

Supercomputing the phase diagram of strongly interacting matter

Frithjof Karsch



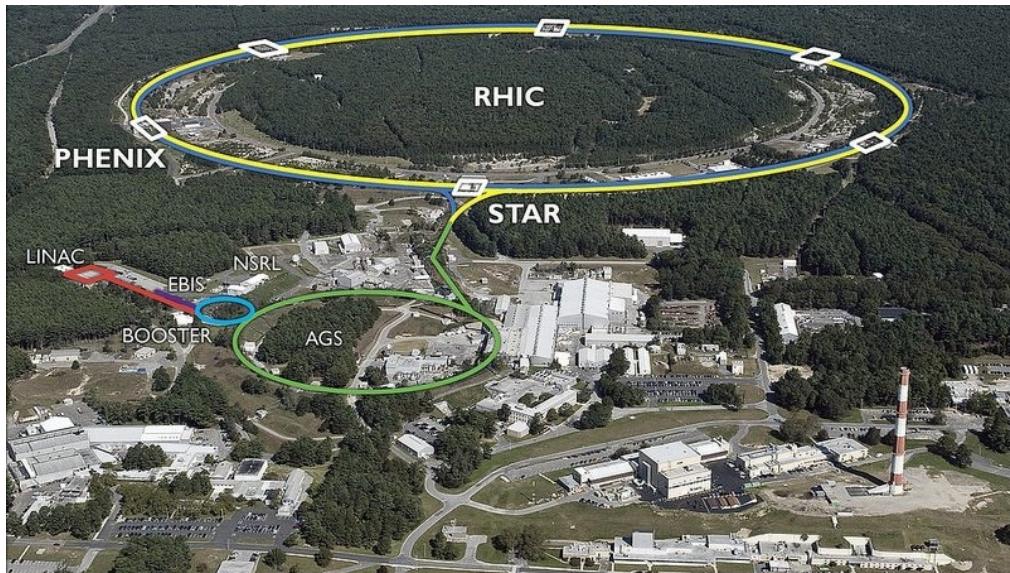
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BEST
COLLABORATION



Relativistic Heavy Ion Collider @ BNL



Summit @ ORNL
~200 PetaFlops

Supercomputing the phase diagram of strongly interacting matter

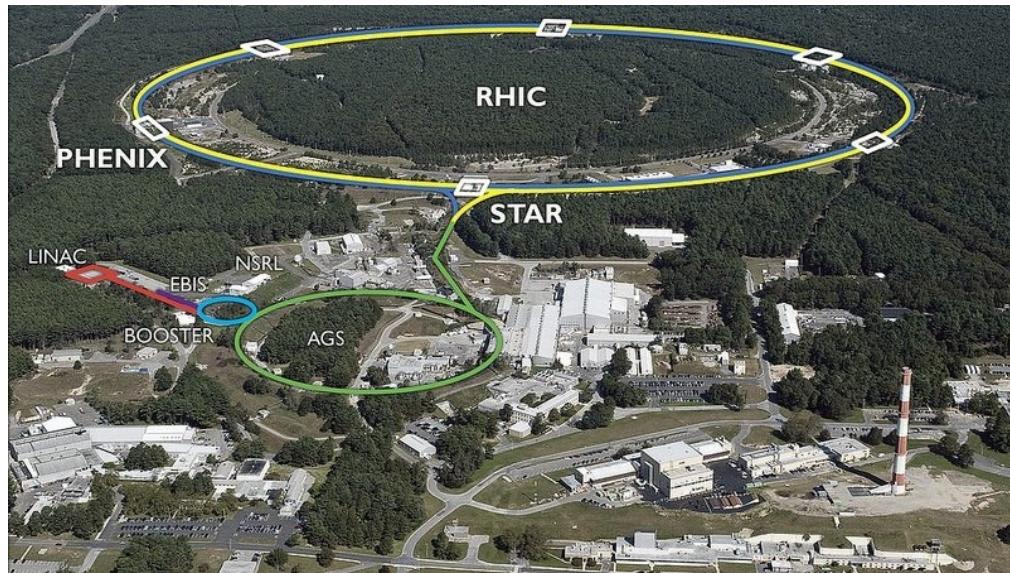
Frithjof Karsch



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Relativistic Heavy Ion Collider @ BNL

OUTLINE

- the physics case:
strongly interacting matter at high temperature and density

Supercomputing the phase diagram of strongly interacting matter

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JUWELS Booster @ FZ Jülich, Germany, 2020
~ 70 Petaflops

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- the physics case:
strongly interacting matter at high temperature and density
- the computational needs:
High Performance Computing; the need of Exascale Performance

Supercomputing the phase diagram of strongly interacting matter

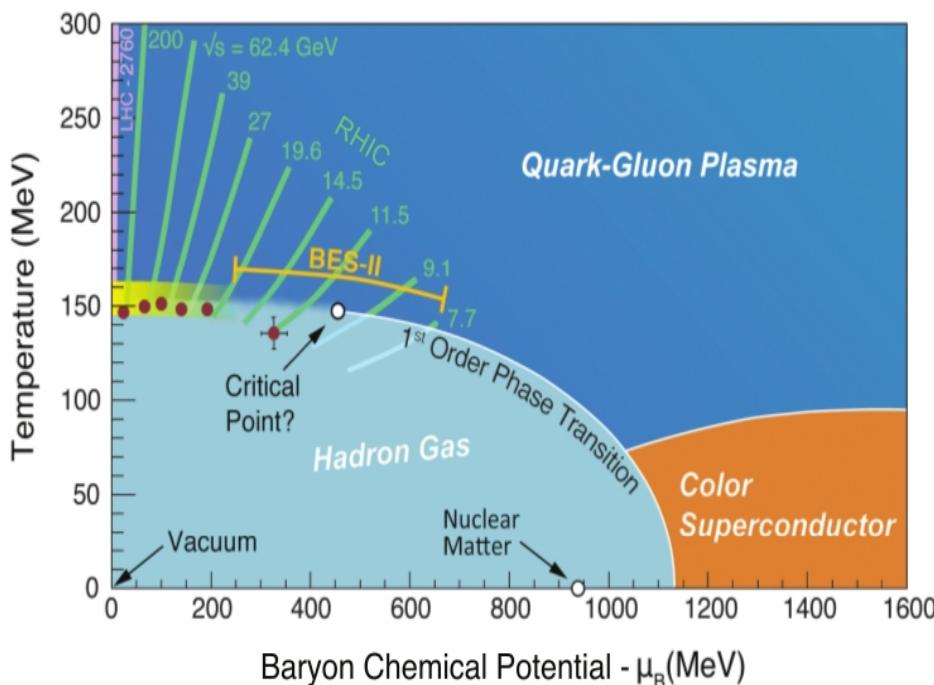
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OUTLINE

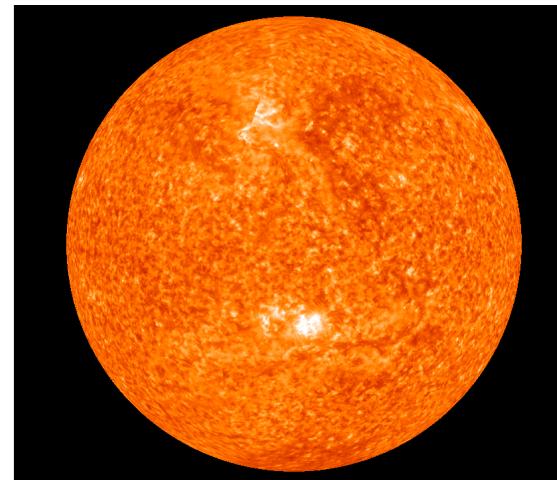
- the physics case:
strongly interacting matter at high temperature and density
- the computational needs:
High Performance Computing; the need of Exascale Performance
- some physics results:
the structure of strong interaction matter; its phase diagram & equation of state

the sun

diameter: 1 million km =

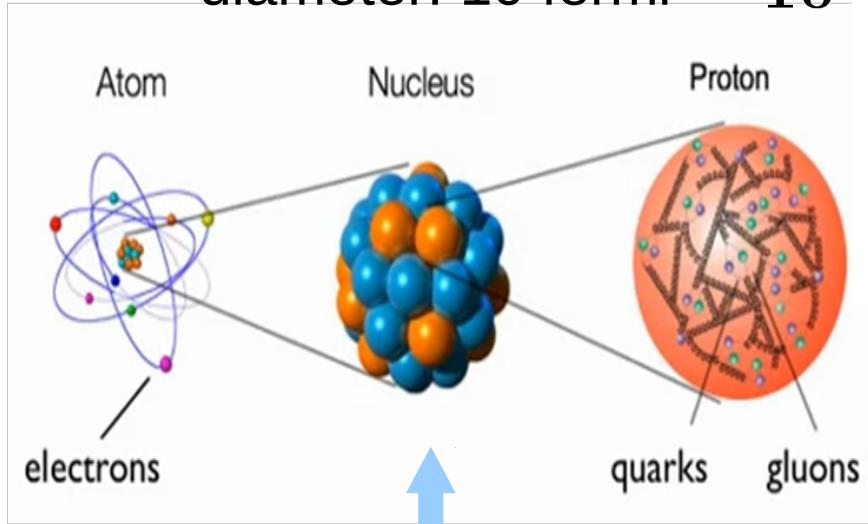
$$10^9 \text{ m}$$

temperature: 10 million degree = $10^7 \text{ }^{\circ}\text{C}$



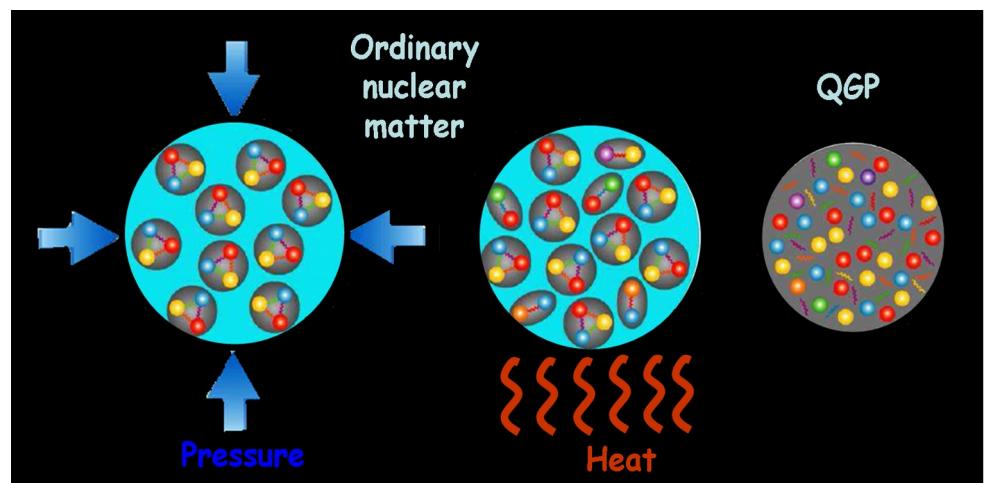
the atomic nucleus

diameter: 10 fermi = 10^{-9} m



the Quark-Gluon Plasma

temperature: $10^{12} \text{ }^{\circ}\text{C}$

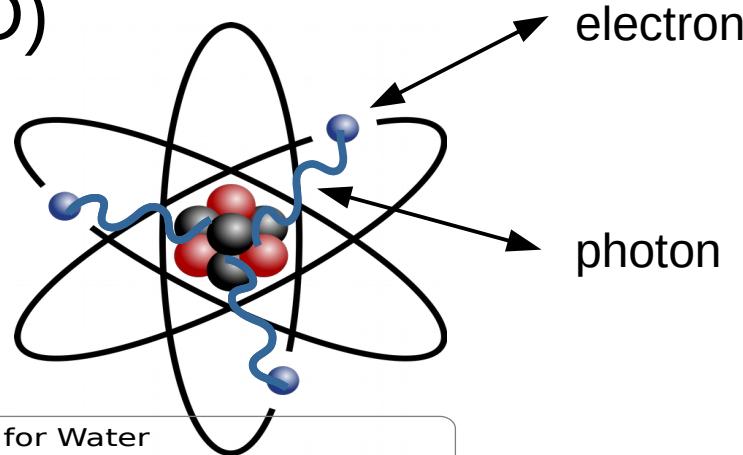


The electromagnetic force

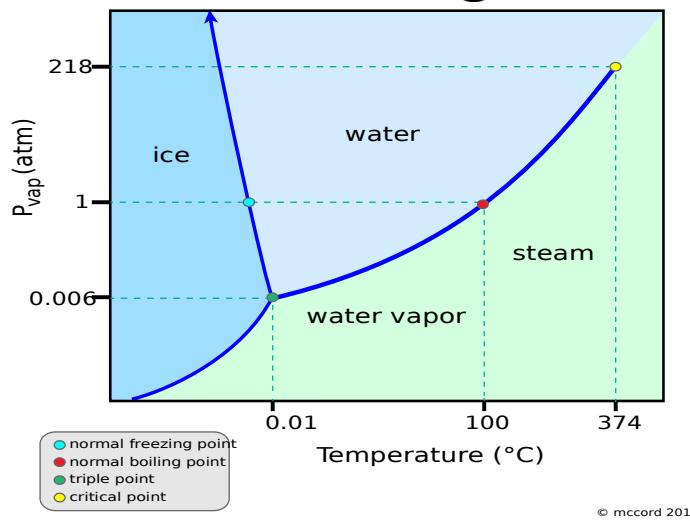
electron
photon

electric charge

Quantumelectrodynamics (QED)



Phase Diagram for Water

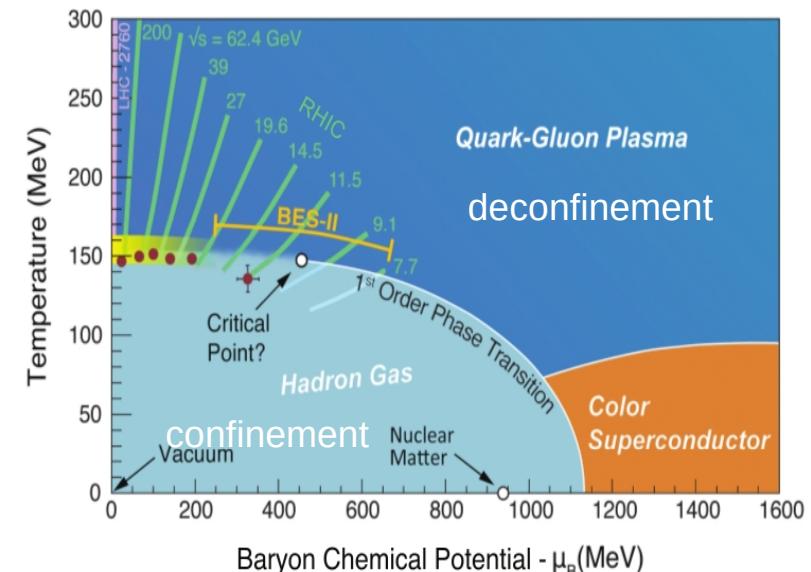
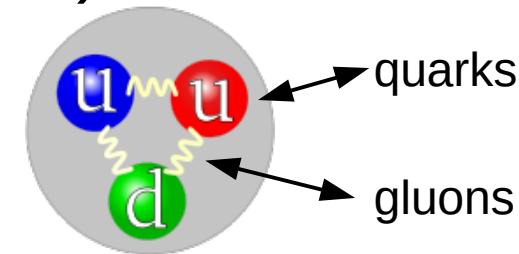


The strong force

quark
gluon

color

Quantumchromodynamics (QCD)

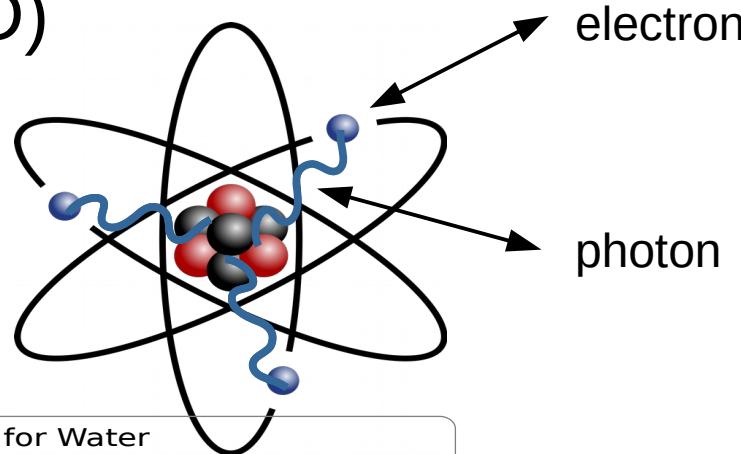


The electromagnetic force

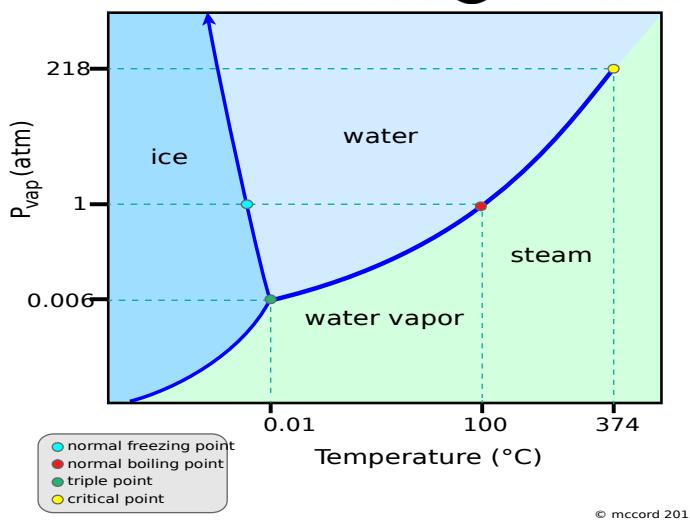
electron
photon

electric charge

Quantumelectrodynamics (QED)



Phase Diagram for Water

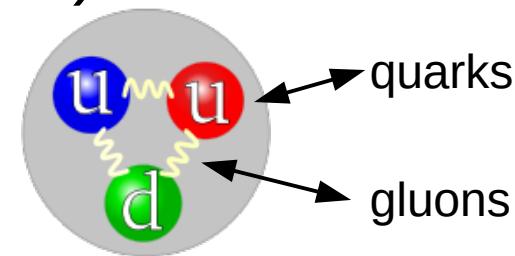


The strong force

quark
gluon

color

Quantumchromodynamics (QCD)



key properties:

chiral symmetry breaking

– light Goldstone particle → **pion**

confinement

– colorless bound states → **hadrons**

asymptotic freedom

– weakly interacting at short distances
→ **quark-gluon plasma**

The confinement – deconfinement transition



confinement \Leftrightarrow hadrons

- stick together, find a comfortable distance
- controlled by the "confinement potential"

$$V_{\bar{q}q}(r) = -\frac{4}{3} \frac{\alpha(r)}{r} + \sigma r$$

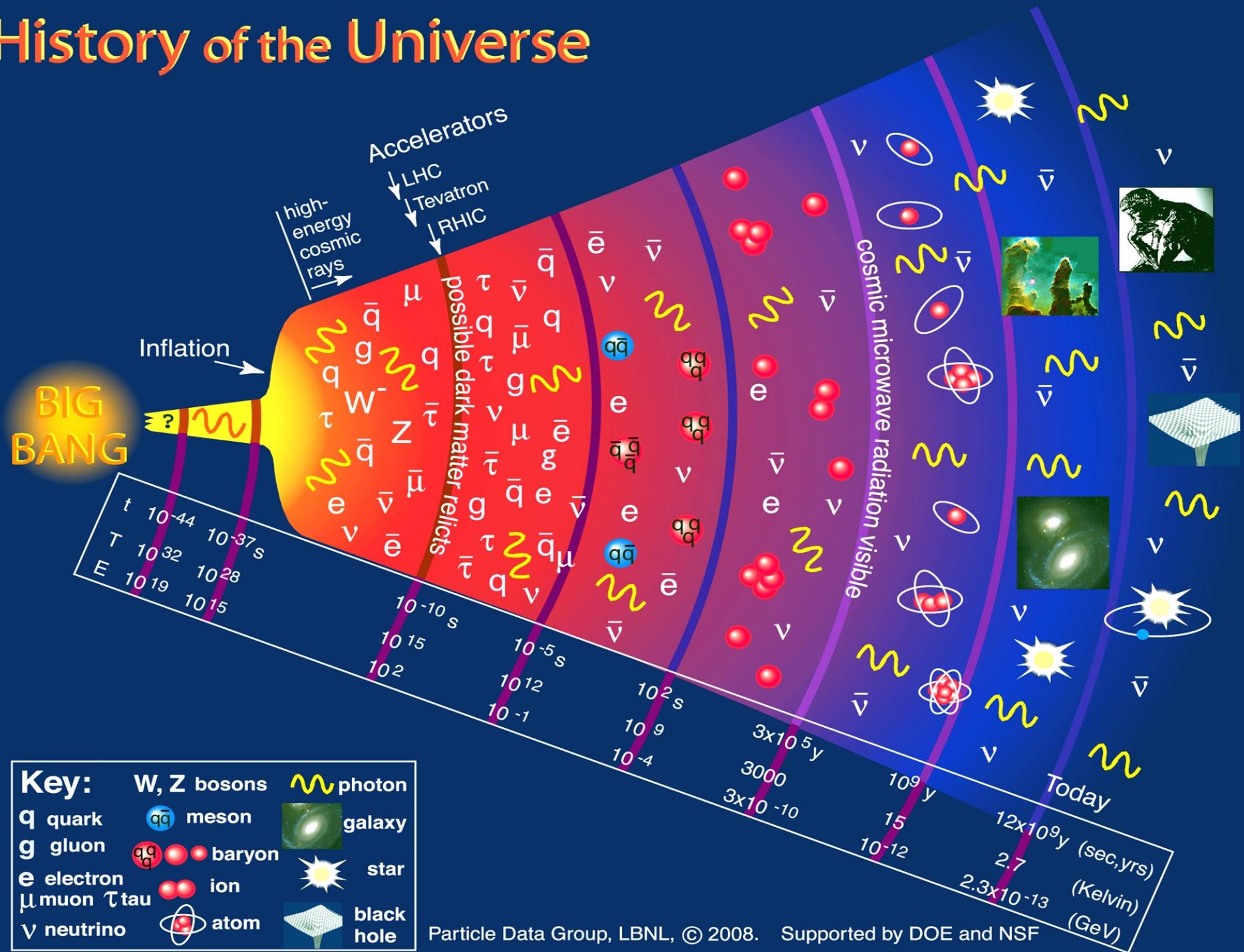
deconfinement \Leftrightarrow quarks&gluons

- freely floating in the crowd
- do not care what color your neighbor has

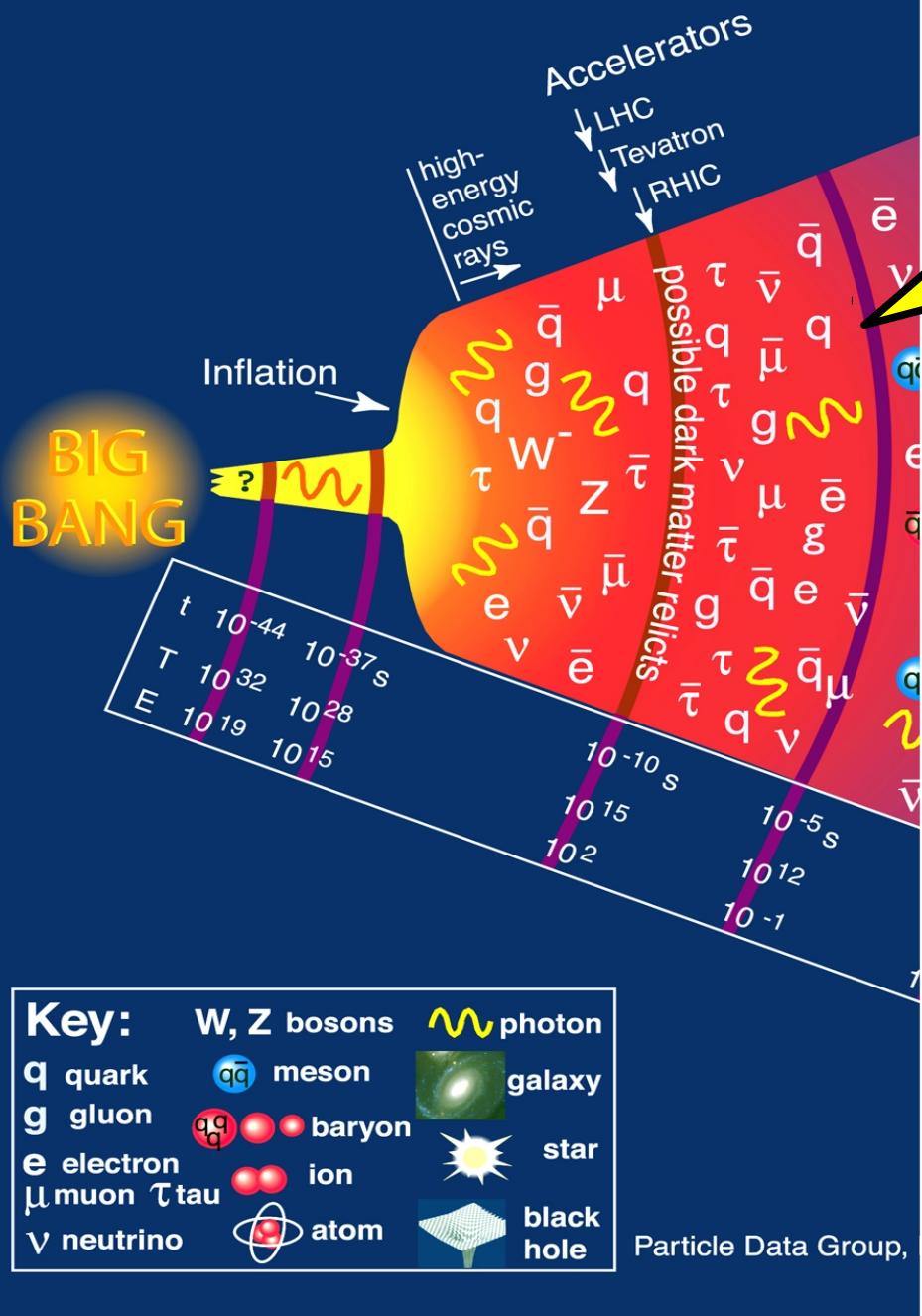
screening, color is neutralized on the average over a (short) distance

This transition happens abruptly: (almost a) PHASE TRANSITION

History of the Universe



History of the Universe

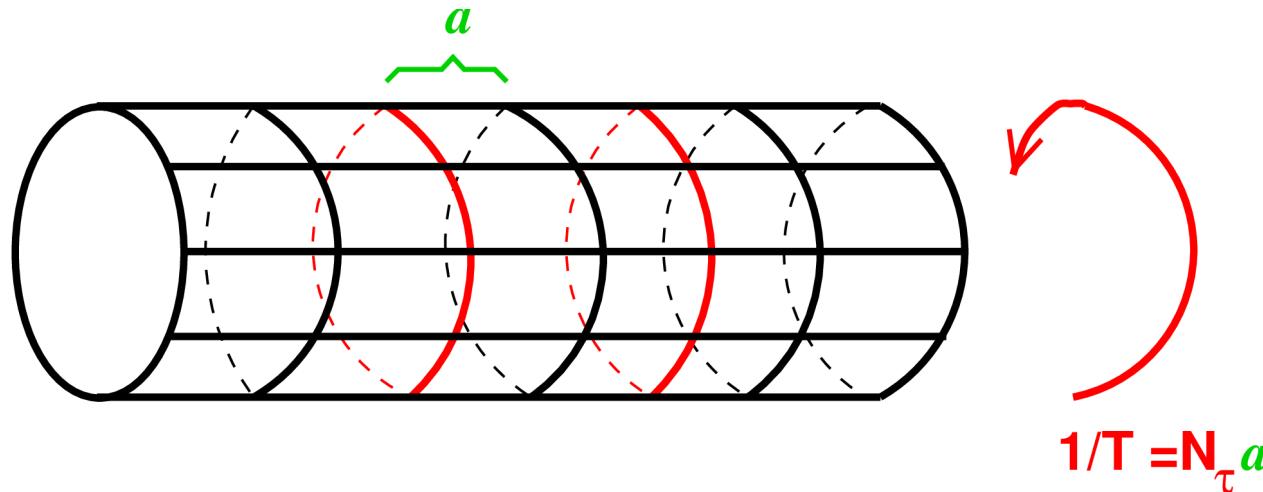


The “phase” transition from the quark - gluon plasma to ordinary (hadronic) matter

Simulating strongly interacting matter on a discrete space-time grid (lattice QCD)



Kenneth G. Wilson
1974



Monte Carlo simulation
1979

$$\longleftrightarrow V^{1/3} = N_\sigma a \longrightarrow$$

partition function:

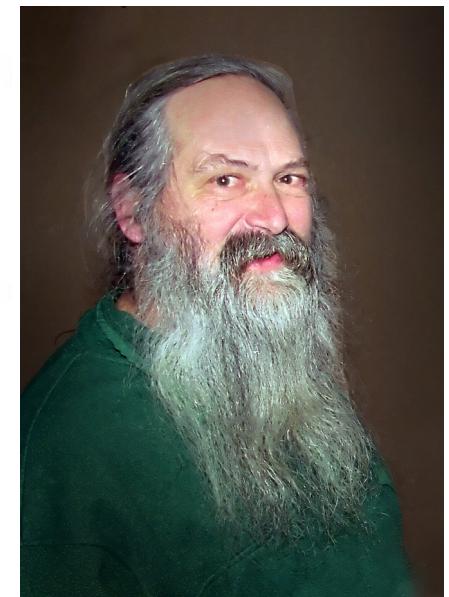
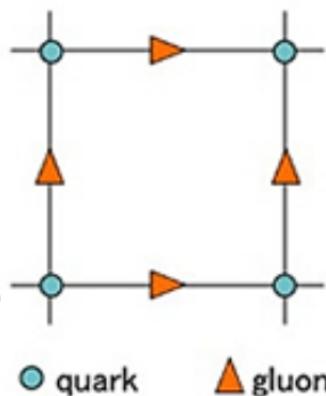
$$Z(V, T, \mu) = \int \mathcal{D}\mathcal{A} \mathcal{D}\psi \mathcal{D}\bar{\psi} e^{-S_E} \quad \text{with}$$

$$S_E = \int_0^{1/T} dx_0 \int_V d^3x \mathcal{L}_E(\mathcal{A}, \psi, \bar{\psi}, \mu)$$

T: temperature

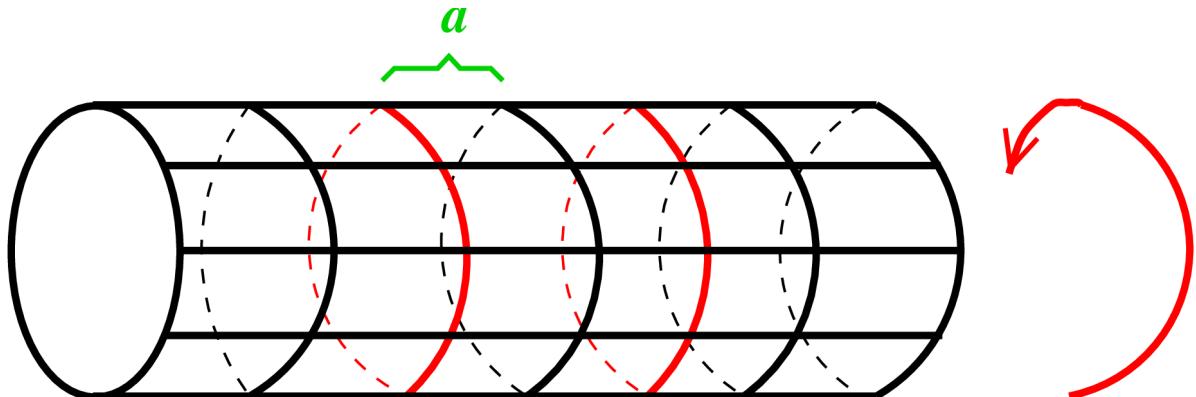
V: volume

μ : chemical potential



Mike Creutz, 1979

Simulating strongly interacting matter on a discrete space-time grid (lattice QCD)



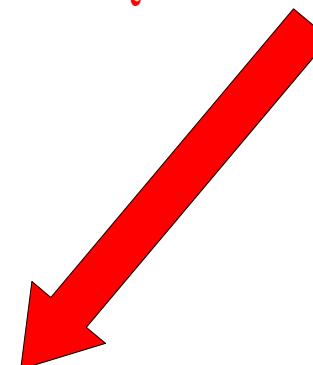
the lattice: $N_\sigma^3 \times N_\tau$
lattice spacing: a

$$\longleftrightarrow v^{1/3} = N_\sigma a \longrightarrow$$

$$1/T = N_\tau a$$

partition function:

$$Z(V, T, \mu) = \int \mathcal{D}\mathcal{A} \text{Det}M(\mathcal{A}, \mu) e^{-S_G}$$



THE fermion determinant:
source of all problems

$\mathcal{O}(10^6)$ grid points
 $\mathcal{O}(10^8)$ d.o.f.

Dealing with the fermion determinant

partition function again:

$$\begin{aligned}
 Z(V, T) &= \int \mathcal{D}\mathcal{A} \int \prod_n d\psi_n d\bar{\psi}_n e^{\bar{\psi}_n M(\mathcal{A}, m_q)_{nm} \psi_m} e^{-S_G} \\
 &= \int \mathcal{D}\mathcal{A} \text{Det}M(\mathcal{A}, m_q) e^{-S_G} \\
 \text{Det}M(\mathcal{A}, m_q) &= \int \prod_n d\phi_n e^{-\sum_{nm} \phi_n^* M_{nm}^{-1}(\mathcal{A}, m_q) \phi_m}
 \end{aligned}$$

fermions
 (anti-commuting)

 "importance sampling"

"fermion matrix"

– need $x_n = M_{nm}^{-1} \phi_m$
 – solve $M_{nm} x_m = \phi_n$

Exploring the phase diagram

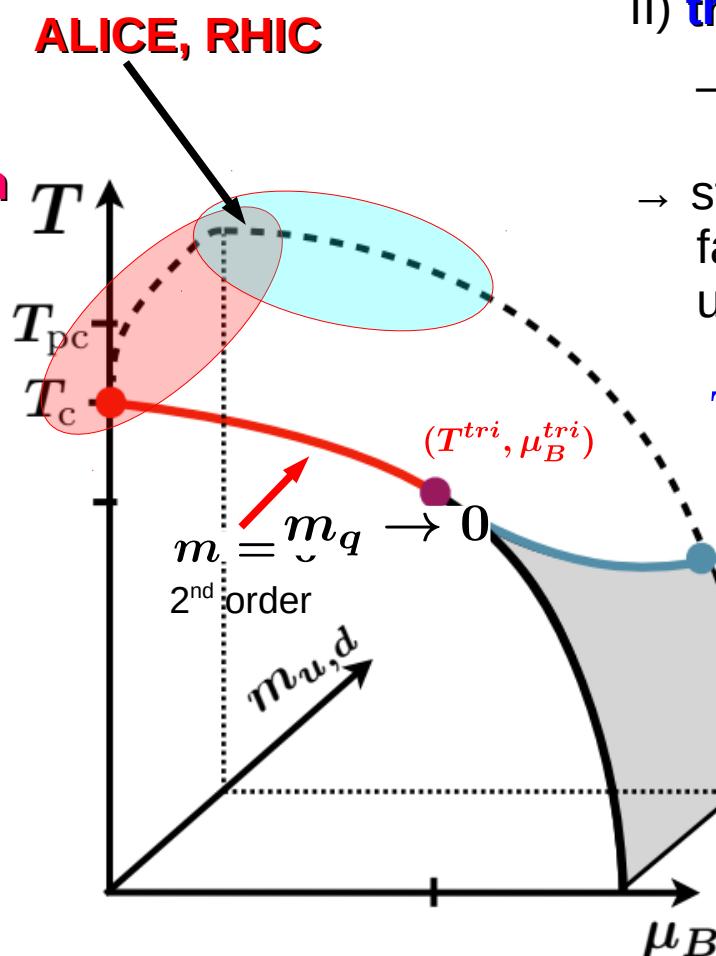
--- two major challenges--

I) the chiral phase transition

- need to approach vanishing quark masses

$$\text{Tr}M^{-1}$$

- computational cost for matrix inversion diverges for $m_q \rightarrow 0$



Random Matrix Model

A. Halasz, A.D. Jackson, R.E. Shrock, M.A. Stephanov, J.J.,M. Verbaarschot, Phys. Rev. D58 (1998) 096007

QCD

M. Stephanov, Phys. Rev. D73 (2006) 094508

NJL

M. Buballa, S. Carignano, Phys. Lett. B791 (2019) 361

II) the critical point at high density

- numerical calculations at non-zero baryon density
- standard numerical algorithms fail (sign-problem); use Taylor expansion techniques

$$\text{Tr}M^{-1} \frac{\partial M}{\partial \mu_B} M^{-1} \frac{\partial M}{\partial \mu_B} \dots M^{-1} \frac{\partial M}{\partial \mu_B}$$

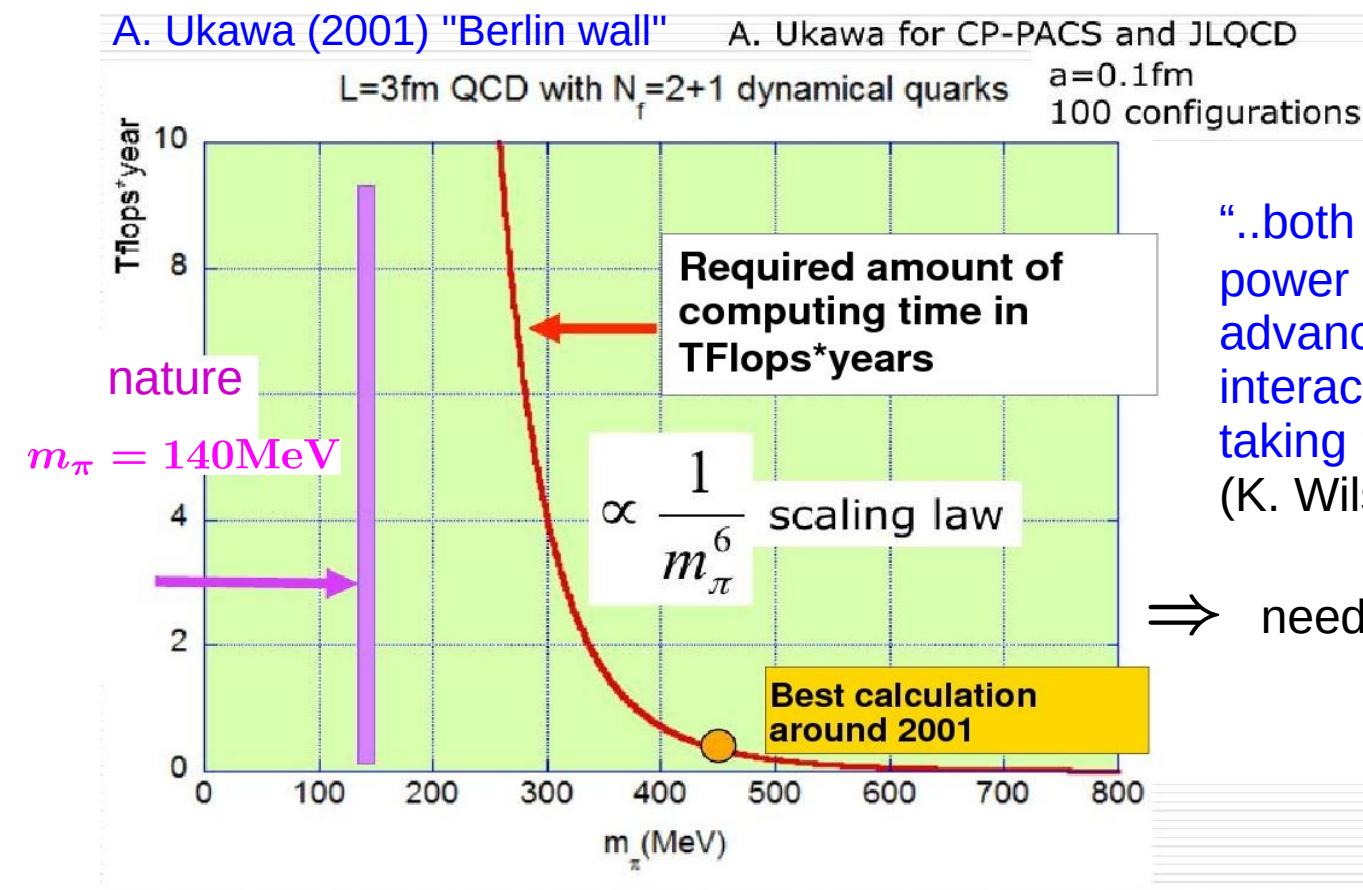
$$(T^E, \mu_B^E)$$

Computational cost of a QCD calculation is dominated by the cost to invert the fermion matrix M , using e.g. the CG-algorithm

$$\text{cost} \sim m_\pi^{-z_\pi} V^{5/4} a^{-7}$$

$$m_\pi \sim m_q^{1/2} \text{ pion}$$

~ 2000 : $z_\pi \simeq 6$



“..both a 10^8 increase in computing power and spectacular algorithmic advances are needed before a useful interaction with experiments starts taking place..”

(K. Wilson, 1989)

⇒ need Exaflop computers

Computational cost of a QCD calculation is dominated by the cost to invert the fermion matrix, using e.g. the CG-algorithm

$$\text{cost} \sim m_\pi^{-z_\pi} V^{5/4} a^{-7}$$

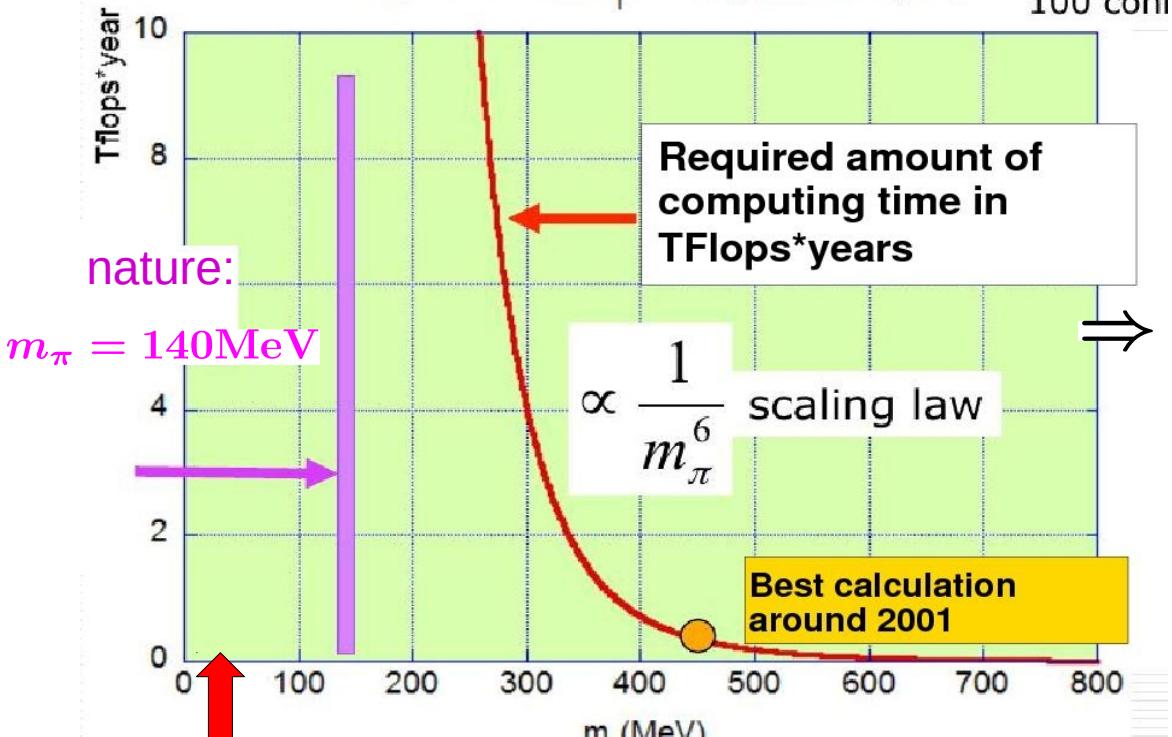
$$\sim 2000 : z_\pi \simeq 6$$

$$m_\pi \sim m_q^{1/2} \quad \text{pion}$$

m_q : quark mass

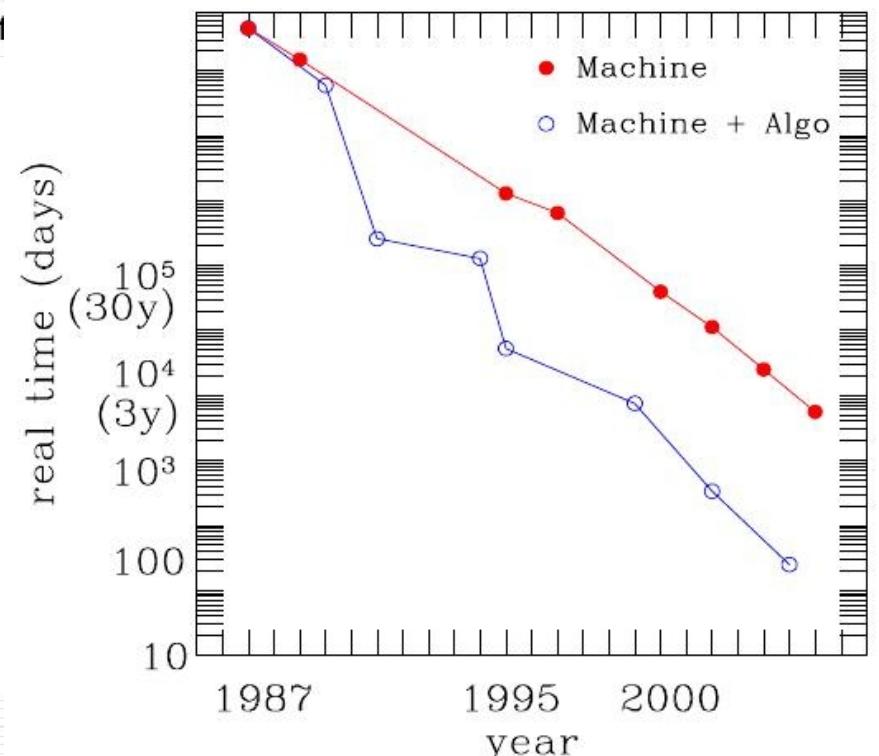
A. Ukawa (2001) "Berlin wall" A. Ukawa for CP-PACS and JLQCD

L=3fm QCD with $N_f = 2+1$ dynamical quarks $a = 0.1\text{ fm}$
100 conf



today we passed the wall: calculations can be done at m_π

improvement with time



K. Jansen

need to solve: $M \cdot \vec{x} = \vec{b}$

use, e.g. the Conjugate Gradient algorithm

preconditioned CG

```
r0      = b - Mx0
z0      = P-1r0
p0      = z0
k        = 0
repeat
    αk     = rkTzk / pkTMpk
    xk+1   = xk + αkpk
    rk+1   = rk - αkMpk
    if(rk+1 < rtoll) exit
    zk+1   = P-1rk+1
    βk     = zk+1Tr + k + 1 / zkTrk
    pk+1   = zk+1 + βkpk
    k        = k + 1
end repeat
```

condition number κ controls #iterations needed for CG to converge:

$$\kappa = (\text{max. eigenvalue}) / (\text{min. eigenvalue})$$

$$\kappa = \frac{\lambda_{\max}}{\lambda_{\min}}$$

improvement of the CG solver

↔ try to reduce condition number

- preconditioning, solve $P^{-1}(b - Mx) = 0$
- multigrid
- multi-boson algorithms
- deflation
-

need to solve: $M \cdot \vec{x} = \vec{b}$

use, e.g. the Conjugate Gradient algorithm

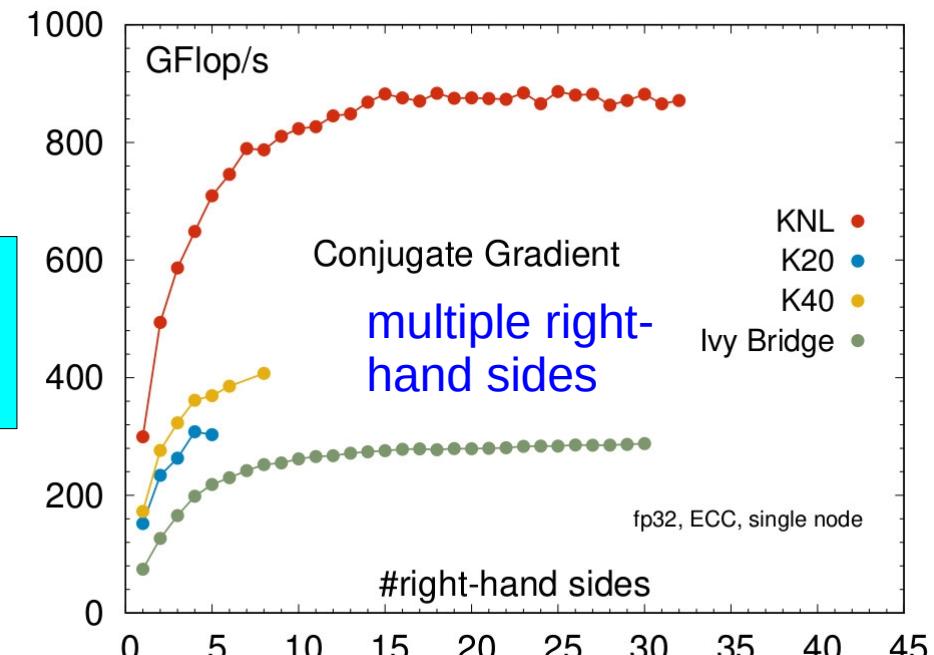
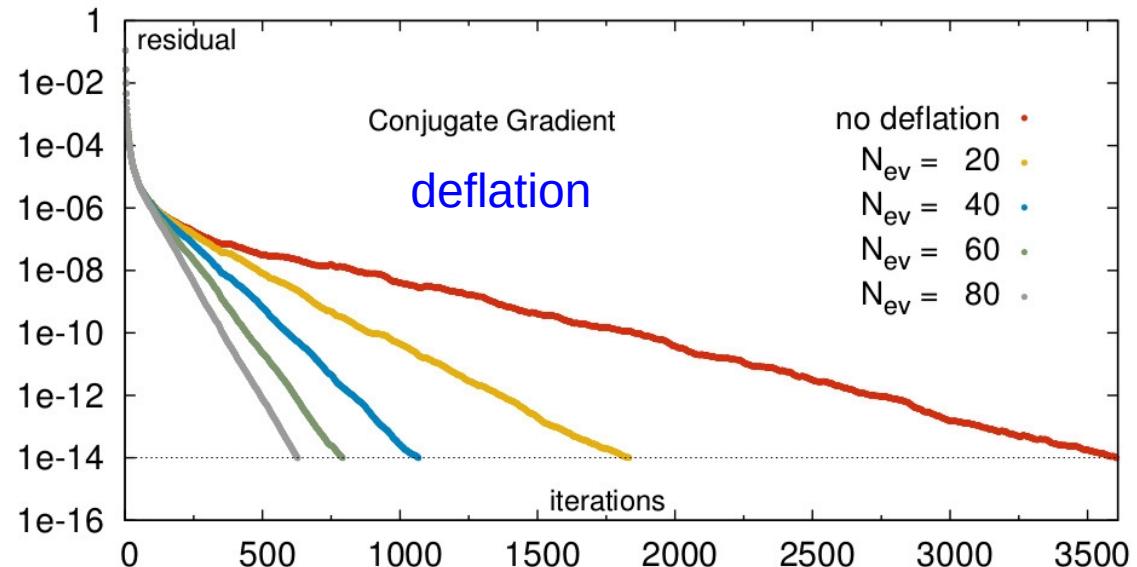
preconditioned CG

```

 $r_0 = b - Mx_0$ 
 $z_0 = P^{-1}r_0$ 
 $p_0 = z_0$ 
 $k = 0$ 
repeat
 $\alpha_k = \frac{r_k^T z_k}{p_k^T M p_k}$ 
 $x_{k+1} = x_k + \alpha_k p_k$ 
 $r_{k+1} = r_k - \alpha_k M p_k$ 
if ( $r_{k+1} < rtoll$ ) exit
 $z_{k+1} = P^{-1}r_{k+1}$ 
 $\beta_k = \frac{z_{k+1}^T r + k + 1}{z_k^T r_k}$ 
 $p_{k+1} = z_{k+1} + \beta_k p_k$ 
 $k = k + 1$ 
end repeat

```

**O(100)
speed-up**



https://en.wikipedia.org/wiki/Conjugate_gradient_method

Critical behavior and higher order cumulants

– Taylor expansion –

Taylor expansion of the **QCD** pressure: $\frac{P}{T^4} = \frac{1}{VT^3} \ln Z(T, V, \mu_B, \mu_Q, \mu_S)$

$$\frac{P}{T^4} = \sum_{i,j,k=0}^{\infty} \frac{1}{i!j!k!} \chi_{ijk}^{BQS}(T) \left(\frac{\mu_B}{T}\right)^i \left(\frac{\mu_Q}{T}\right)^j \left(\frac{\mu_S}{T}\right)^k$$

cumulants of net-charge fluctuations and correlations:

$$\chi_{ijk}^{BQS} = \left. \frac{\partial^{i+j+k} P/T^4}{\partial \hat{\mu}_B^i \partial \hat{\mu}_Q^j \partial \hat{\mu}_S^k} \right|_{\mu_B, Q, S=0} , \quad \hat{\mu}_X \equiv \frac{\mu_X}{T}$$

**cumulants at vanishing
chemical potential
provide information on
the equation of state
at small non-zero
chemical potential**

chiral order parameter and its susceptibility:

$$\langle \bar{\psi} \psi \rangle = \langle \text{Tr} M^{-1} \rangle , \quad \chi_{dis} = \langle (\text{Tr} M^{-1})^2 \rangle - \langle \text{Tr} M^{-1} \rangle^2$$

$$\sim m_l^{-(1-1/\delta)}$$

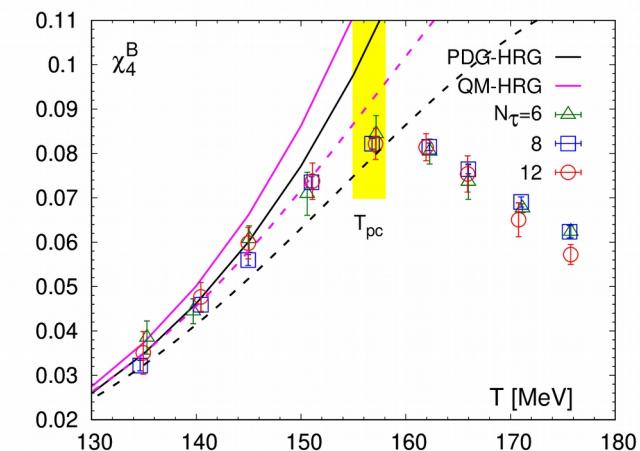
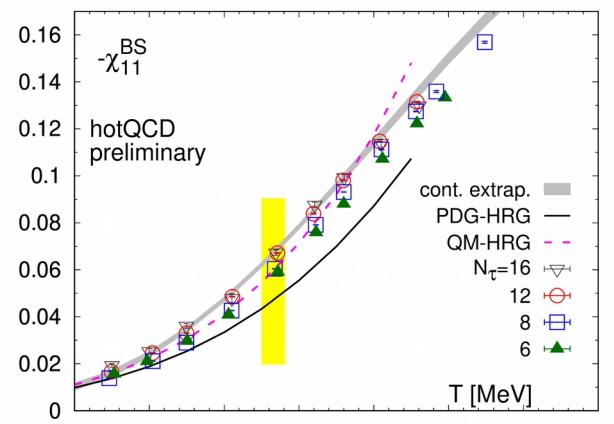
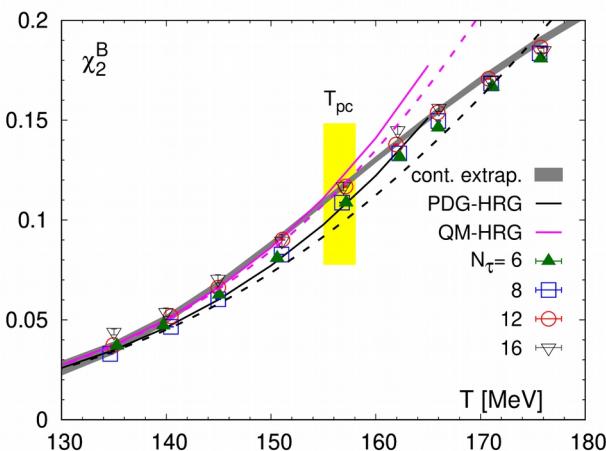
divergence signals phase transition

Critical behavior and higher order cumulants

– Taylor expansion and universality –

Taylor expansion of the **QCD** pressure: $\frac{P}{T^4} = \frac{1}{VT^3} \ln Z(T, V, \mu_B, \mu_Q, \mu_S)$

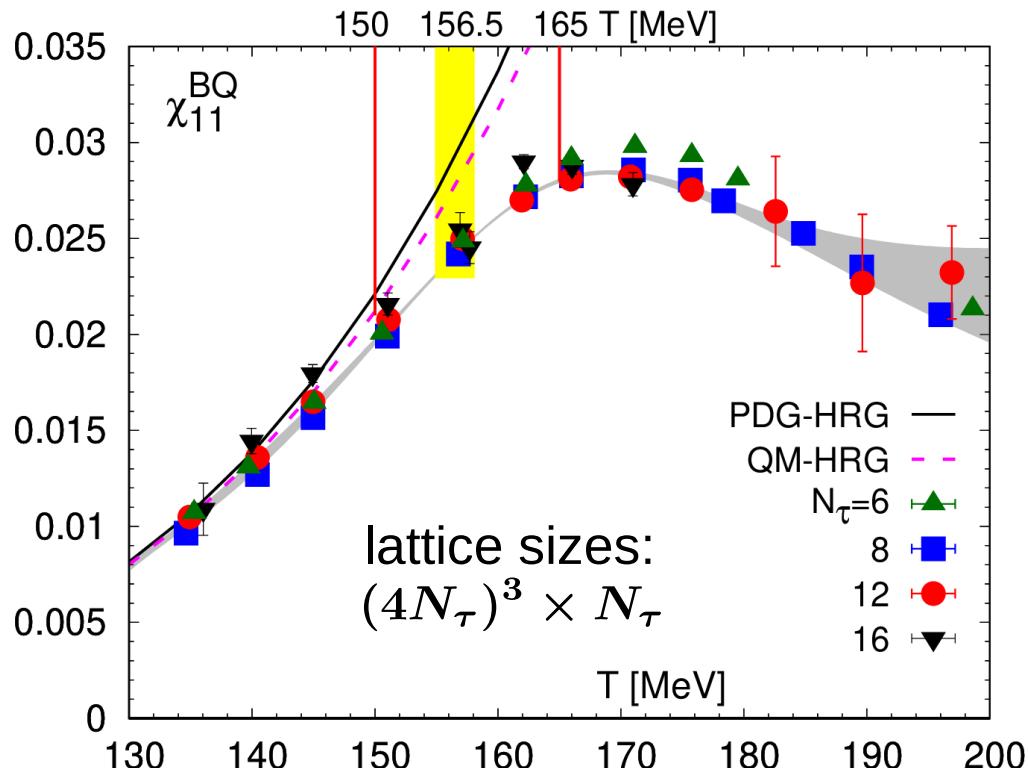
$$\frac{P}{T^4} = \sum_{i,j,k=0}^{\infty} \frac{1}{i!j!k!} \chi_{ijk}^{BQS}(T) \left(\frac{\mu_B}{T}\right)^i \left(\frac{\mu_Q}{T}\right)^j \left(\frac{\mu_S}{T}\right)^k$$



– some 2nd and 4th order cumulants in (2+1)-flavor QCD

Calculation of cumulants of conserved charge fluctuations

state-of-the-art calculations on GPUs



~ 2 million GPU-hours = 230 GPU-years
= **6 days on Titan**

each data point requires
 $\mathcal{O}(10 \text{ Million})$
matrix inversions

matrix size: $\sim 10^6 \times 10^6$

~ 100 non-zero entries per column

20 PFlops=20x 10^{15} Flops
18688 GPUs



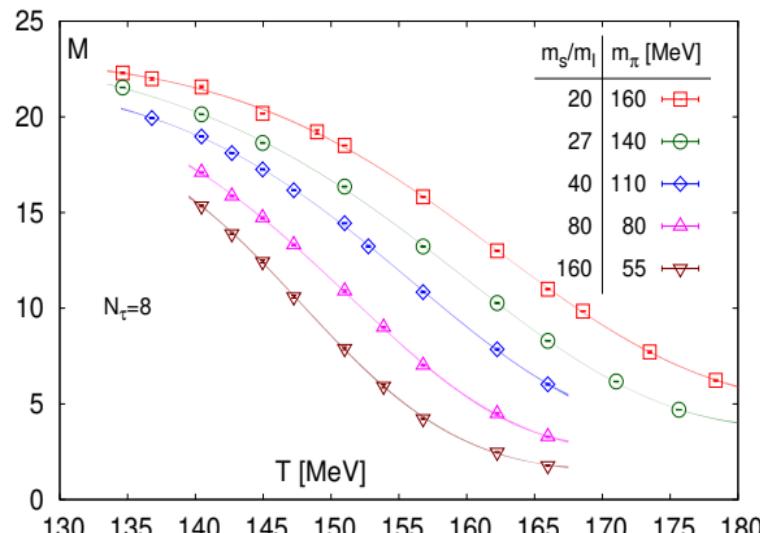
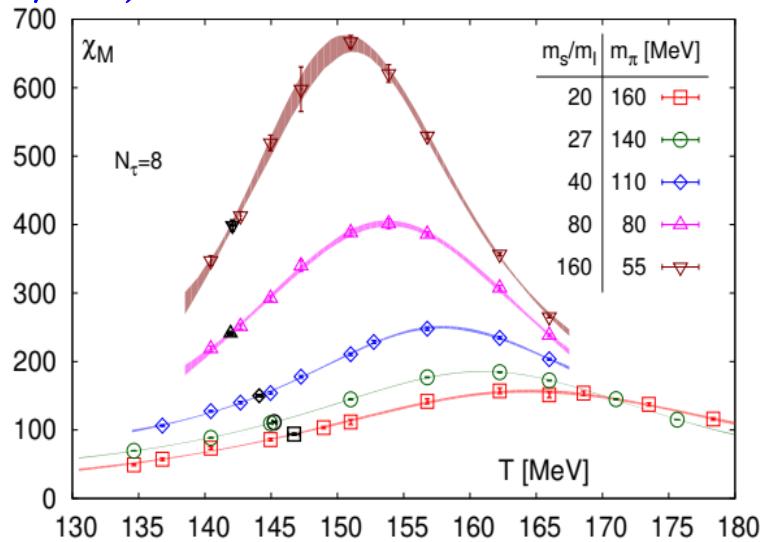
The Chiral **PHASE TRANSITION** in (2+1)-flavor QCD

$$\langle \bar{\psi}\psi \rangle \sim m_s \frac{\partial \ln Z}{\partial m_l}$$

$m_s \partial \langle \bar{\psi}\psi \rangle / \partial m_l$
“magnetic”
susceptibility

$$\sim (m_s/m_l)^{0.79}$$

$$(160/27)^{0.79} \sim 4$$



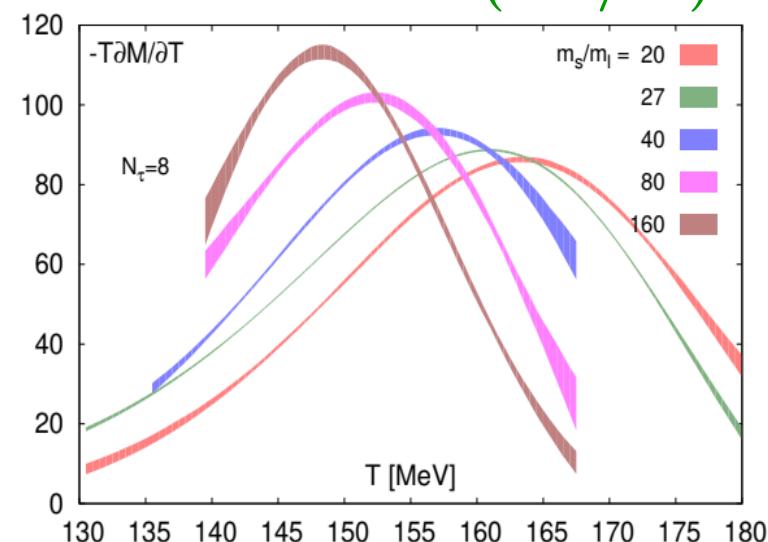
$$m_l = (m_u + m_d)/2 \Rightarrow 0$$

m_s fixed, physical

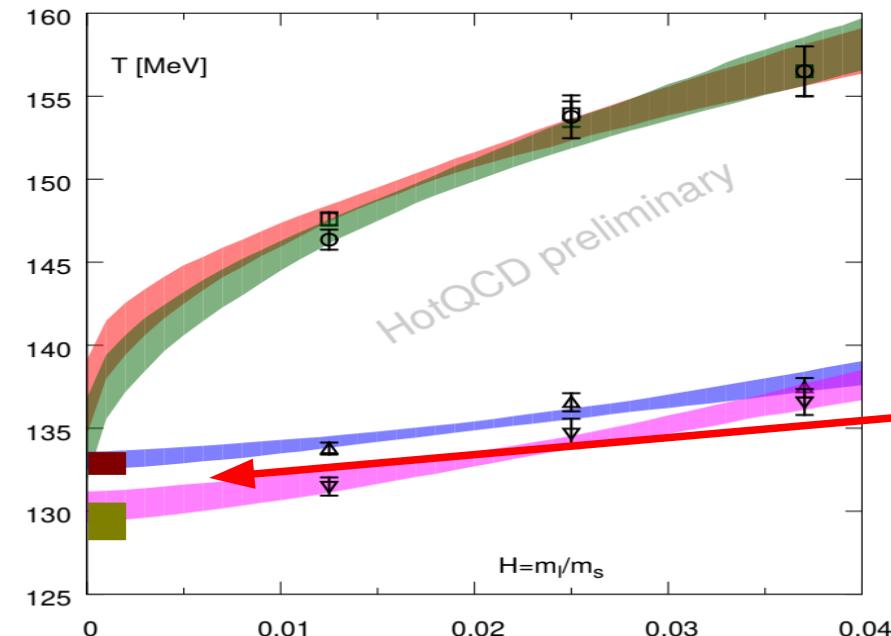
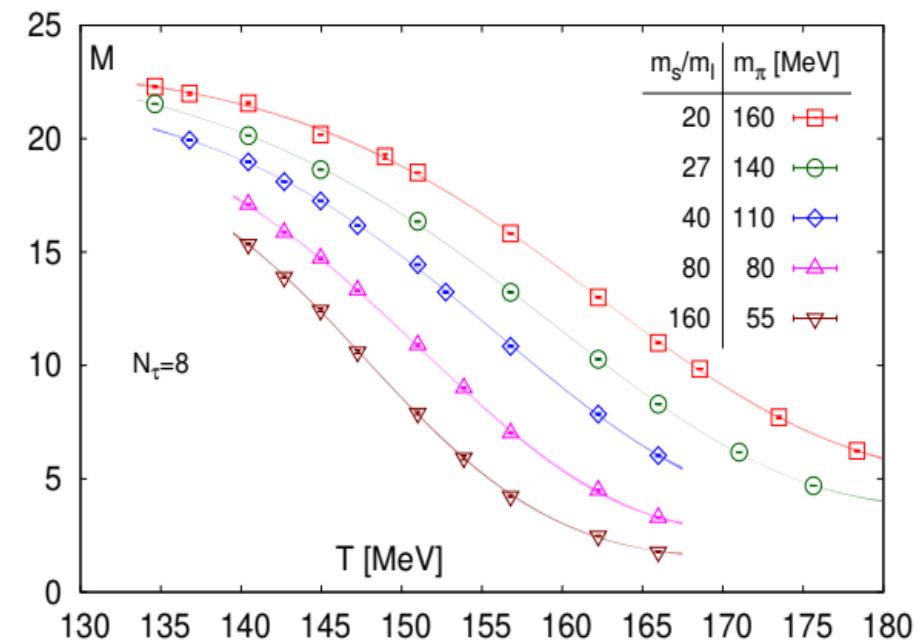
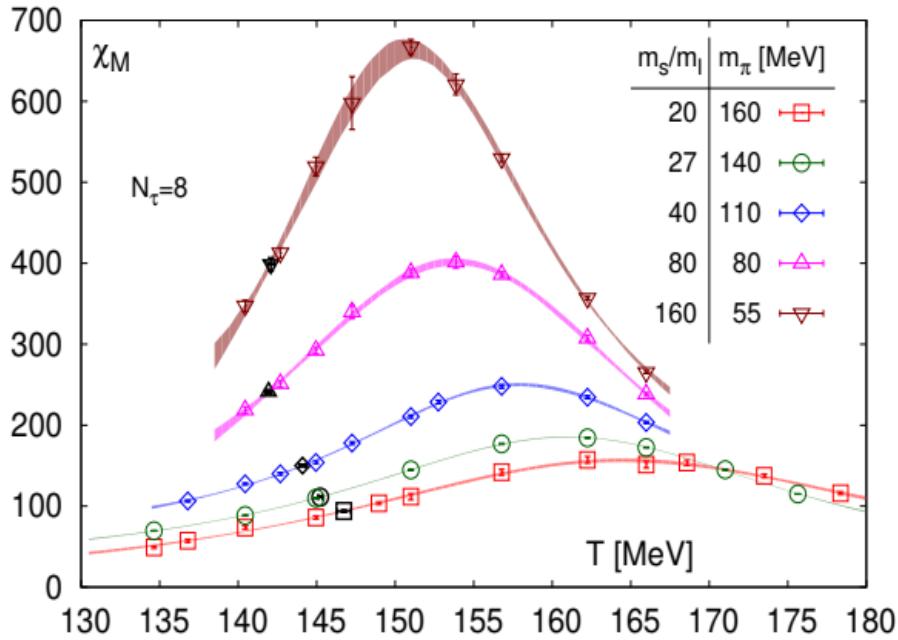
$T \partial \langle \bar{\psi}\psi \rangle / \partial T$
“mixed”
susceptibility

$$\sim (m_s/m_l)^{0.34}$$

$$(160/27)^{0.34} \sim 1.8$$



Chiral PHASE TRANSITION temperature



← $T_{pc}^{phys} = (156.5 \pm 1.5) \text{ MeV}$

A. Bazavov et al [HotQCD],
arXiv:1812.08235

chiral limit extrapolation

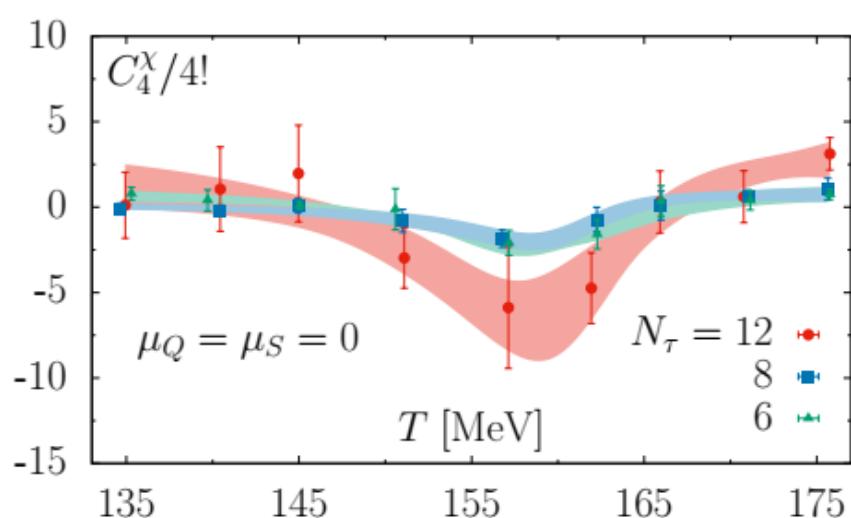
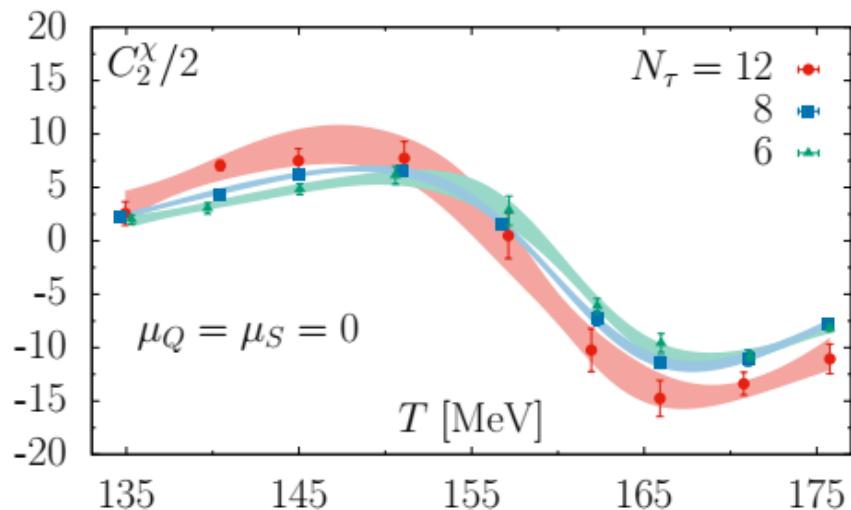
$T_c^0 = 132^{+3}_{-6} \text{ MeV}$

H.-T. Ding et al [HotQCD],
arXiv:1903.04801

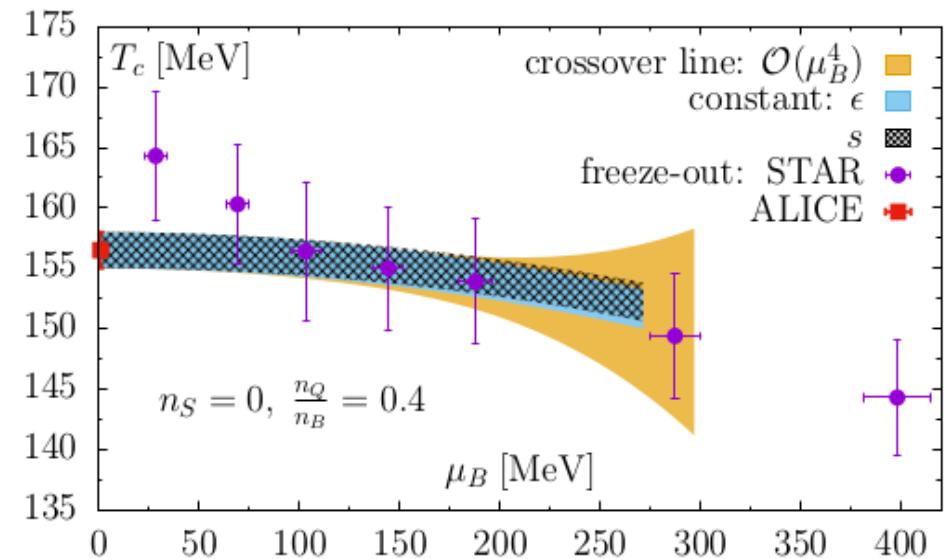
Pseudo-critical (crossover) temperature

Taylor expansion of chiral susceptibility:

$$\chi_M(T, \mu_B) = m_s \frac{\partial \langle \bar{\psi} \psi \rangle}{\partial m_l} = \chi_M(T, 0) + \frac{1}{2} c_2^\chi(T) \left(\frac{\mu_B}{T} \right)^2 + \mathcal{O}(\mu_B^4)$$



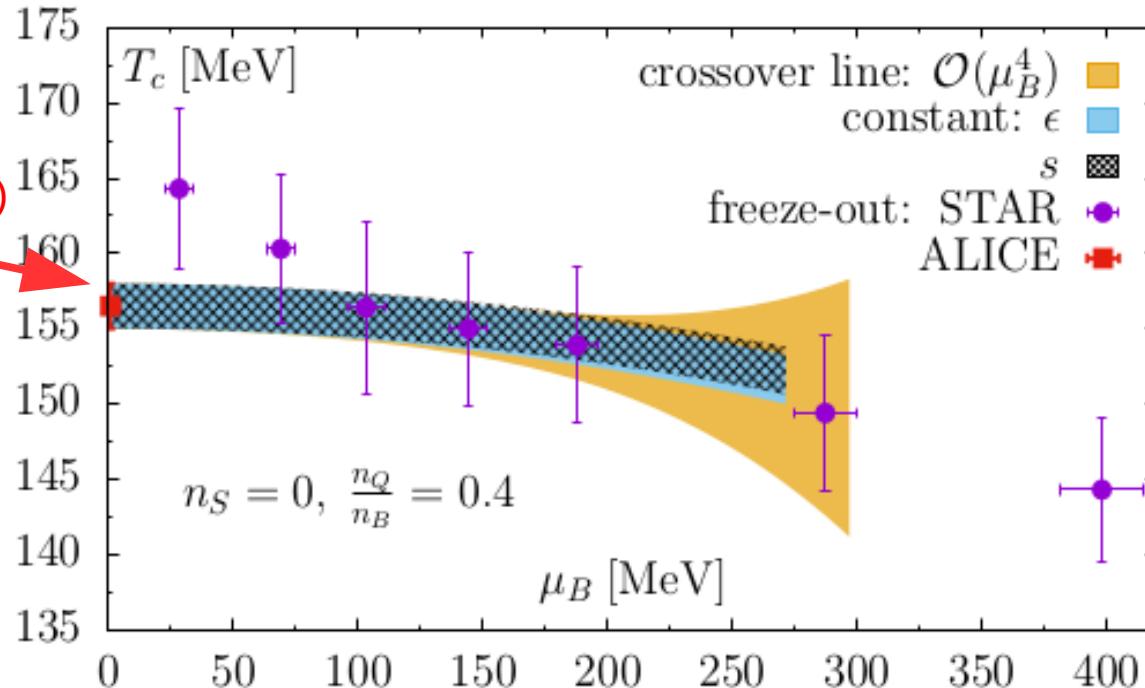
$$T_{pc}(\mu_B) = \textcolor{red}{T}_{pc} \left(1 + \textcolor{blue}{\kappa}_2 \left(\frac{\mu_B}{T_{pc}} \right)^2 + \dots \right)$$



Pseudo-critical (crossover) temperature

$$T_{pc}(\mu_B) = \textcolor{red}{T}_{pc} \left(1 + \kappa_2 \left(\frac{\mu_B}{T_{pc}} \right)^2 + \dots \right)$$

A. Andronic et al.,
Nature 561 (2018)
321



hadrons freeze-out
on the pseudo-critical
line of the QCD
phase transition

$$T_{pc} = (156.5 \pm 1.5) \text{ MeV} \quad (158.0 \pm 0.6) \text{ MeV}$$

$$\kappa_2 = 0.012(4) \quad 0.0153(18)$$

A. Bazavov et al [HotQCD],
arXiv:1812.08235

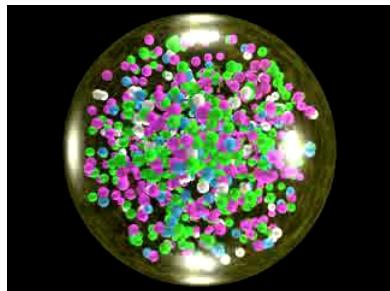
S. Borsanyi et al.,
arXiv:2002.02821

Explore the **structure of matter** close to the QCD transition temperature using **fluctuations of conserved charges**

baryon number, strangeness, electric charge

High T: ideal gas

ideal quark (fermi) gas, m=0



fractional charges

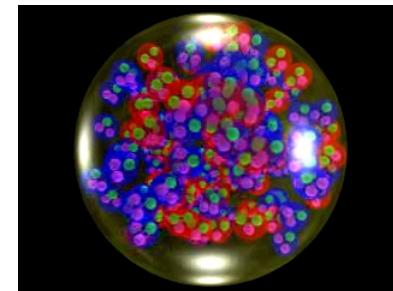
baryon number: $B = +/- 1/3$

electric charge: $Q = +/- 1/3, +/- 2/3$

strangeness: $S = +/- 1$

Low T: HRG

hadron resonance gas



integer charges

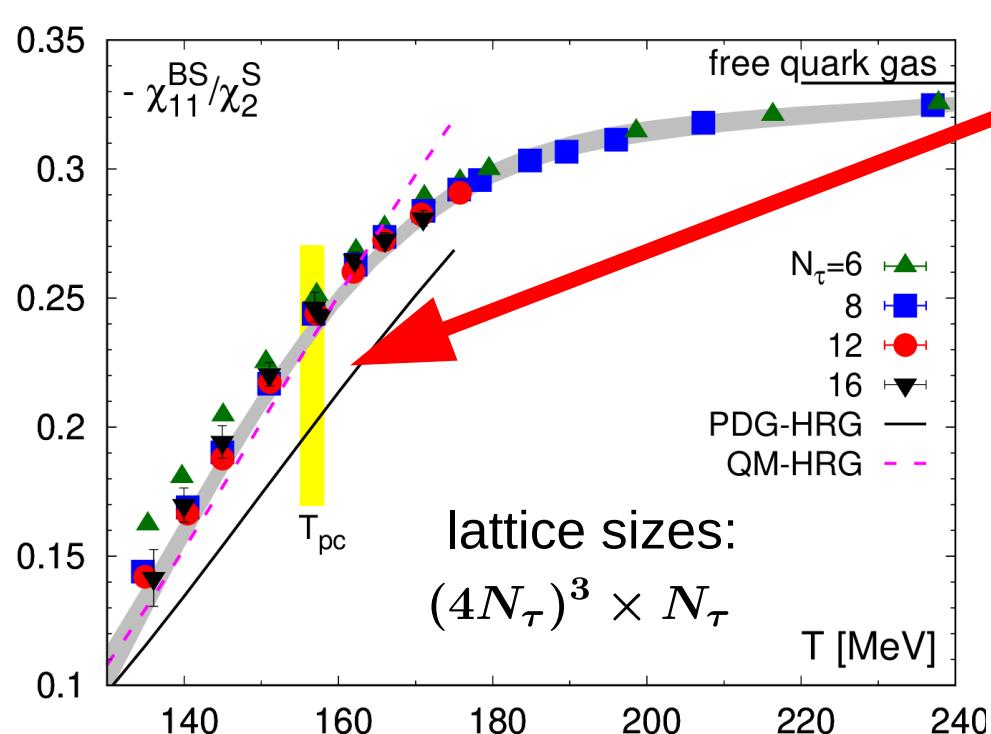
baryon number: $B = +/- 1$

electric charge: $Q = 0 = +/- 1, +/- 2$

strangeness: $S = 0, +/- 1, +/- 2, +/- 3$

Ratio of baryon number – strangeness correlation and net strangeness fluctuations

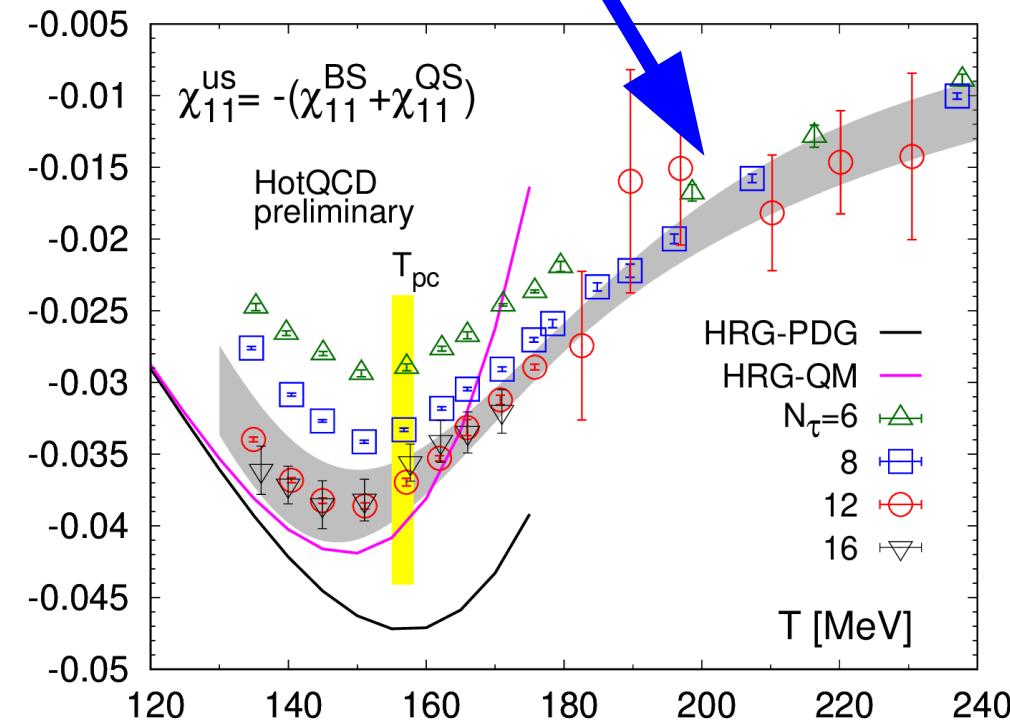
state-of-the-art calculations on GPUs



$$-\frac{\chi_{11}^{\text{BS}}}{\chi_2^S} = \frac{1}{3} + \frac{2}{3} \frac{\chi_{11}^{\text{us}}}{\chi_2^s}$$

change from **correlated quark flavors**
inside hadrons

to almost **uncorrelated quark flavors in**
the quark gluon plasma



Equation of state of (2+1)-flavor QCD: $\mu_B/T > 0$

Taylor expansion in the chemical potentials

$$\frac{P}{T^4} = \sum_{i,j,k=0}^{\infty} \frac{1}{i!j!k!} \chi_{i,j,k}^{BQS}(T) \left(\frac{\mu_B}{T}\right)^i \left(\frac{\mu_Q}{T}\right)^j \left(\frac{\mu_S}{T}\right)^k$$



constrained by external (boundary) conditions, e.g.

- vanishing strangeness
- fixed electric charge to baryon number ratio

$$\frac{P(T, \mu_B)}{T^4} = \frac{P(T, \mu_B = 0)}{T^4} + \sum_{n=2}^{\infty} \frac{1}{n!} \bar{\chi}_n^B(T) \left(\frac{\mu_B}{T}\right)^n$$

n-th order coefficients require n inversions of the fermion matrix,e.g.

$$\bar{\chi}_n^B \sim \text{Tr} M^{-1} \frac{\partial M}{\partial \mu_B} M^{-1} \frac{\partial M}{\partial \mu_B} \dots M^{-1} \frac{\partial M}{\partial \mu_B}$$

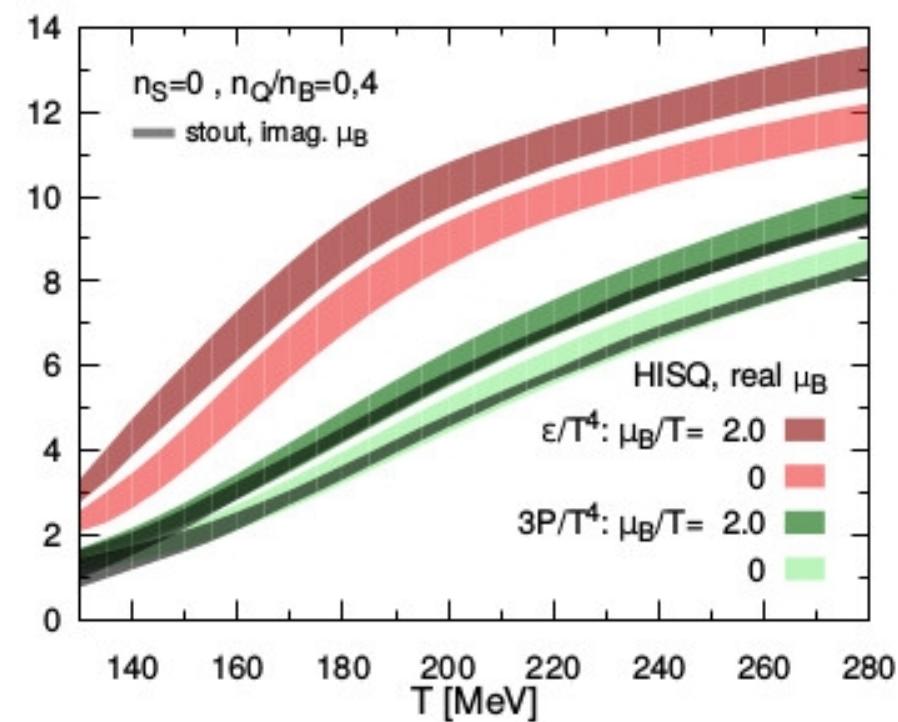
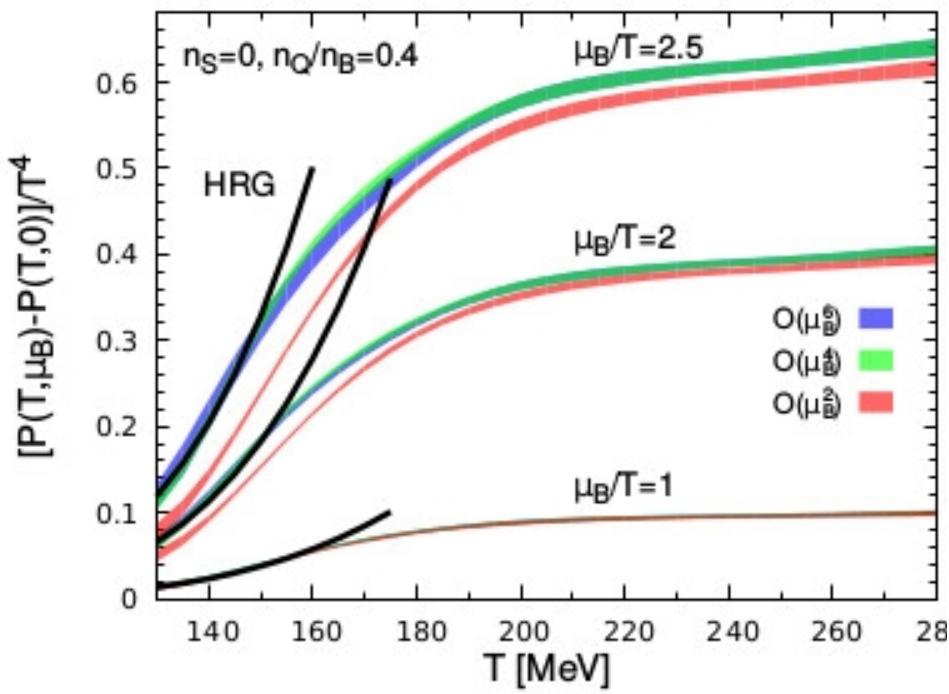
Equation of state of (2+1)-flavor QCD: $\mu_B/T > 0$

$$\frac{P(T, \mu_B)}{T^4} = \frac{P(T, 0)}{T^4} + \frac{\chi_2^B}{2} \left(\frac{\mu_B}{T} \right)^2 (1) + \frac{1}{12} \frac{\chi_4^B}{\chi_2^B} \left(\frac{\mu_B}{T} \right)^2$$

variance of net-baryon number distribution

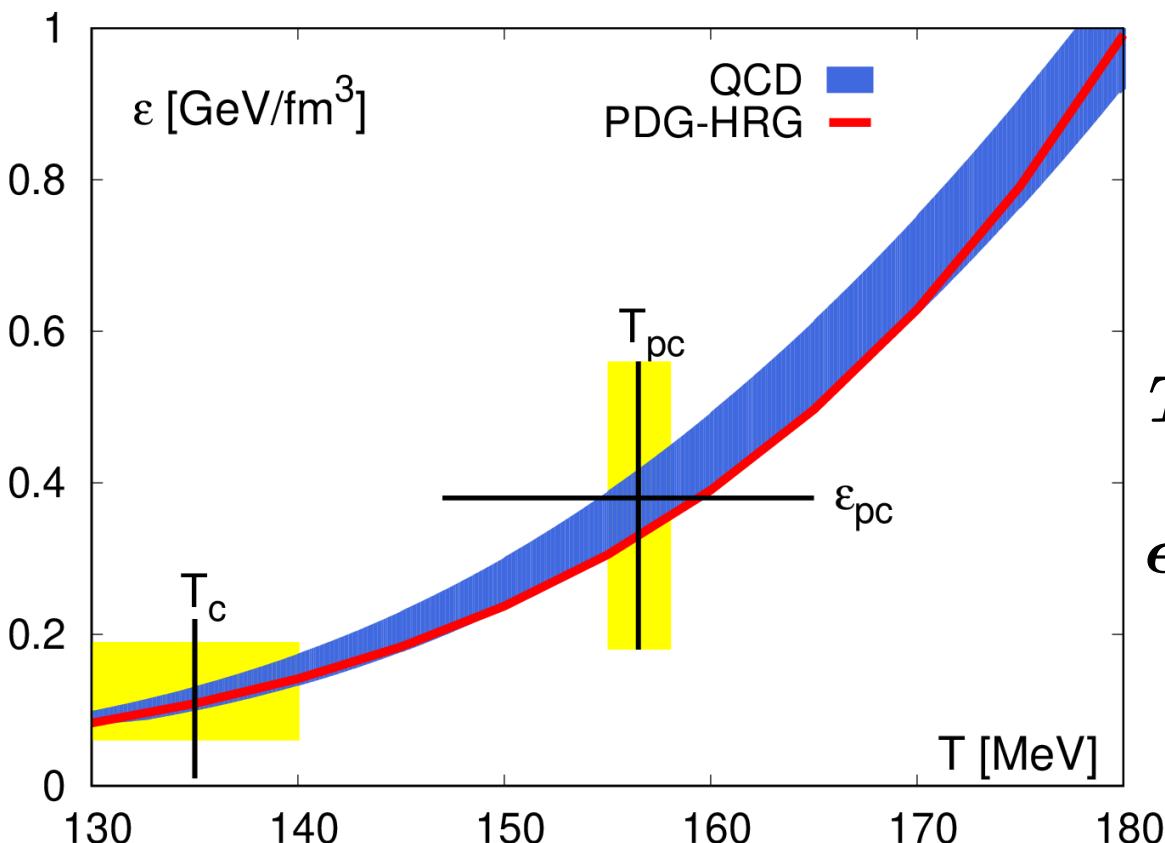
$$+ \frac{1}{360} \frac{\chi_6^B}{\chi_2^B} \left(\frac{\mu_B}{T} \right)^4 + \mathcal{O}(\mu_B^6)$$

kurtosis*variance



Crossover transition parameters

PDG: Particle Data Group hadron spectrum



$$T_c = (156.5 \pm 1.5) \text{ MeV}$$

$$\epsilon_c = (380 \pm 120) \text{ MeV/fm}^3$$

compare with:

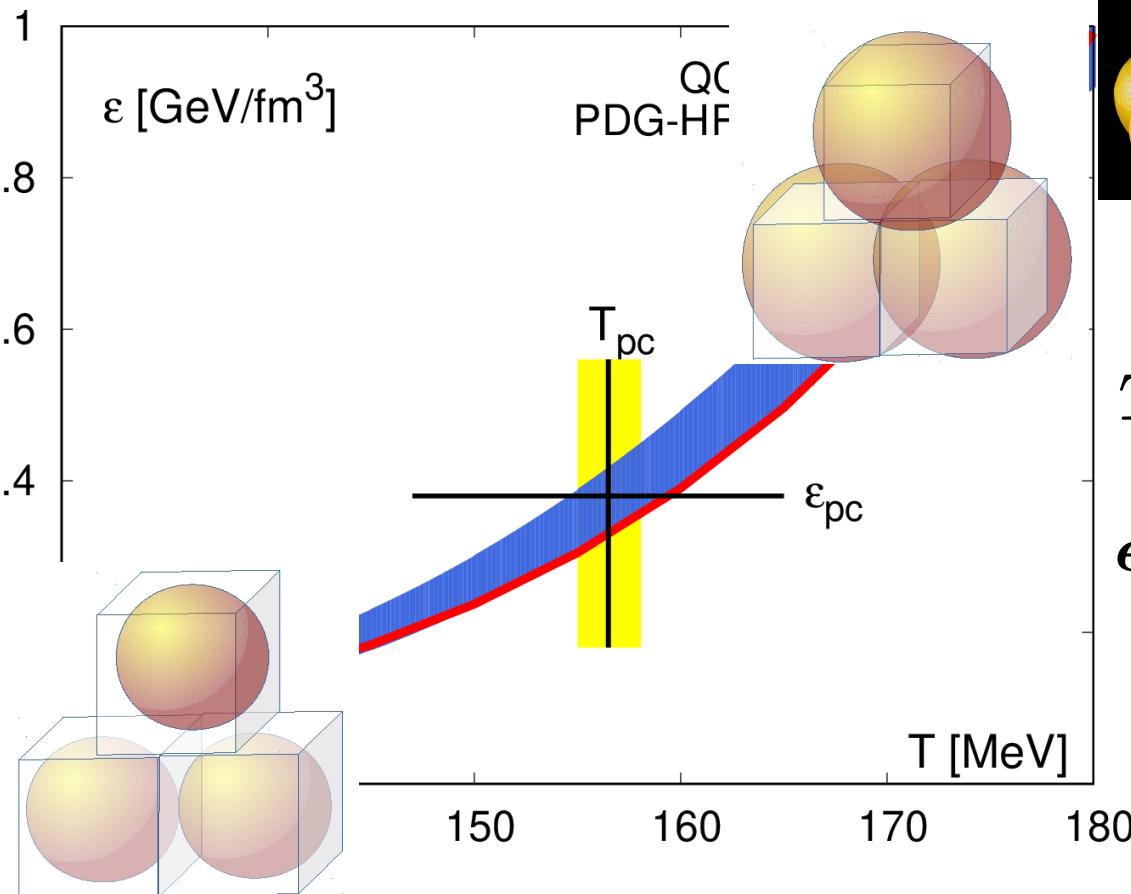
$$\epsilon^{\text{nucl. mat.}} \simeq 150 \text{ MeV/fm}^3$$

$$\epsilon^{\text{nucleon}} \simeq 450 \text{ MeV/fm}^3$$

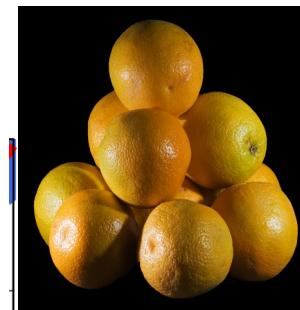
A. Bazavov et al. (HotQCD),
Phys. Rev. D90 (2014) 094503

Crossover transition parameters

PDG: Particle Data Group hadron spectrum



dense packing of spheres (DPS)



$$\epsilon^{\text{DPS}} = 0.74 \epsilon^{\text{nucleon}} \\ \simeq 330 \text{ MeV/fm}^3$$

$$(R_p \simeq 0.8 \text{ fm})$$

overlapping hadrons = QGP ??

$$T_c = (156.5 \pm 1.5) \text{ MeV}$$

$$\epsilon_c = (380 \pm 120) \text{ MeV/fm}^3$$

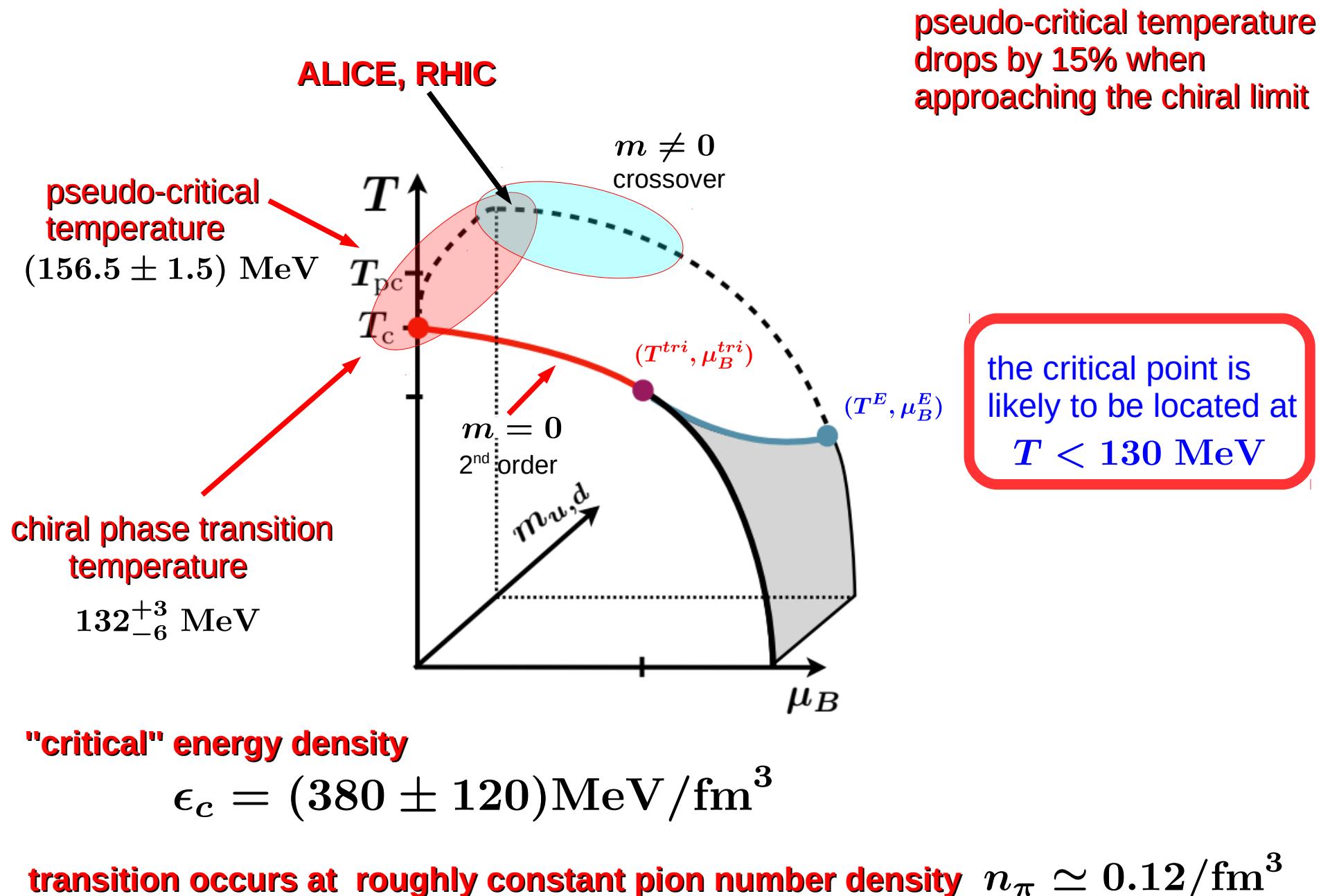
compare with:

$$\epsilon^{\text{nucl. mat.}} \simeq 150 \text{ MeV/fm}^3$$

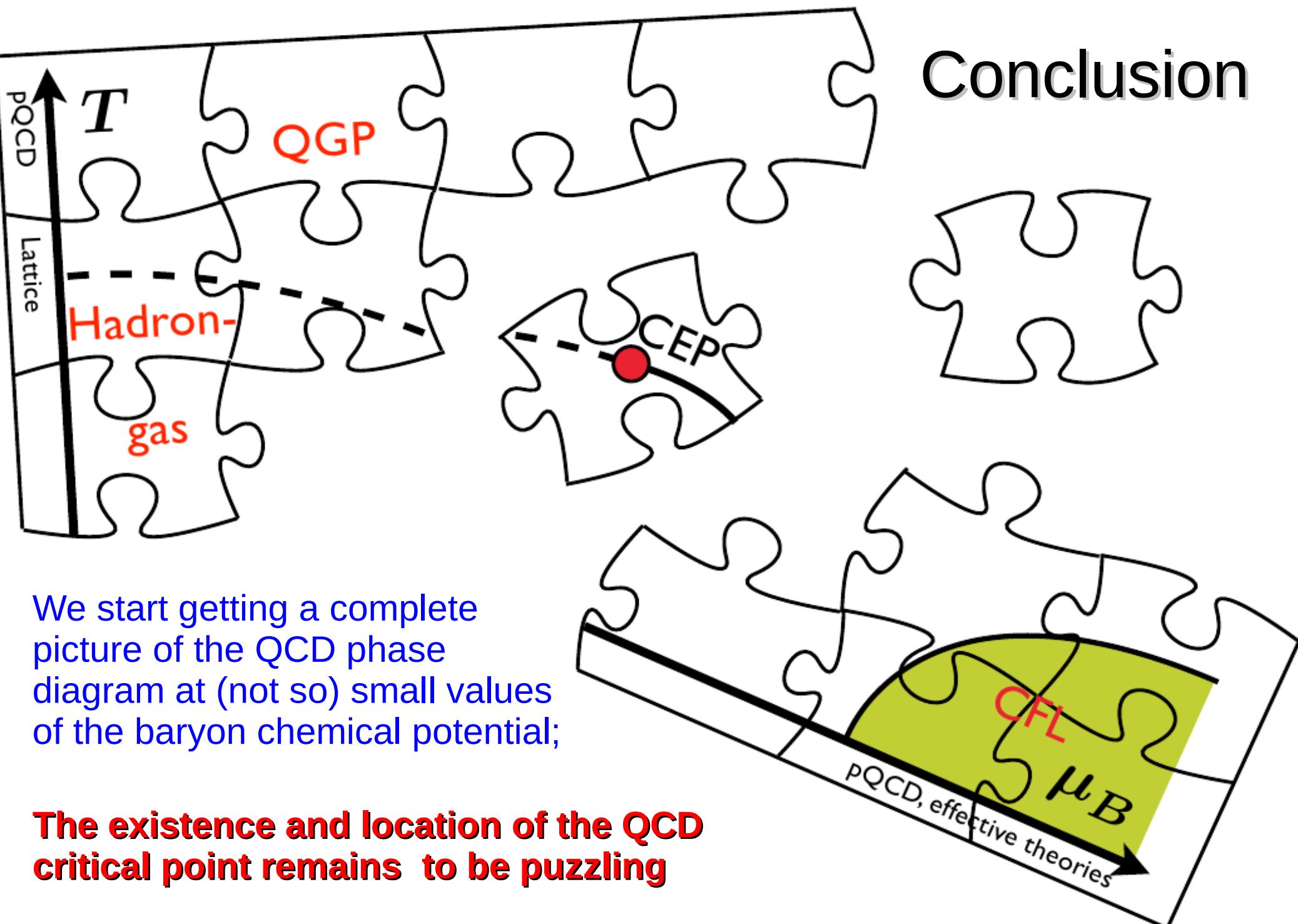
$$\epsilon^{\text{nucleon}} \simeq 450 \text{ MeV/fm}^3$$

A. Bazavov et al. (HotQCD),
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Phase diagram of strongly interacting matter



Conclusion



**all data shown are based on work done by the
HotQCD Collaboration**

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