#### **MPD CM**

# Skewness of the elliptic flow distribution from the MPD

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MPD XI-th Collaboration Meeting



#### Motivation

- Collectivity in nuclear collisions studied by Q-cumulants
- Centrality dependence of the hydrodynamic probes
- Central moments of the  $\mathbf{v}_2$  distribution
- Do central moments change with incident energies?

#### Conclusions

## **Motivation**

## **Azimuthal anisotropy**



 $\Psi_n$  (angle of n<sup>th</sup>-order flow symmetry plane)



#### **v**<sub>n</sub> – Fourier harmonics depend on

- initial state geometry
- initial state fluctuations
- medium transport properties (e.g. η/s)

$$v_n = \left\langle \cos[n(\phi - \Psi_n)] \right\rangle$$

#### **Event-by-event v**<sub>n</sub> distribution is not Gaussian-like

## Shape of the v<sub>2</sub> distribution



## **Q-cumulants**

## v<sub>2</sub> shape studied via Q-cumulant method

 $\langle 2 \rangle \equiv \langle e^{in(\phi_1 - \phi_2)} \rangle$ **Multi-particle**  $\langle 4 \rangle \equiv \left\langle e^{in(\phi_1 + \phi_2 - \phi_3 - \phi_4)} \right\rangle$ correlations **Q-vector**  $Q_n = \sum_{i=1}^{M} e^{in\varphi_i}$  $\langle 4 \rangle = \frac{|Q_n|^4 + |Q_{2n}|^2 - 2\operatorname{Re}[Q_{2n}Q_n^*Q_n^*]}{M(M-1)(M-2)(M-3)}$  $\left< 2 \right> = \frac{\left| Q_n \right|^2 - M}{M(M - 1)}$ Ideal detector case  $-2\frac{2(M-2)|Q_n|^2 - M(M-3)}{M(M-1)(M-2)(M-3)}$ Averaging over all events  $\langle \langle 2 \rangle \rangle \equiv \langle \langle e^{in(\phi_1 - \phi_2)} \rangle \rangle$  $\left< \left< 4 \right> \right> = \left< \left< e^{in(\phi_1 + \phi_2 - \phi_3 - \phi_4)} \right> \right>$ 

Formulas become more and more larger with an increase of the cumulant order

## **Q-cumulants and v**<sub>n</sub>

[Phys. Rev. C 104 (2021) 034906]:

$$c_{n} \{2k\} = \langle \langle 2k \rangle \rangle - \sum_{m=1}^{k-1} \binom{k}{m} \binom{k-1}{m} \langle \langle 2m \rangle \rangle c_{n} \{2k-2m\}$$

$$c_{n} \{2\} = \langle \langle 2 \rangle \rangle$$
General formulas
for any order
$$v_{n} \{4\} = \langle \langle 4 \rangle \rangle - 2\langle \langle 2 \rangle \rangle^{2}$$

$$v_{n} \{2k\} = {}_{2k} \frac{(2k)!}{2^{2k} (k!)^{2}} \left[ \frac{d^{2k}}{dl^{2k}} \ln I_{0}(l) \Big|_{l=0} \right]^{-1} c_{n} \{2k\}$$

$$v_{n} \{2\} = \sqrt{c_{n} \{2\}}$$

$$v_{n} \{4\} = 4\sqrt{-c_{n} \{4\}}$$

#### Expansion of hydro probes in central moments

$$h_{1} = \frac{v_{2}\{6\} - v_{2}\{8\}}{v_{2}\{4\} - v_{2}\{6\}} \approx \frac{1}{11} - \frac{4\kappa_{40} + \frac{8(p_{50} + p_{32})}{\overline{v_{2}}}}{11\left[2\overline{v_{2}}s_{30} + 3(\kappa_{40} + \kappa_{22}) + \frac{3(p_{50} + 2p_{32} + p_{14}) - 2(\sigma_{y}^{2} - \sigma_{x}^{2})(5s_{30} - 6s_{12})}{2\overline{v_{2}}}\right]}$$

$$h_{2} = \frac{v_{2}\{8\} - v_{2}\{10\}}{v_{2}\{6\} - v_{2}\{8\}} \approx \frac{3}{19} - \frac{88p_{50}}{95\left[4\overline{v}_{2}^{2}s_{30} - 2\overline{v}_{2}(\kappa_{40} - 3\kappa_{22}) - 13(p_{50} + 10p_{32} - 3p_{14}) - 2(\sigma_{y}^{2} - \sigma_{x}^{2})(5s_{30} - 6s_{32})\right]}$$

If higher moments  $\kappa$ , p, ... negligible  $\rightarrow$  h<sub>i</sub> are centrality independent





$$\frac{v_{2}\{6\} - v_{2}\{8\}}{v_{2}\{4\} - v_{2}\{6\}} \approx \frac{1}{11} - \frac{1}{11} \frac{v_{2}\{4\}^{2} - 12v_{2}\{6\}^{2} + 11v_{2}\{8\}^{2}}{v_{2}\{4\}^{2} - v_{2}\{6\}^{2} + \frac{(\sigma_{y}^{2} - \sigma_{x}^{2})s_{30}}{3\overline{v}_{2}^{3}}$$
negligible
$$\frac{v_{2}\{8\} - v_{2}\{10\}}{v_{2}\{6\} - v_{2}\{8\}} \approx \frac{3}{19} - \frac{1}{19} \frac{3v_{2}\{6\}^{2} - 22v_{2}\{8\}^{2} + 19v_{2}\{10\}^{2}}{v_{2}\{6\}^{2} - v_{2}\{8\}^{2} + \frac{(\sigma_{y}^{2} - \sigma_{x}^{2})s_{30}}{33\overline{v}_{2}^{3}}$$
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## Hydrodynamics probes and central moments **NICA MPD case** JAM

## v<sub>2</sub>{2k} from Q-cumulants - NICA

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV
- In 10 multiplicity classes from 100 up to 1200
- PID: p,  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ ,  $p_T > 200 \text{ MeV/c}$
- v<sub>2</sub>{2k} are well measured in semicentral collisions
- v<sub>2</sub>{2k} are not well enough 0.05 ordered. It could be a problem with JAM itself.
- Codes for calculations with 0.04 and without efficiency corrections.
- closed circles (squares): results without (with) efficiency corrections (efficiency randomly distributed between 95 and 100%)
- With real data and real efficiencies the two results will differ.



- 0.0 < b < 12.0 fm
- stat.: 1.068 B events

#### hydro check 1 - NICA

 $\Rightarrow$  AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV

- 0.0 < b < 12.0 fm
- stat.: 1.068 B events

- In 10 multiplicity classes from 100 up to 1200
- PID: p, π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, p<sub>T</sub> > 200 MeV/c With condition:  $v_2{4} > v_2{6} > v_2{8} > v_2{10}$



#### hydro check 2 - NICA

♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV

- 0.0 < b < 12.0 fm
- stat.: 1.068 B events

- In 10 multiplicity classes from 100 up to 1200
- PID: p, π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, p<sub>T</sub> > 200 MeV/c

With condition:  $v_2{4} > v_2{6} > v_2{8} > v_2{10}$ 





Skewness, kurtosis and

## NICA MPD case vHLLE+UrQMD

### v<sub>2</sub>{2k} from Q-cumulants – NICA MPD

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.5 GeV
- In 10 centrality classes 0 50%
- PID:  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ , 0.2 <  $p_T < 2.0 \text{ GeV/c}$

- Minimum bias
- stat.: 34 M events



#### Hydro probes vHLLE

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.5 GeV
  - In 10 centrality classes 0 up to 50%
- PID:  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ , 0.2 <  $p_T < 2.0 \text{ MeV/c}$

Vc Without condition:  $v_2{4} > v_2{6} > v_2{8} > v_2{10}$ 

0.0 < b < 12.0 fm

stat.: 34 M events

If centrality independent, this ratio should be 1/11 = 0.090909....

Points are reconstructed by chance. Statistics is to small

**Note:** If a proper cumulant ordering exists in the real data, that would significantly decrease the stat. uncertainties





#### **Elliptic power distributions**

In order to increase the statistics at NICA top energy, we used elliptic power distribution (EPD)

$$\frac{dN}{d\varepsilon_2} = 2\alpha (1-\varepsilon_0^2)^{\alpha+1/2} \varepsilon_2 \frac{(1-\varepsilon_2^2)^{\alpha-1}}{(1+\varepsilon_0\varepsilon_2)^{2\alpha+1}} {}_2F_1\left(\frac{1}{2}, 2\alpha+1; 1; \frac{2\varepsilon_0\varepsilon_2}{1+\varepsilon_0\varepsilon_2}\right)$$

where  $\alpha$  and  $\varepsilon_0$  are power and ellipticity parameters obtained by Trento. The scaling factor  $\kappa_2$  between the  $v_2$  and initial eccentricity  $\varepsilon_2$ ,  $v_2 = \kappa_2 \varepsilon_2$ , is chosen to imitate the MPD  $v_2$  centrality distribution  $\diamond$  The scaling factor  $\kappa_2$  is obtained by fitting  $v_2$ {4} vHLLE with pol3  $\diamond$  Small vHLLE statistics could cause a poor  $v_2$ {4} reconstruction. As a consequence, this can make a wrong positioning of  $v_2$ {2} and higher  $v_2$ {2k}, k=3,4,...

Expectation: NICA MPD will collect about 1B MB events per year. That should be enough to perform precise enough measurements of the hydro probes and central moments

#### Hydro probes vHLLE

♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.5 GeV
♦ PbPb collisions at  $\sqrt{s_{NN}}$  = 5.02 TeV

- In 9 centrality classes 5 up to 50%
- PID:  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ , 0.2 <  $p_T < 2.0$  GeV/c PID: charged,  $|\eta| < 2.4$ , 0.5 <  $p_T < 3.0$  GeV/c

Trento prediction gives values and shape similar to the CMS experimental measurements

It could be the case, if  $\alpha$  and  $\varepsilon_0$  does not depend on incident energy.

A long time of collision at the NICA energy can wash out it and change initial conditions significantly wrt LHC energies 20.04.2023



Trento prediction: AuAu, 11.5 GeV, vHLLE+UrQMD

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#### Skewness from the EPD

♦ PbPb collisions at  $\sqrt{s_{NN}}$  = 5.02 TeV ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.5 GeV

- In 9 centrality classes 5 up to 50%
- PID:  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ , 0.2 <  $p_{\tau} < 2.0 \text{ GeV/c}$  PID: charged,  $|\eta| < 2.4, 0.5 < p_T < 3.0 \text{ GeV/c}$



#### **Machine learning & cumulant splitting**

- The most simple case
- Fixed *v*<sub>2</sub>=0.02
- Fixed and high number of tracks
- Training 90k events, test 10k events

A simple toy model to simulate  $v_2$  only

Stat.: 100 k events with 500 tracks

XGBoost Machine Learning model used to reconstruct  $v_2$  (with 1M estimators)

ML learns from  $v_2 = \langle \cos(2\phi) \rangle$ values calculated in each event (training)

ML nicely reproduces the mean value and its statistical uncertainty

#### ML prediction:



### Machine learning & cumulant splitting

ML prediction:

- In 4 the most central classes 0 up to 20%
- Realistic multiplicity dependence (from vHLLE)
- PID:  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ , 0.2 <  $p_T < 2.0 \text{ GeV/c}$

Again a simple toy model to 0.05 Calc simulate  $v_2$  with realistic values Train 10000 ML Stat.: 100 k events in each 0.04 centrality class  $\rho_{corr}$  = 0.813 XGBoost Machine Learning 0.03 model used to reconstruct  $v_2$ >~ ML learns from  $v_2 = \langle \cos(2\phi) \rangle$ values calculated in each event 0.02 (training: 10/100k) ML nicely reproduces the mean 0.01 value and its statistical uncertainty 0.00 High correlation between 200 300 400 100 500 calculated and ML predicted Multiplicity values

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#### Machine learning & cumulant splitting

- In 4 the most central classes 0 up to 20%
- **Realistic multiplicity dependence (from vHLLE)**
- PID: π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, 0.2 < p<sub>T</sub> < 2.0 GeV/c

ML prediction:



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#### Conclusions

- At NICA energy huge statistics is needed to perform measurements of the hydrodynamics probes and central moments
- We ran JAM and vHLLE+UrQMD model
- JAM analysis performed with a high statistics, but seems there is no splitting between cumulants
- vHLLE+UrQMD should have splitting, but the current statistics is too small
- We used a toy EPD model with parameters obtained from Trento and vHLLE data to increase the statistics
- We started to use ML in order to see is it able to recognize the cumulant splitting, and to properly measure hydro probes and central v<sub>2</sub> moments
- Expectation: NICA MPD will collect about 1B MB events per year. That should be enough to perform precise enough measurements of the hydro probes and central moments

## Backup

## Hydrodynamics probes and central moments LHC CMS case

### v<sub>2</sub> from Q-cumulants at LHC energy

- Flow fluctuations, σ<sub>v<sub>1</sub></sub> -> a gap between v<sub>2</sub>{2} and higher-order cumulants based v<sub>2</sub>{2k}: v<sub>2</sub>{2}<sup>2</sup> = v<sub>2</sub>{2k}<sup>2</sup> + 2σ<sub>v</sub><sup>2</sup>, for (k>1)
- Syst. uncertainties ~ 2 orders of magnitude greater wrt stat. ones

fine splitting

$$v_2\{4\} \succ v_2\{6\} \succ v_2\{8\} \succ v_2\{10\}$$





## **Standardized & Corrected moments**

$$\gamma_1^{\exp} = -2^{3/2} \frac{v_2 \{4\}^3 - v_2 \{6\}^3}{\left[v_2 \{2\}^2 - v_2 \{4\}^2\right]^{3/2}} \approx -2^{3/2} \frac{-s_{30} - O_N}{\left[2\sigma_x^2 + O_D\right]^{3/2}} \approx \frac{s_{30}}{\sigma_x^3} \equiv \gamma_1$$

$$\gamma_{2}^{\exp} = -\frac{3}{2} \frac{v_{2} \{4\}^{4} - 12v_{2} \{6\}^{4} + 11v_{2} \{8\}^{4}}{\left[v_{2} \{2\}^{2} - v_{2} \{4\}^{2}\right]^{2}} \approx \frac{\kappa_{40}}{\sigma_{x}^{4}} \equiv \gamma_{2}$$
 Kurtosis

$$\gamma_{3}^{\exp} = 6\sqrt{2} \frac{3v_{2}\{6\}^{5} - 22v_{2}\{8\}^{5} + 19v_{2}\{10\}^{5}}{\left[v_{2}\{2\}^{2} - v_{2}\{4\}^{2}\right]^{5/2}} \approx \frac{p_{50}}{\sigma_{x}^{5}} \equiv \gamma_{3}$$
 Superskewness

Conditions:  $s_{12} \approx \frac{s_{30}}{3}$   $\kappa_{22} \approx \frac{\kappa_{40}}{3}$   $p_{32} \approx p_{14} \approx \frac{p_{50}}{5}$  Ell. pow. distr. param.  $\varepsilon_0 \le 0.15$  $\gamma_{1,corr}^{\exp} = -2^{3/2} \frac{187v_2 \{8\}^3 - 16v_2 \{6\}^3 - 171v_2 \{10\}^3}{\left[v_2 \{2\}^2 - 40v_2 \{6\}^2 + 495v_2 \{8\}^2 - 456v_2 \{10\}^2\right]^{3/2}}$ 

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Important for the initial-stats → Important for a proper hydro description

## v<sub>2</sub>{2k} from Q-cumulants - NICA

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.5 GeV
- In 10 centrality classes
- PID: p,  $\pi^+$ ,  $\pi^-$ , p<sub>T</sub> > 300 MeV/c
- AuAu, 11.5 GeV, vHLLE+UrQMD v<sub>2</sub>{2k} are well measured in semicentral collisions As hydro model,  $v_2$ {2k} 0.06 should be well enough ordered. Statistics is about 60 times 0.05 smaller wrt CMS data. **⟨YZ⟩**<sup>0.04</sup> ∧ 0.03 With real data (1 B MB)  $v_2$ {2k} could be well measured With the current statistics, v<sub>2</sub>{2} the condition v<sub>2</sub>{4} 0.02 v\_{6} v\_{8}  $v_2{4} > v_2{6} > v_2{8} > v_2{10}$ v<sub>2</sub>{10} v\_{12} v\_{14} 0.01 is not satisfied in any bin. So, hydro probes and central moments cannot be measured 50 60 20 30 40 70 80 90 100 10 Centrality (%)

- Minimum bias
- stat.: 34 M events

#### v<sub>n</sub>{10} from Q-cumulants

**10-th order Q-cumulant**  $\langle \langle 10 \rangle \rangle = \langle \langle e^{in(\phi_1 + \phi_2 + \phi_3 + \phi_4 + \phi_5 - \phi_6 - \phi_7 - \phi_8 - \phi_9 - \phi_{10})} \rangle \rangle$   $c_n \{10\} = \langle \langle 10 \rangle \rangle - 25 \cdot \langle \langle 2 \rangle \rangle \langle \langle 8 \rangle \rangle - 100 \cdot \langle \langle 4 \rangle \rangle \langle \langle 6 \rangle \rangle$   $+400 \cdot \langle \langle 6 \rangle \rangle \langle \langle 2 \rangle \rangle^2 + 900 \cdot \langle \langle 2 \rangle \rangle \langle \langle 4 \rangle \rangle^2$   $-360 \cdot \langle \langle 4 \rangle \rangle \langle \langle 2 \rangle \rangle^3 + 2880 \cdot \langle \langle 2 \rangle \rangle^5$ **• For the first time v\_n{10}**  $v_n \{10\} = \sqrt[10]{\frac{1}{456}} c_n \{10\}$ 

Statistical uncertainties of the  $v_n$ {2k} (k=1,...,5) cumulants are calculated analytically using the data [Phys. Rev. C 104 (2021) 034906 arXiv:2104.00588 [nucl-th]]

 $s^{2}[v_{n} \{10\}] \cdot 4560^{2}(v_{n} \{10\})^{18} = A^{2}\sigma_{\langle\langle2\rangle\rangle}^{2} + B^{2}\sigma_{\langle\langle4\rangle\rangle}^{2} \qquad A = 14400 \langle\langle2\rangle\rangle^{4} - 10800 \langle\langle2\rangle\rangle^{2} \langle\langle4\rangle\rangle$  $+ C^{2}\sigma_{\langle\langle6\rangle\rangle}^{2} + D^{2}\sigma_{\langle\langle8\rangle\rangle}^{2} + \sigma_{\langle\langle10\rangle\rangle}^{2} + 2AB\sigma_{\langle\langle2\rangle\rangle,\langle\langle4\rangle\rangle}$  $+ 2AC\sigma_{\langle\langle2\rangle\rangle,\langle\langle6\rangle\rangle} + 2AD\sigma_{\langle\langle2\rangle\rangle,\langle\langle8\rangle\rangle} + 2A\sigma_{\langle\langle2\rangle\rangle,\langle\langle10\rangle\rangle}$  $+ 2BC\sigma_{\langle\langle4\rangle\rangle,\langle\langle6\rangle\rangle} + 2BD\sigma_{\langle\langle4\rangle\rangle,\langle\langle8\rangle\rangle} + 2B\sigma_{\langle\langle4\rangle\rangle,\langle\langle10\rangle\rangle}$  $+ 2CD\sigma_{\langle\langle6\rangle\rangle,\langle\langle8\rangle\rangle} + 2C\sigma_{\langle\langle6\rangle\rangle,\langle\langle10\rangle\rangle} + 2D\sigma_{\langle\langle8\rangle\rangle,\langle\langle10\rangle\rangle}$  $C = 400 \langle\langle2\rangle\rangle^{2} - 100 \langle\langle4\rangle\rangle$  $D = -25 \langle\langle2\rangle\rangle$ 

#### Ratio between probe and its Taylor expansion



#### Ratio between the new probe and its Taylor expansion



## $v_2{2k}/v_2{2}$

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV
  In 10 multiplicity classes from 100 up to 1200
  - PID: p, π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, p<sub>T</sub> > 200 MeV/c
- 0.0 < b < 12.0 fm, stat.: 1.068 B events



#### AuAu, 11 GeV, JAM

### $v_2{2k}/v_2{4}$

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV In 10 multiplicity classes from 100 up to 1200
- PID: p,  $\pi^+$ ,  $\pi^-$ ,  $|\eta| < 1.5$ ,  $p_T > 200$  MeV/c 0.0 < b < 12.0 fm, stat.: 1.068 B events

AuAu, 11 GeV, JAM



### $v_2{2k}/v_2{6}$

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV In 10 multiplicity classes from 100 up to 1200
- PID: p, π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, p<sub>T</sub> > 200 MeV/c
   0.0 < b</li>

• 0.0 < b < 12.0 fm, stat.: 1.068 B events

AuAu, 11 GeV, JAM



## $v_{2}{2k}/v_{2}{8}$

- ♦ AuAu collisions at  $\sqrt{s_{NN}}$  = 11.0 GeV In 10 multiplicity classes from 100 up to 1200
  - PID: p, π<sup>+</sup>, π<sup>-</sup>, |η| < 1.5, p<sub>T</sub> > 200 MeV/c
- 0.0 < b < 12.0 fm, stat.: 1.068 B events •



#### AuAu, 11 GeV, JAM

- 400-800 is still visible:  $v_2{8} > v_2{10}$ It seems that the
- splitting from JAM becomes more and more fine with an increase of k, which is correct.
  - Anyhow, we could expect splitting in the experimental MPD NICA data