# The Nature of QCD Phase Transitions From cumulants to the Metropolis Algorithm

Anar Rustamov







# Phase diagram of QCD matter



P. Braun-Munzinger, A.R., J. Stachel, 50 years of QCD, EPJ C 83 (2023) 1125 FO: A. Andronic, P. Braun-Munzinger, K. Redlich and J. Stachel, Nature 561, 321–330 (2018) IQCD: A. Bazavov et al., (HotQCD), PLB 795 (2019) 15-21

A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef



 $T_{fo}^{ALICE} = 156.5 \pm 1.5 \pm 3 \text{ MeV(sys)}$  $\mu_R \approx 0$ ,  $V \approx 5280 \text{ fm}^3$  (in one unit of rapidity)  $V_{Ph} \approx 1200 \text{ fm}^3$  $T_{C}^{LQCD} = 156.5 \pm 1.5 \text{ MeV}$ 

for a thermal system of fixed volume V and temperature T



## experiment





## Probing EoS with event-by-event fluctuations



- $o r^{th}$  order cent



 $\frac{\kappa_n(N_B - N_{\bar{B}})}{VT^3} \equiv \frac{1}{VT^3} \frac{\partial^n \ln Z(V, T, \mu_B)}{\partial (\mu_B/T)^n} = \frac{\partial^n P/T^4}{\partial (\mu_B/T)^n} \equiv \hat{\chi}_n^B$ experiment theory

o "volume" fluctuates

o exact conservations

o measures **net-protons** 

A. Rustamov, Antrittsvorlesung, 22.01.2025, Goethe University Frankfurt

•  $\Delta N = N_R - N_{\bar{R}}$  occurs with probability  $p(\Delta N)$  (measured)

ral moment: 
$$\mu_r = \sum_{\Delta N} (\Delta N - \langle \Delta N \rangle)^r p(\Delta N)$$

° first 4 cumulants:  $\kappa_1 = \langle \Delta N \rangle$ ,  $\kappa_2 = \mu_2$ ,  $\kappa_3 = \mu_3$ ,  $\kappa_4 = \mu_4 - 3\mu_2^2$ 

o volume is fixed o conservations on average o predicts for **net-baryons** 







## **Experimental challenges**

- Volume fluctuations
- Conservation laws
- First ALICE results

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## **Experiment vs. Theory**

- Canonical Thermodynamics
- Comparison to STAR results
- Metropolis algorithm
- Comparison to ALICE results
- Outlook



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# Bridging experiment with theory



Bridging the gap between event-by-event fluctuation measurements and theory predictions in relativistic nuclear collisions, P. Braun-Munzinger, A. Rustamov, J. Stachel, Nucl. Phys. A 960 (2017) 114-130.

V. Skokov, B. Friman, and K. Redlich, Phys.Rev. C88 (2013) 034911



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### <u>Wounded nucleons</u>, $N_W$ : Nucleons which collided at least once <u>inelastically</u>





# Contributions from wounded nucleon fluctuations





ALICE Phys.Rev. C88 (2013) no.4, 044909

A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef

model of independent sources



# Volume fluctuations





A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef

$$\kappa_{2}(N-\bar{N}) = \kappa_{2}(n-\bar{n})\langle N_{W}\rangle + \langle N-\bar{N}\rangle^{2} \frac{\kappa_{2}(N_{W})}{\langle N_{W}\rangle^{2}}$$
vanishes for ALICE
$$4(\Delta N) = \langle N_{W}\rangle \kappa_{4}(\Delta n) + 4 \langle \Delta n\rangle \kappa_{3}(\Delta n)\kappa_{2}(N_{W})$$

$$- 3\kappa_{2}^{2}(\Delta n)\kappa_{2}(N_{W}) + 6 \langle \Delta n\rangle^{2} \kappa_{2}(\Delta n)\kappa_{3}(N_{W}) + \langle \Delta n\rangle^{4} \kappa_{4}(N_{W})$$
may be negative
$$(2017) 114.130$$

$$(2017) 114.130$$

$$(317) + (317) +$$





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## Ideal Gas in GCE



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$$\frac{\kappa_n(N_B - N_{\bar{B}})}{VT^3} = \frac{1}{VT^3} \frac{\partial^n \ln Z(V, T, \mu_B)}{\partial (\mu_B / T)^n} \equiv \hat{\chi}_n^B$$

### **Ideal Gas in Grand Canonical Ensemble**

$$\kappa_n(N) = \langle N \rangle$$
 (Poisson distribution)

$$\kappa_n(N-\bar{N}) = \langle N \rangle + (-1)^n \langle \bar{N} \rangle$$
 (Skellam distribution)

ample: 
$$\frac{\kappa_2(N-\bar{N})}{\langle N+\bar{N}\rangle} = \frac{\langle N+\bar{N}\rangle}{\langle N+\bar{N}\rangle} = 1$$



## Ideal Gas in GCE



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$$\frac{N_B - N_{\bar{B}}}{VT^3} = \frac{1}{VT^3} \frac{\partial^n \ln Z(V, T, \mu_B)}{\partial \left(\mu_B / T\right)^n} \equiv \hat{\chi}_n^B$$

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# Ideal Gas in GCE + conservation laws





P. Braun-Munzing





#### **Exact conservati**



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$$\frac{N_{\bar{B}}}{N_{\bar{B}}} = \alpha \left[ \frac{\kappa_2 (N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}} \rangle} + 1 - \alpha \right] + 1 - \alpha$$
er, A.R., J. Stachel, NPA 960 (2017) 114-130

If baryon number is conserved in full phase space

$$\frac{-N_{\bar{B}}}{+N_{\bar{B}}\rangle} = 1 - \alpha$$

$$\frac{\kappa_2(N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}}\rangle} = 1$$
on
$$\frac{\kappa_2(N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}}\rangle} = 1 - \alpha$$

$$\frac{\kappa_2(N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}} \rangle} = 0$$







# Ideal Gas in GCE + conservation laws









#### **Exact conservati**



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$$\frac{N_{\bar{B}})}{N_{\bar{B}}\rangle} = \alpha \left[ \frac{\kappa_2 (N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}} \rangle} + 1 - \alpha \right] + 1 - \alpha$$

$$M_B = \alpha \left[ \frac{\kappa_2 (N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}} \rangle} + 1 - \alpha \right]$$

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$$\frac{\kappa_2(N_B - N_{\bar{B}})}{\langle N_B + N_{\bar{B}} \rangle} = 0$$











# First Alice results (Identity Method)



A. R., Nucl.Phys.A 967 (2017) 453-456 (QM 17) ALICE: Phys. Lett. B 807 (2020) 135564, Phys. Lett. B (2022) 137545

A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef





A. Bazavov et al [HotQCD], PRD 101 (2020) 074502 A. Bazavov et al., Phys.Rev. D85 (2012) 054503

## first verification of LQCD results

### **Consequences:**

- Support for the validity of the HRG model
- Further support for freeze-out at the phase boundary

Identity Method A.R., M. I. Gorenstein, PRC 86, 044906 (2012) M. Arslandok, A.R., NIM A946, 162622 (2019) A. R., Phys.Rev.C 110 (2024) 6, 064910





# First ALICE results (Identity Method)



A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef

$$\kappa_2(N-\bar{N}) = \kappa_2(n-\bar{n})\langle N_W \rangle + \langle N-\bar{N} \rangle^2 \frac{\kappa_2(N_W)}{\langle N_W \rangle^2}$$

P. Braun-Munzinger, A. R., J. Stachel, NPA 960 (2017) 114-130

A. R., Nucl.Phys.A 967 (2017) 453-456 (QM 17) ALICE: Phys. Lett. B 807 (2020) 135564, Phys. Lett. B (2022) 137545

#### **Experimental verification:**

$$R_1 = \kappa_2 (p - \bar{p}) / \langle n_p + n_{\bar{p}} \rangle$$

o not influenced by volume fluctuations

 $R_2 = \kappa_2(p) / \langle n_p \rangle$ 

o affected by volume fluctuations







## **Experimental challenges**

- Volume fluctuations
- Conservation laws
- First ALICE results

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## **Experiment vs. Theory**

- Canonical Thermodynamics
- Comparison to STAR results
- Metropolis algorithm
- Comparison to ALICE results
- o Outlook

P. Braun-Munzinger, A.R., J. Stachel, NPA 982 (2019) 307-310 (QM 18) P. Braun-Munzinger, A.R., J. Stachel, e-Print: 1907.03032 [nucl-th] (2019) A. R., NPA 1005 (2021) 121858(QM 19)





# Ideal gas EoS plus global baryon number conservation





 $\langle N_B \rangle$ ,  $\langle N_{\bar{B}} \rangle$  - in  $4\pi$  $\langle n_B \rangle$ ,  $\langle n_{\bar{B}} \rangle$  - inside acceptance  $\alpha_B = \langle n_B \rangle / \langle N_B \rangle$  - acceptance for B  $\alpha_{\bar{B}} = \langle n_{\bar{B}} \rangle / \langle N_{\bar{B}} \rangle$  - acceptance for  $\bar{B}$ z - single baryon partition function

in general:  $\alpha_{R} \neq \alpha_{\bar{R}}$ 

P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141

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- exploiting Canonical Ensemble in the full phase space
  - $\Im$  no fluctuations in  $4\pi$  (like in experiments)









# Experimental acceptance



A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef



# The strategy







### Comparison to baseline

P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141

### **Baseline Calculator**

A. Rustamov, B. Friman https://github.com/e-by-e/Cumulants-CE.git

A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef

## within acceptance \_\_\_<sup>m<sup>⊲</sup></sup> 40⊨ $\bigstar \left( \langle N_B \rangle_A, \langle N_{\bar{B}} \rangle_A \right)$ 30 20 10 0<u>⊩</u> 0

20

40





N<sub>B</sub>





# Results from STAR vs. canonical baseline

## the first quantitative and most precise canonical baselines



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remarkable agreement between canonical baseline and STAR BESI data

- significant reduction of canonical baseline for  $\kappa_6/\kappa_2$  going from positive values at LHC to negative values at lower energies
- STAR DATA for  $\kappa_6/\kappa_2$  is not consistent with the LQCD predictions

**STAR:** PRL 126 (2021) 9, 092301, PRL 130 (2023) 8, 082301 P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141



## Energy excitation function of $\kappa_4/\kappa_2$ in central Au-Au collisions

HADES: Phys.Rev.C 102 (2020) 2, 024914 STAR: Phys.Rev.Lett. 126 (2021) 9, 092301



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a dip in the excitation function is generic

M. Stephanov, PRL102.032301(2009), PRL107.052301(2011) M.Cheng et al, PRD79.074505(2009)

STAR: Phys.Rev.Lett. 126 (2021) 9, 092301

"non-monotonic behavior with a significance of  $3.1\sigma$ relative to GCE expectation"





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STAR: Phys.Rev.Lett. 126 (2021) 9, 092301

### "non-monotonic behavior with a significance of $3.1\sigma$ relative to GCE expectation"

CE Baseline: P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141

no statistically significant difference between the data and the canonical baseline (KS test:  $1.2\sigma$ ,  $\chi^2$  test:  $1.5\sigma$ )













## STAR BES I vs. BES II DATA, $\kappa_4/\kappa_2$



P. Braun-Munzinger, A. R., N. Xu, Annual Review of Nuclear and Particle Science (under preparation)

A. Rustamov, Never at Rest: A Lifetime Inquiry of QGP, 9-12 February, 2025, Physikzentrum Bad Honnef

NEW STAR data points are digitized from the pdf plot!



A. Pandav, CPOD 2024 Note: We prefer to plot  $C_1/C_2$ Notation:  $C_i \rightarrow \kappa_i$ 

### The NEW data show significantly reduced uncertainties

CE Baseline: P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141





## **Experimental challenges**

- Volume fluctuations
- Conservation laws
- First ALICE results

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# Ideal gas EoS plus local conservation laws



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- exploiting Canonical Ensemble in the full phasespac
- <sup>o</sup> no fluctuations in  $4\pi$  (like in experiments)
  - correlations in rapidity space (local conservations)





# Metropolis algorithm (Simulated annealing)



### works for arbitrary rapidity distributions

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$$\rho_{n} = \frac{cov[y_{B}, P_{n}(y_{\bar{B}})]}{\sigma_{y_{B}}\sigma_{y_{\bar{B}}}}$$
$$\Delta = |\rho_{n} - \rho| - |\rho_{n-1} - \rho|$$
$$\rho: \text{ desired corr. coefficient}$$

A. R., P. Braun-Munzinger, J. Stachel, QM 2022 P. Braun-Munzinger, K. Redlich, A. R., J. Stachel, JHEP 08 (2024) 113





# Details of implementation

$$Z_{B}(V,T) = \sum_{N_{B}=0}^{\infty} \sum_{N_{\bar{B}}=0}^{\infty} \frac{(\lambda_{B} z_{B})^{N_{B}}}{N_{B}!} \frac{(\lambda_{\bar{B}} z_{\bar{B}})^{N_{\bar{B}}}}{N_{\bar{B}}!} \delta(N_{B} - N_{\bar{B}} - B) = \left(\frac{\lambda_{B} z_{B}}{\lambda_{\bar{B}} z_{\bar{B}}}\right)^{\frac{B}{2}} I_{B}(2 z \sqrt{\lambda_{B} \lambda_{\bar{B}}})$$

B net baryon number, conserved in each event modified Bessel function of the first kind  $I_R$ single particle partition functions for baryons, anti baryons  $Z_{R}, Z_{\bar{R}}$ auxiliary parameters for calculating cumulants of baryons, anti baryons  $\lambda_R, \lambda_{\bar{R}}$ 

baryon number conservation (CE partition function)

### Input from experiments

baryon rapidity distributions  $\stackrel{\scriptstyle >}{\scriptstyle >}$  measured (canonical)  $\langle N_{R} \rangle$ ,  $\langle N_{\bar{R}} \rangle$ 

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+

- A. R., P. Braun-Munzinger, J. Stachel, QM 2022 P. Braun-Munzinger, K. Redlich, A. R., J. Stachel, JHEP 08 (2024) 113









# ALICE Results (Identity Method)

P. Braun-Munzinger, B. Friman, K. Redlich, A.R., J. Stachel, NPA 1008 (2021) 122141 P. Braun-Munzinger, K. Redlich, A.R., J. Stachel, JHEP 08 (2024) 113



• Alice data: best description with  $\rho = 0.1$  (  $\Delta y_{corr} = 12$  )  $\leftrightarrow$  **Global baryon number conservation** 

Agreement with LQCD predictions

Calls into question baryon production mechanism in Hjing (Lund String Fragmentation) 0

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ALICE: Phys. Lett. B 807 (2020) 135564, Phys. Lett. B (2022) 137545

![](_page_27_Picture_8.jpeg)

![](_page_27_Picture_9.jpeg)

![](_page_27_Picture_10.jpeg)

## Near future, CBM

![](_page_28_Figure_1.jpeg)

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![](_page_28_Figure_3.jpeg)

- Systematic measurements of fluctuations stemming from critical point
- Measuring fluctuations induced by spinodal 0 decomposition
- Search for cluster formation
- P. Braun-Munzinger, K. Redlich, A. R., J. Stachel, JHEP 08 (2024) 113
- C. Sasaki, B. Friman, K. Redlich, Phys.Rev.D 77 (2008) 034024

![](_page_28_Picture_10.jpeg)

## Near future, ALICE3

![](_page_29_Figure_1.jpeg)

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#### e-Print: 2211.02491 [physics.ins-det]

![](_page_29_Figure_4.jpeg)

#### **Acceptance coverages**

• ALICE 1-2:  $0.6 GeV/c, <math>|\eta| < 0.8$ • ALICE 3:  $0.3 GeV/c, <math>|\eta| < 4$ 

**Opens new avenues, such as study of charm fluctuations** 

![](_page_29_Picture_8.jpeg)

![](_page_30_Picture_0.jpeg)

May your journey, both in physics and in life, be filled with breakthrough moments, smooth trajectories, and just the right amount of **fluctuations** to keep things interesting.

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## Happy Birthday, Dear Johanna!

![](_page_30_Picture_5.jpeg)

![](_page_31_Picture_0.jpeg)

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![](_page_31_Picture_2.jpeg)