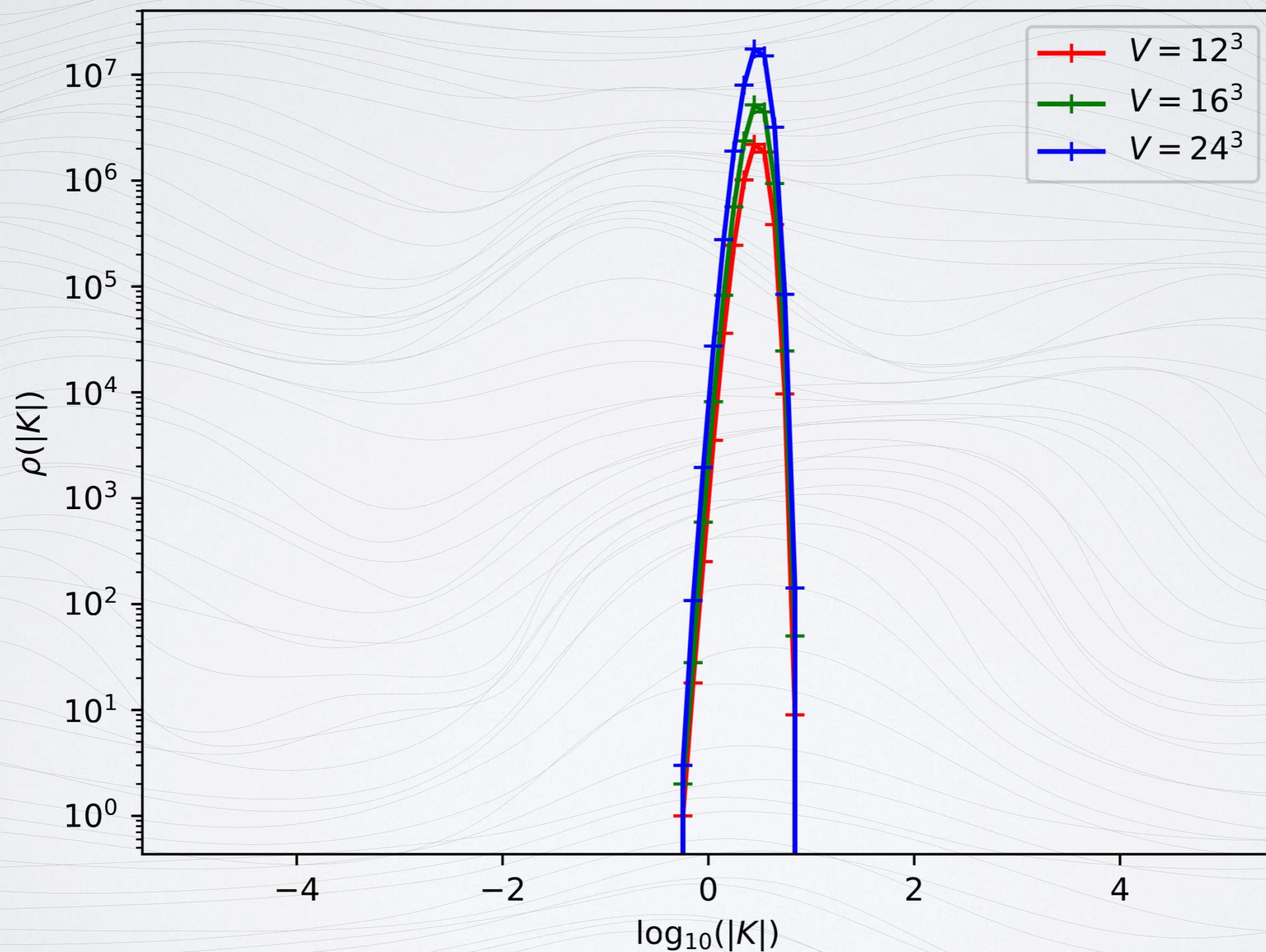
# Histograms

$Nt = 32, \mu_B/m_N = 0.0$



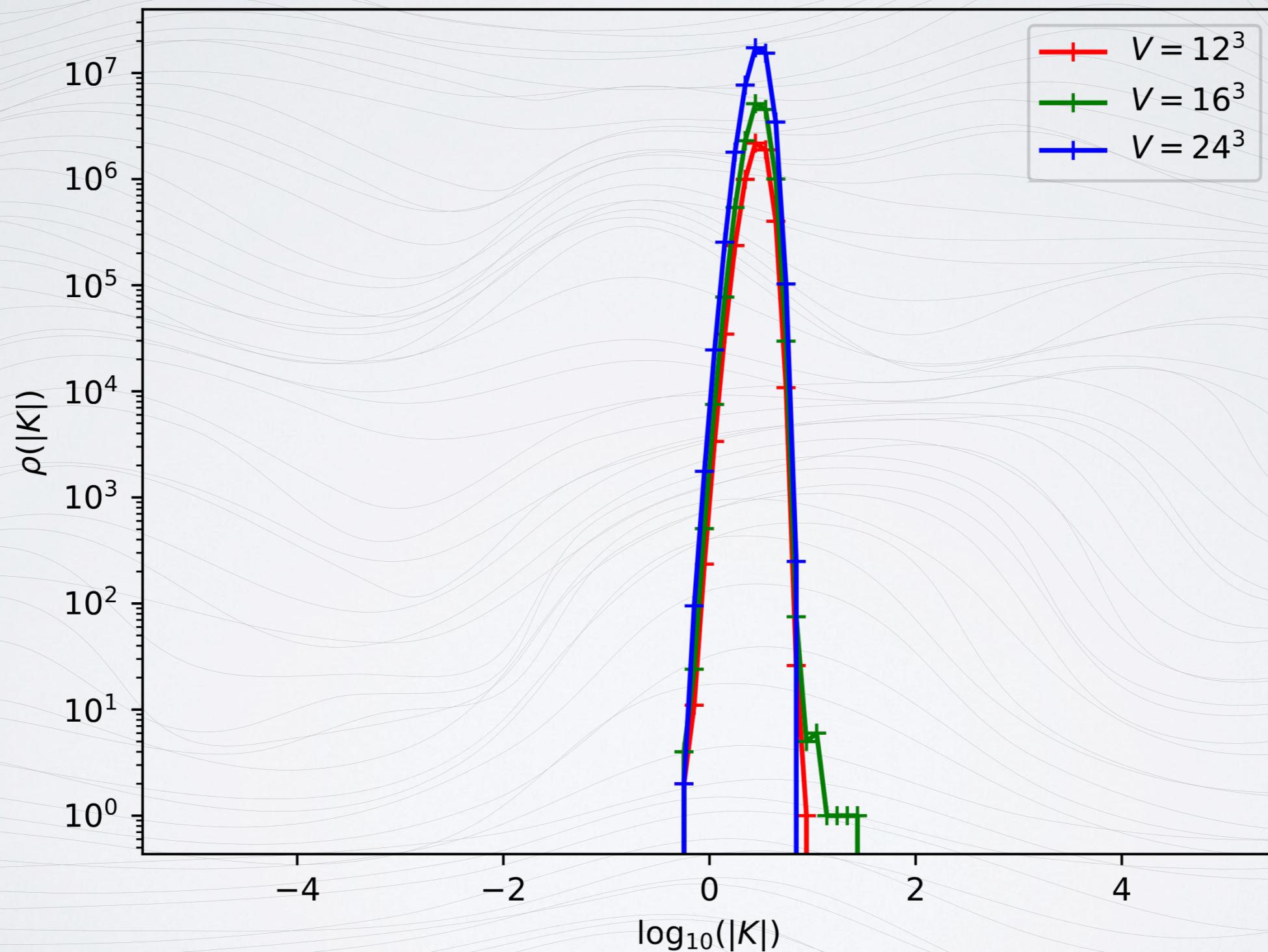
# Histograms

$Nt = 32, \mu_B/m_N = 0.46$



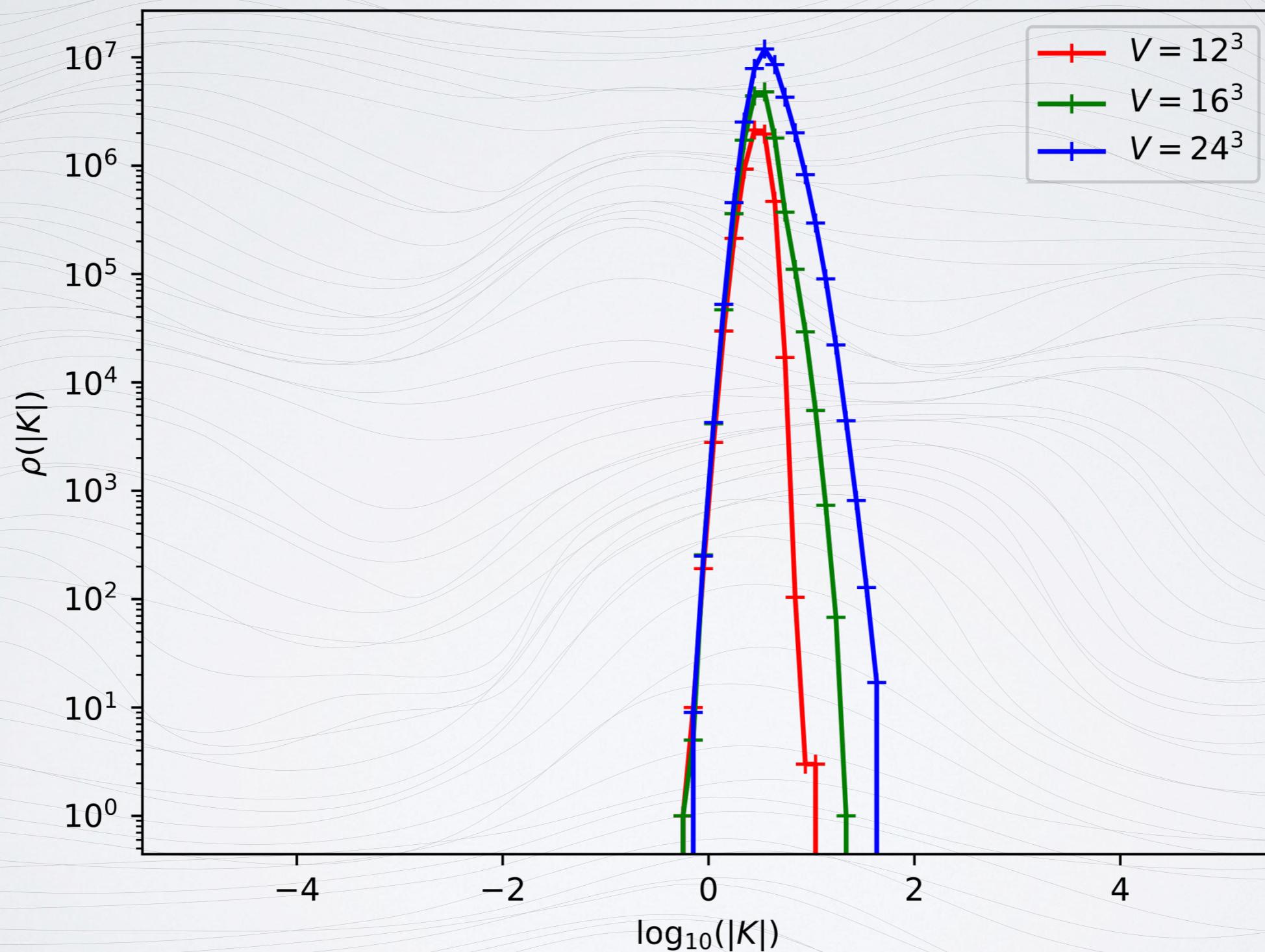
# Histograms

$Nt = 32, \mu_B/m_N = 0.76$

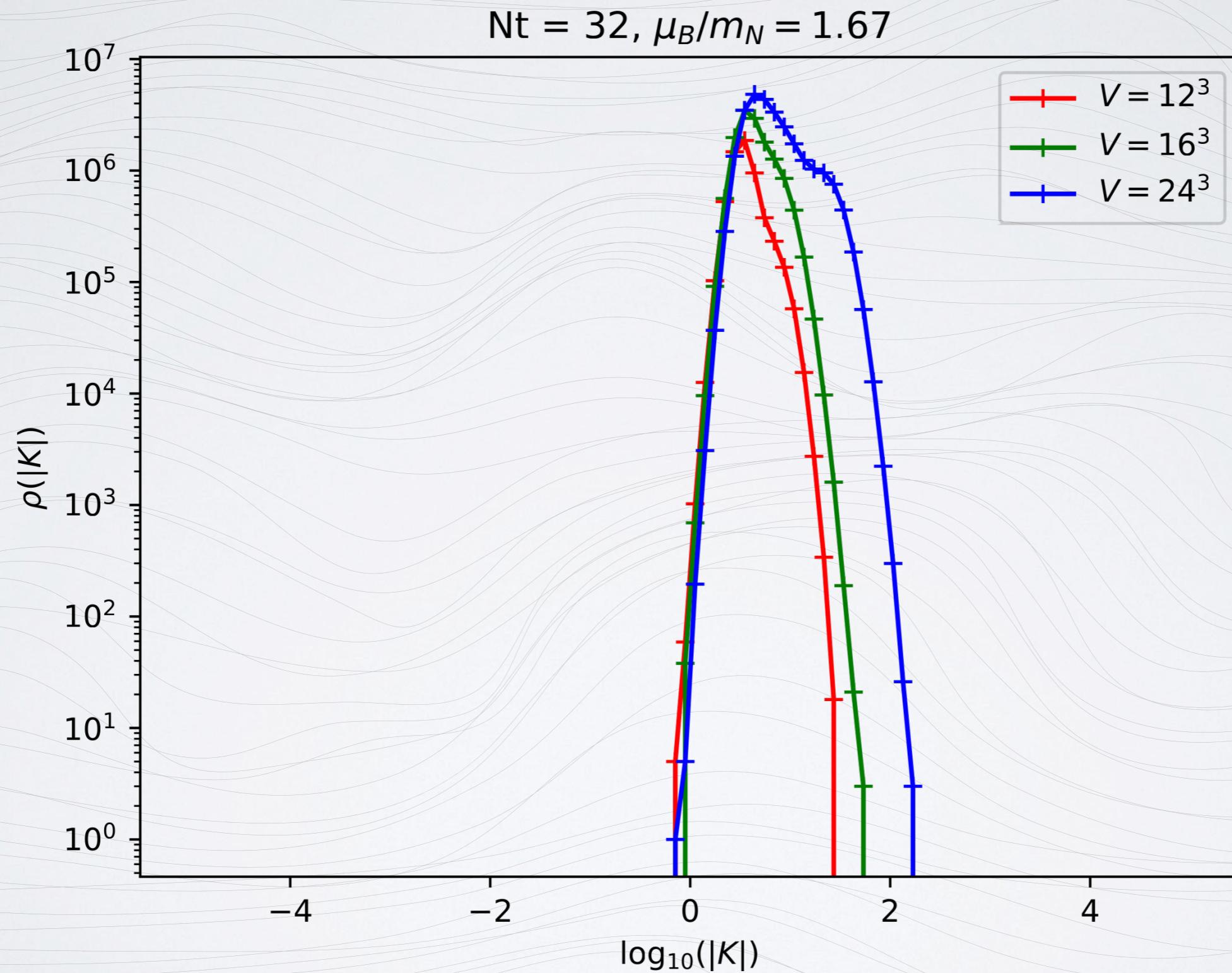


# Histograms

$N_t = 32, \mu_B/m_N = 1.21$

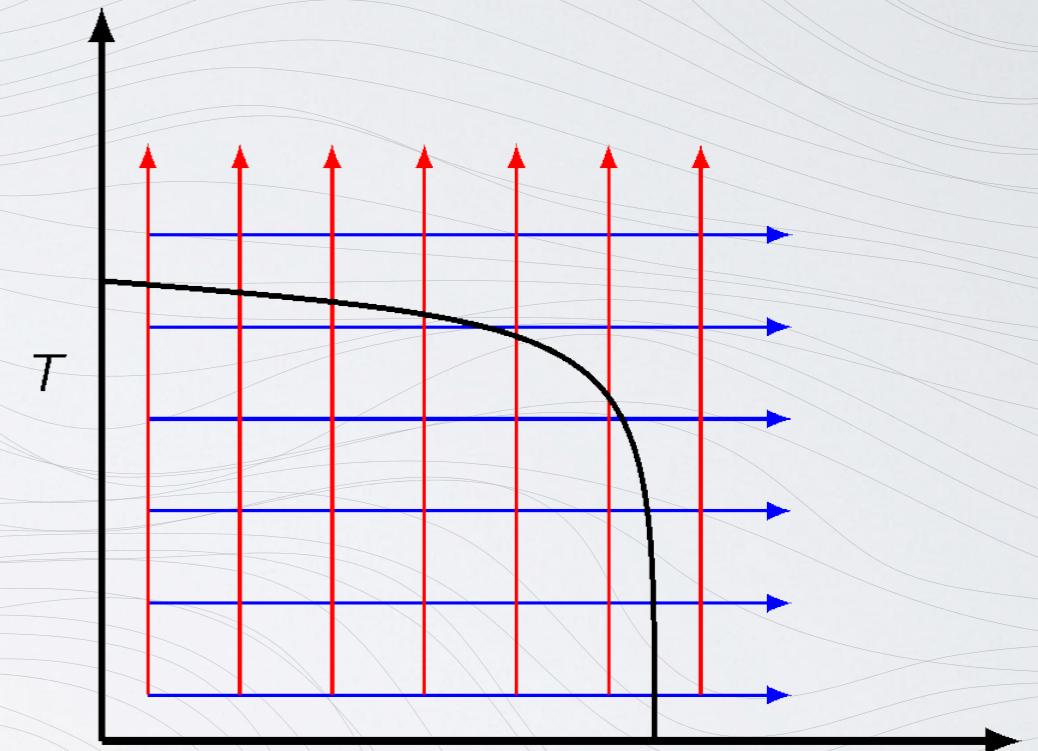


# Histograms



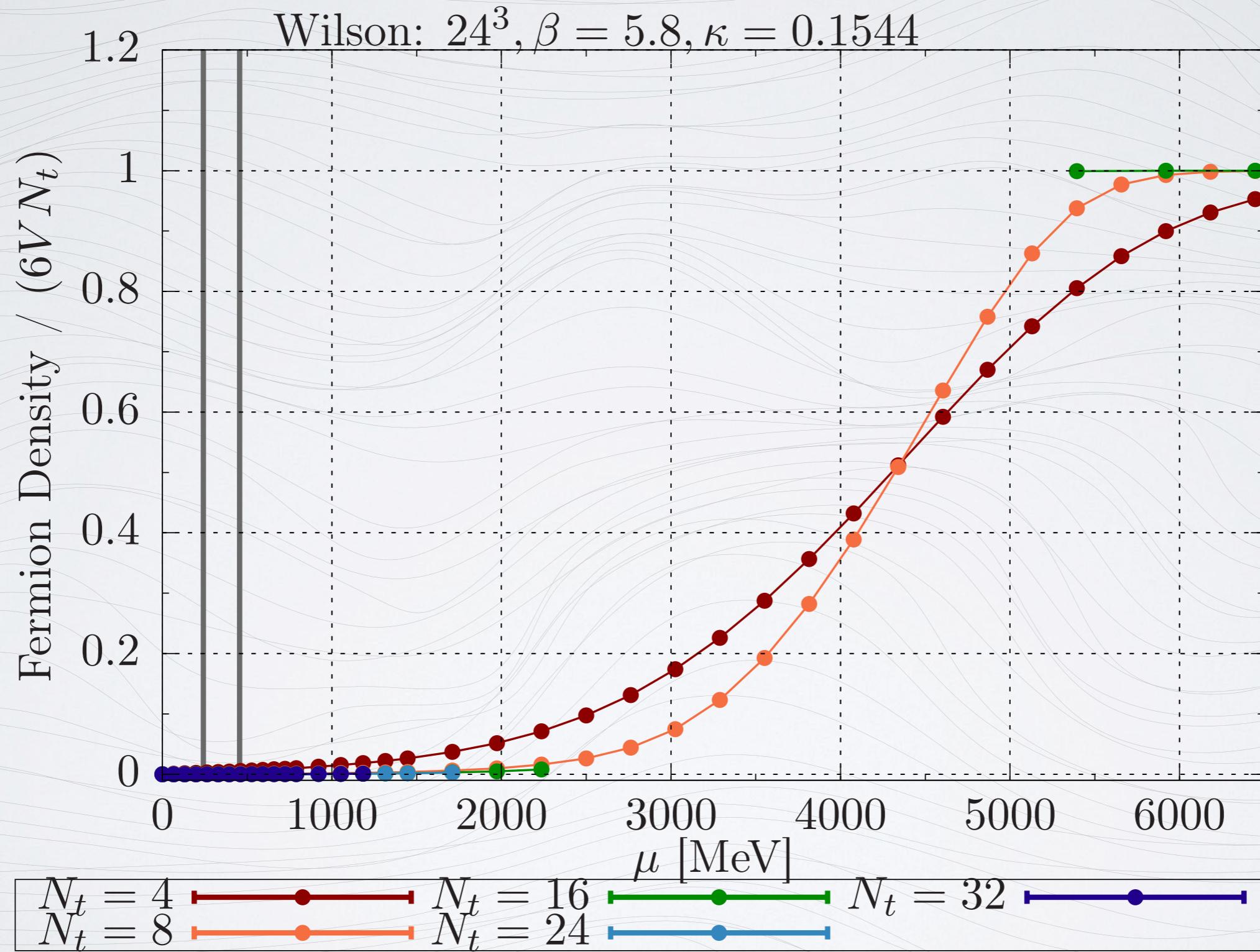
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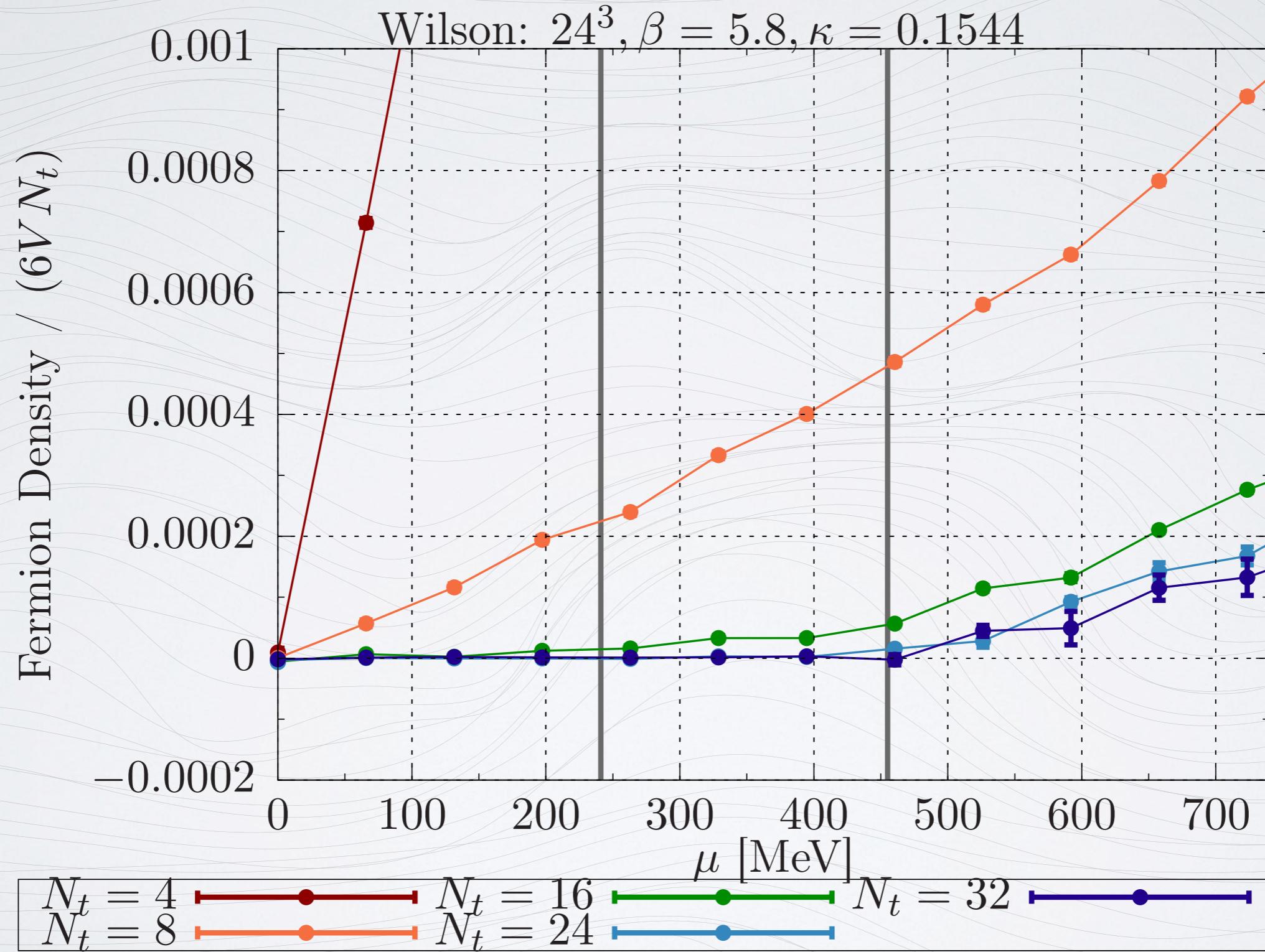


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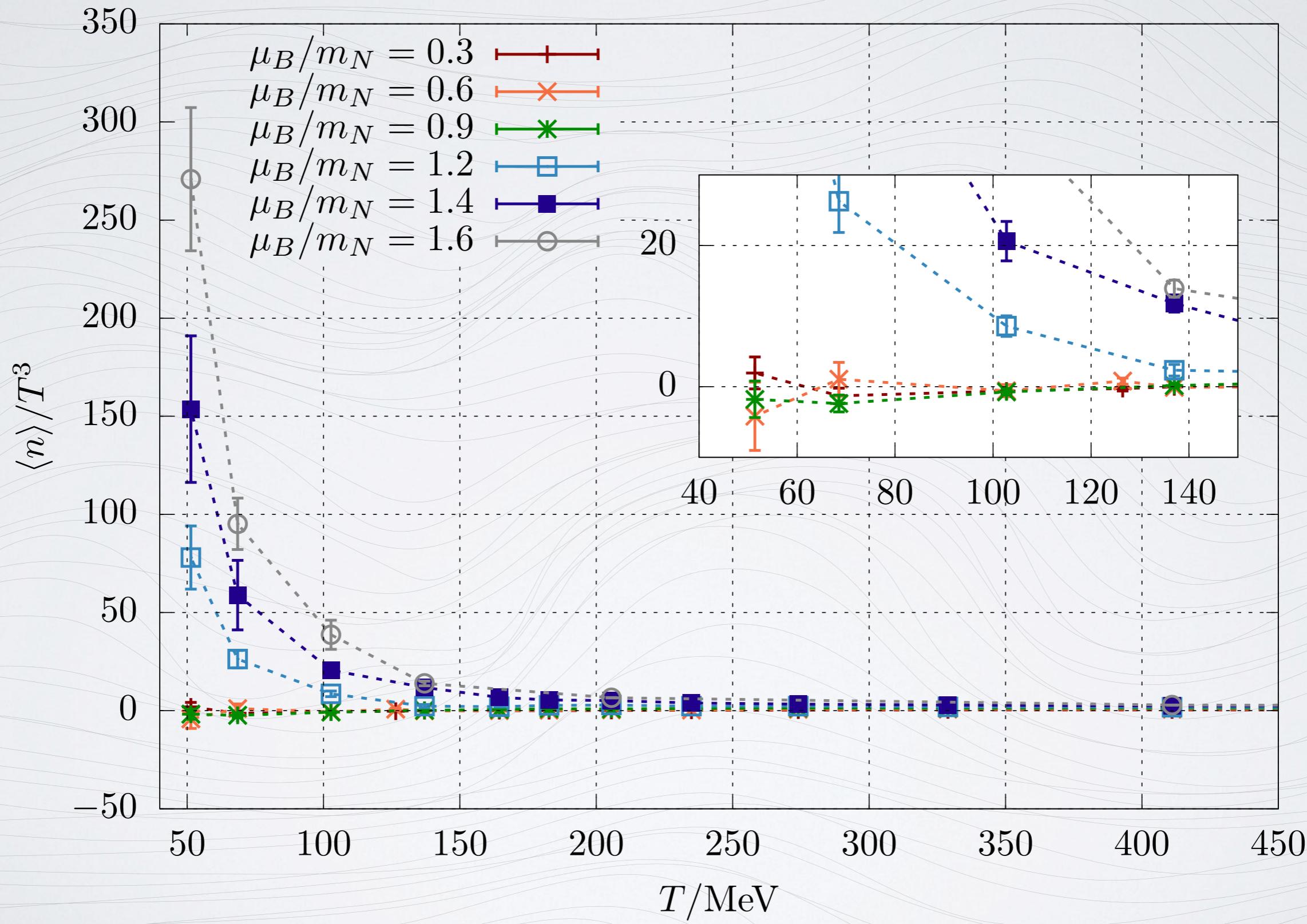
# Fermion Density



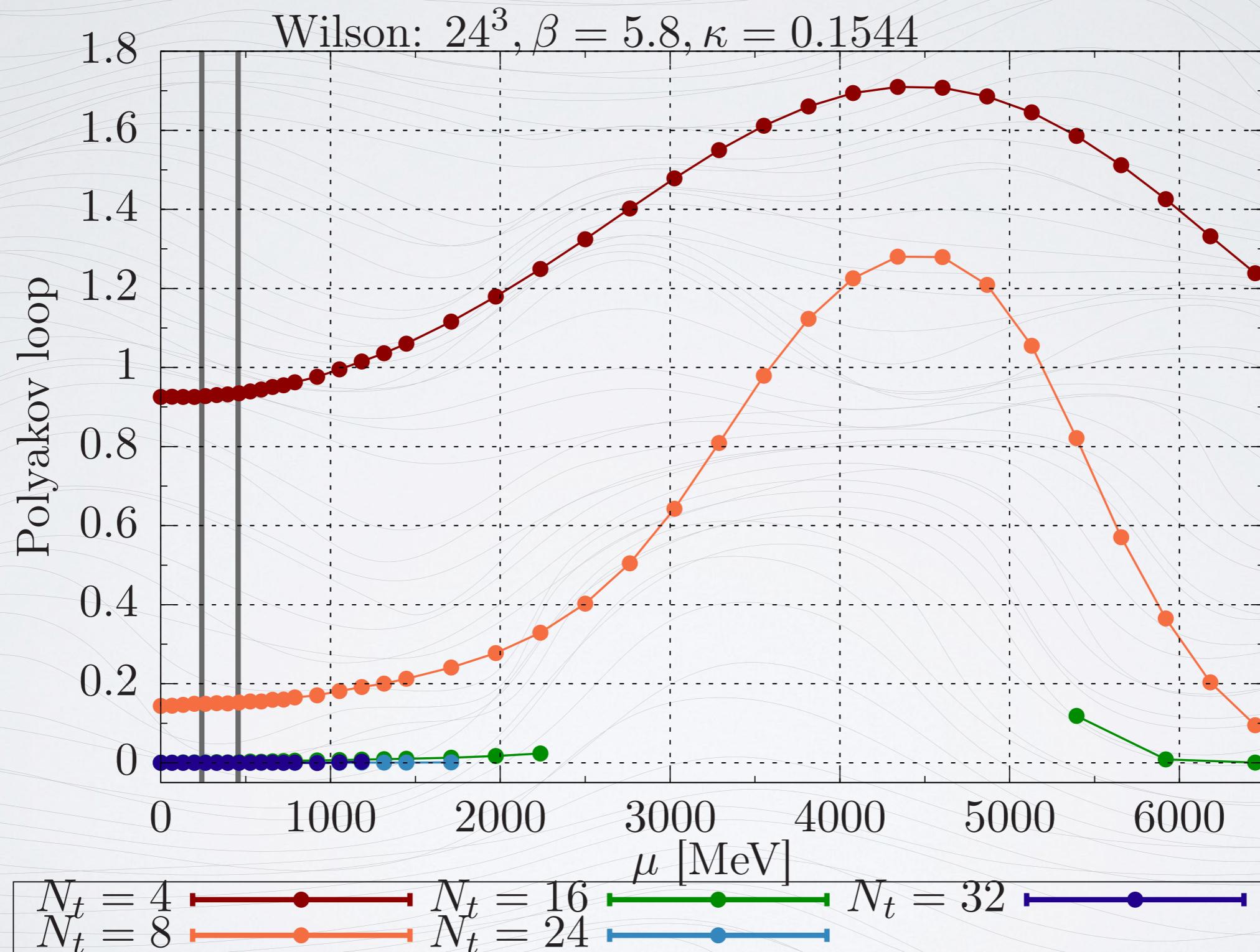
# Fermion Density



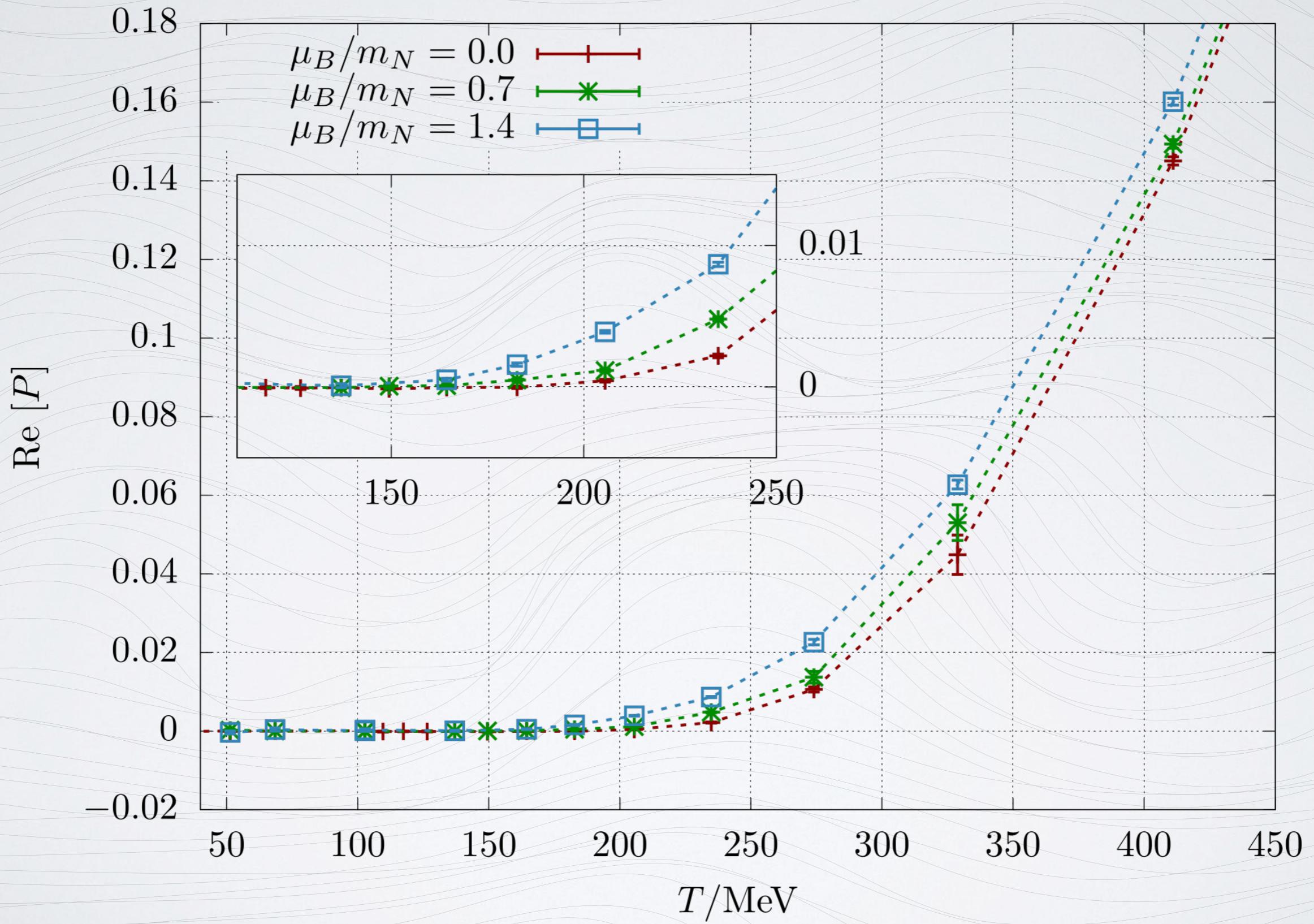
# Fermion Density



# Polyakov Loop

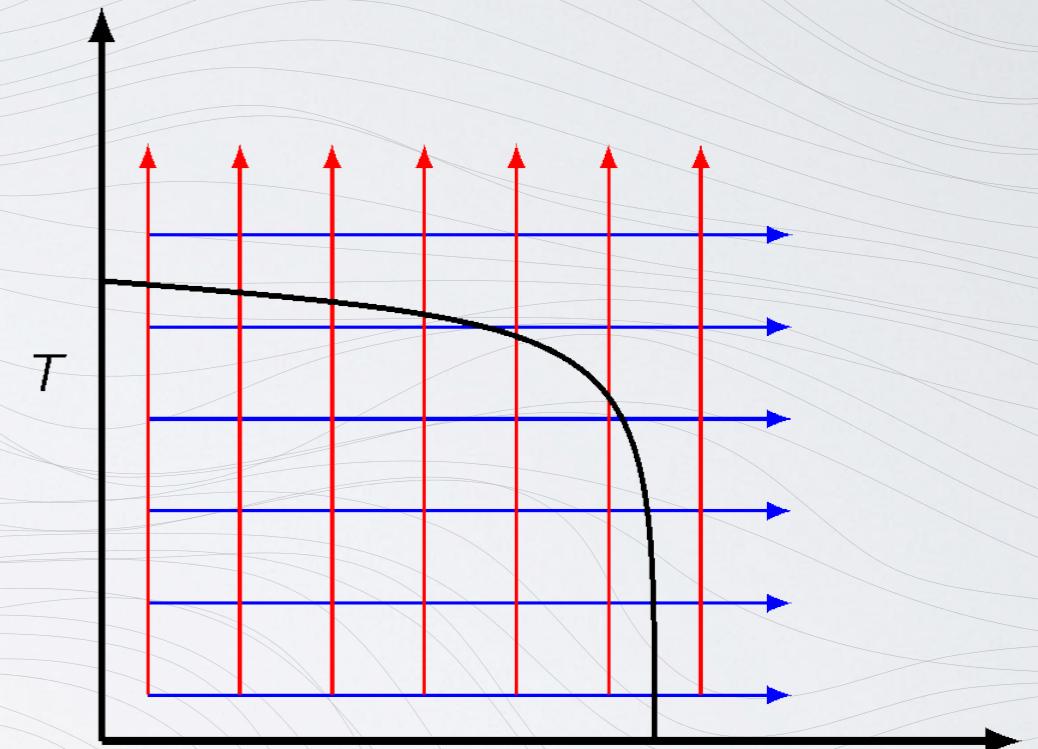


# Polyakov Loop



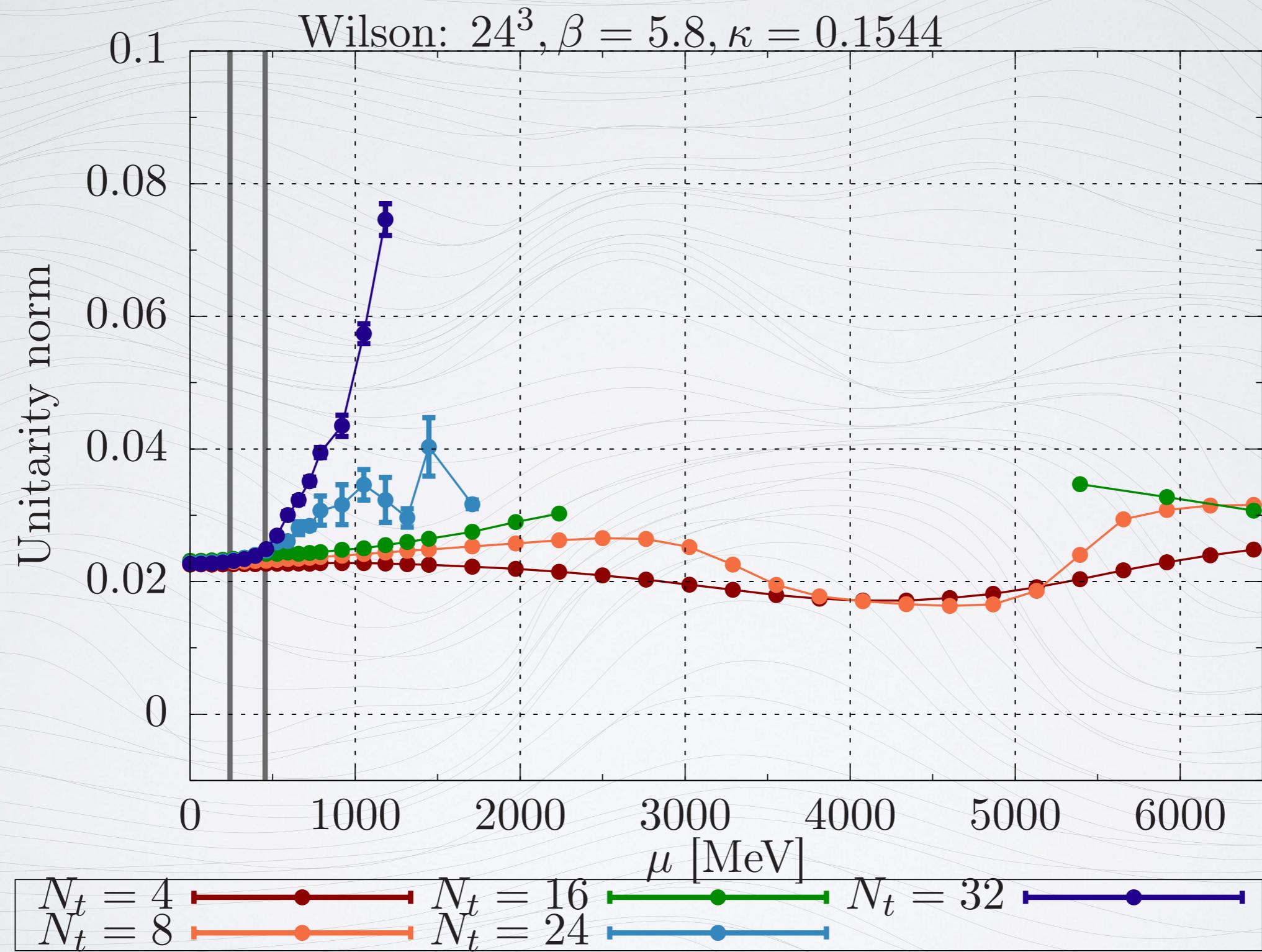
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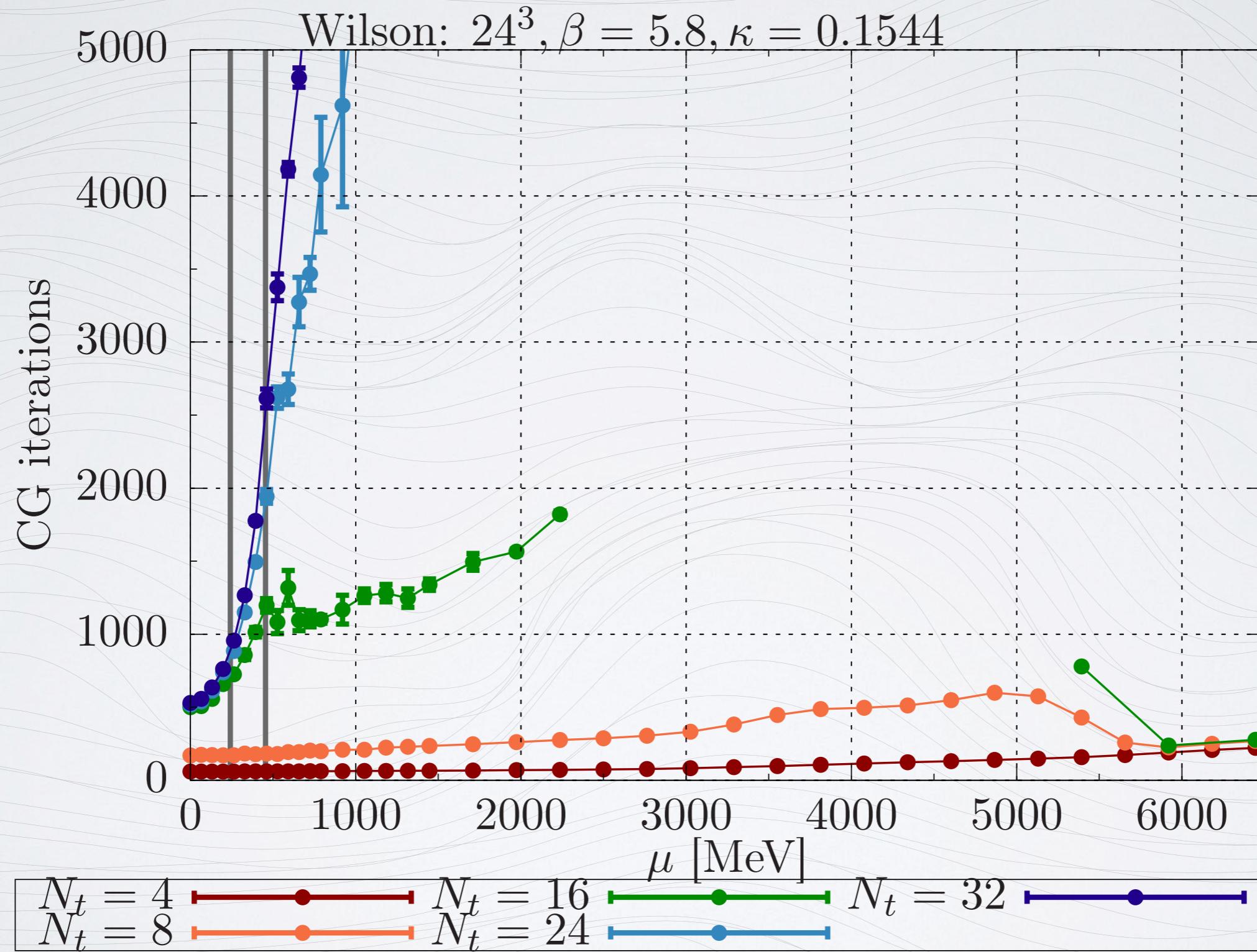


Wilson @  $m_\pi^\mu \sim 480 \text{ MeV}$

# Unitarity Norm

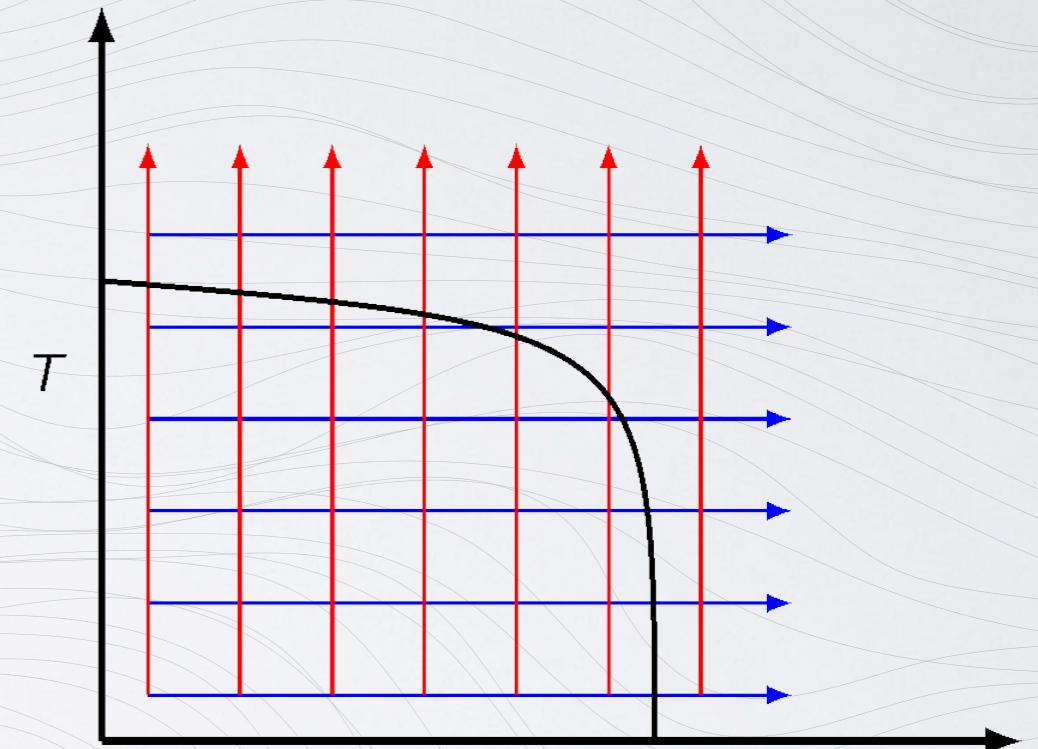


# CG Iterations



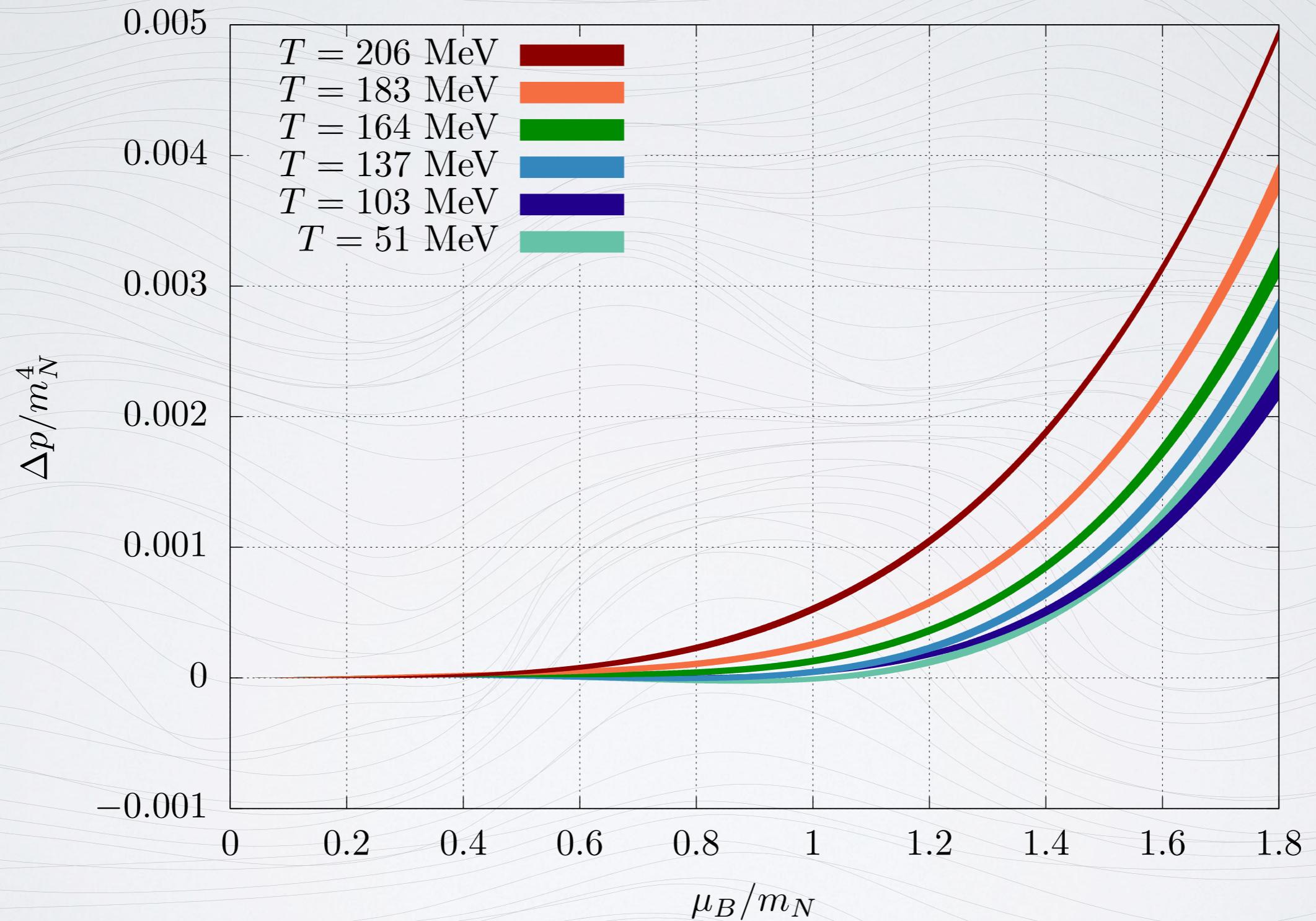
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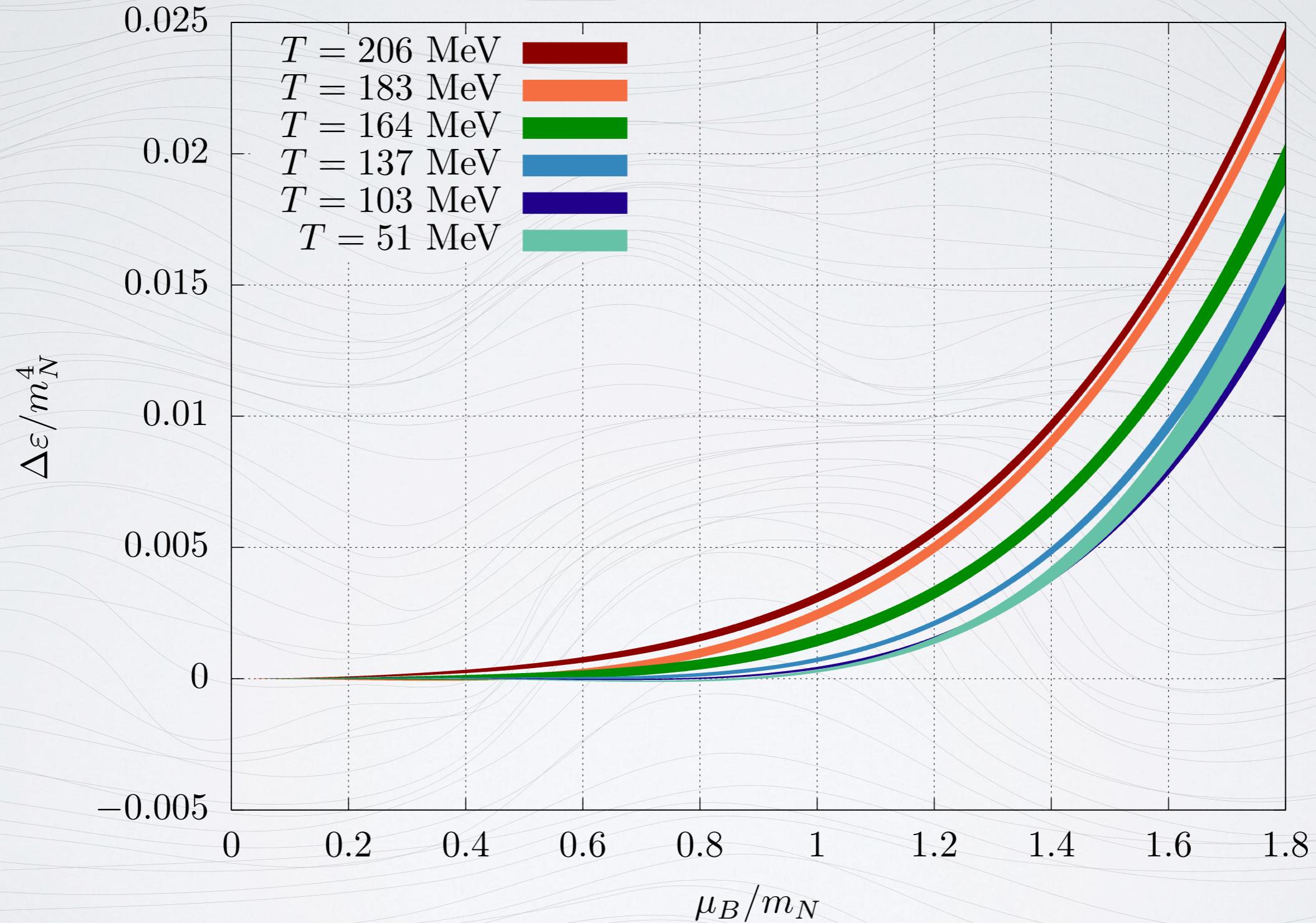


Wilson @  $m_\pi^\mu \sim 480 \text{ MeV}$

# Equation of State - Pressure

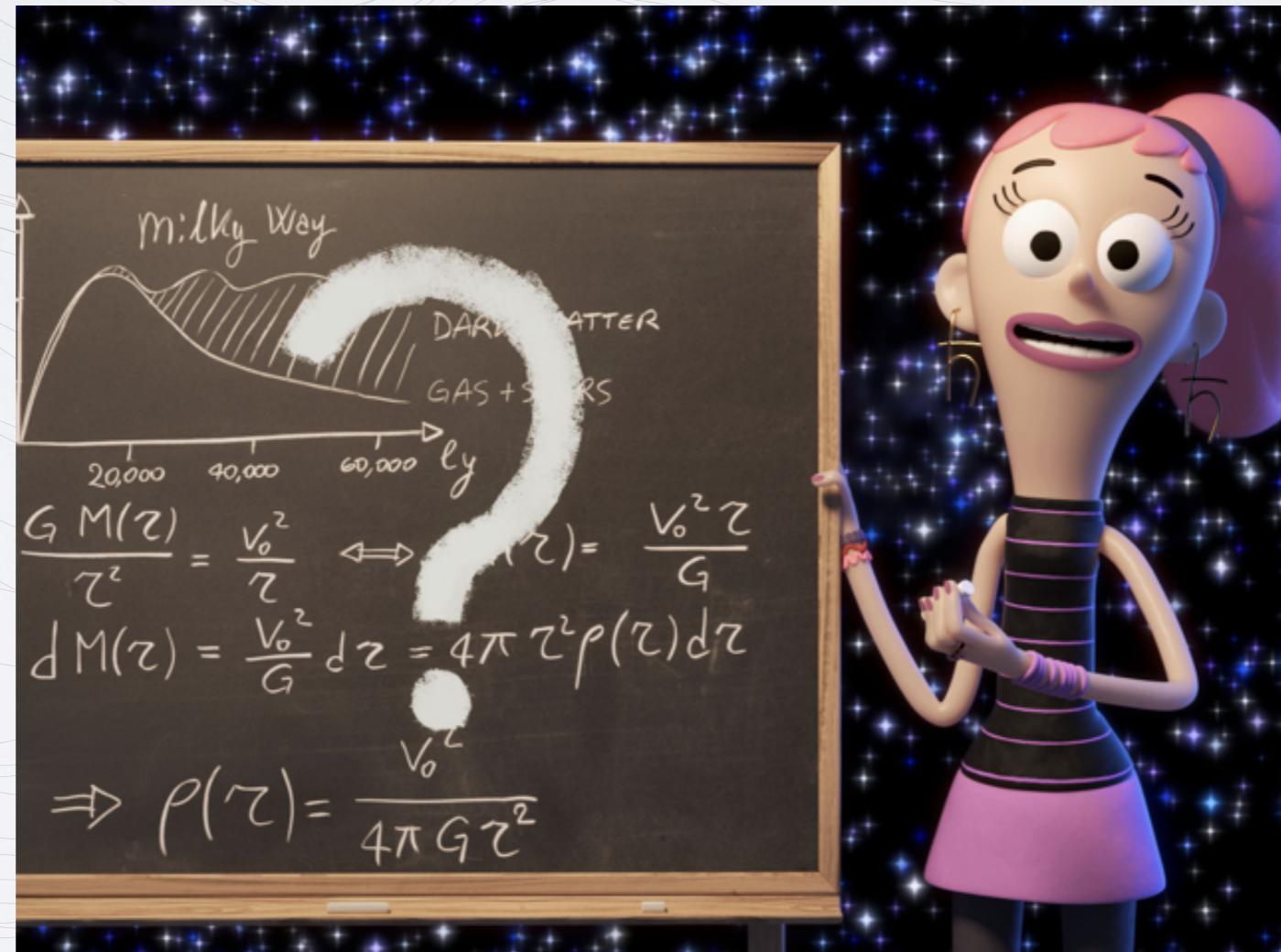


# Equation of State - Energy density



# Questions?

Thank you for your attention!



Quantum Kate (orig. Kvante Karina): CP3 Outreach <http://www.kvantebanditter.dk/en>