

ACAT 2017

21-25 August 2017

**W** UNIVERSITY of , Seattle  
WASHINGTON



# Modeling of modifications induced by jets in the relativistic bulk nuclear matter

**Marcin Słodkowski<sup>(1)</sup>**, **Patryk Marcinkowski<sup>(1)</sup>**

**Patryk Gawryszewski<sup>(1)</sup>**, **Daniel Kikoła<sup>(1)</sup>**,

**Joanna Porter-Sobieraj<sup>(2)</sup>**

<sup>(1)</sup> Faculty of Physics, Warsaw University of Technology (PL)

<sup>(2)</sup> Faculty of Mathematics and Information Science, Warsaw University of Technology (PL)

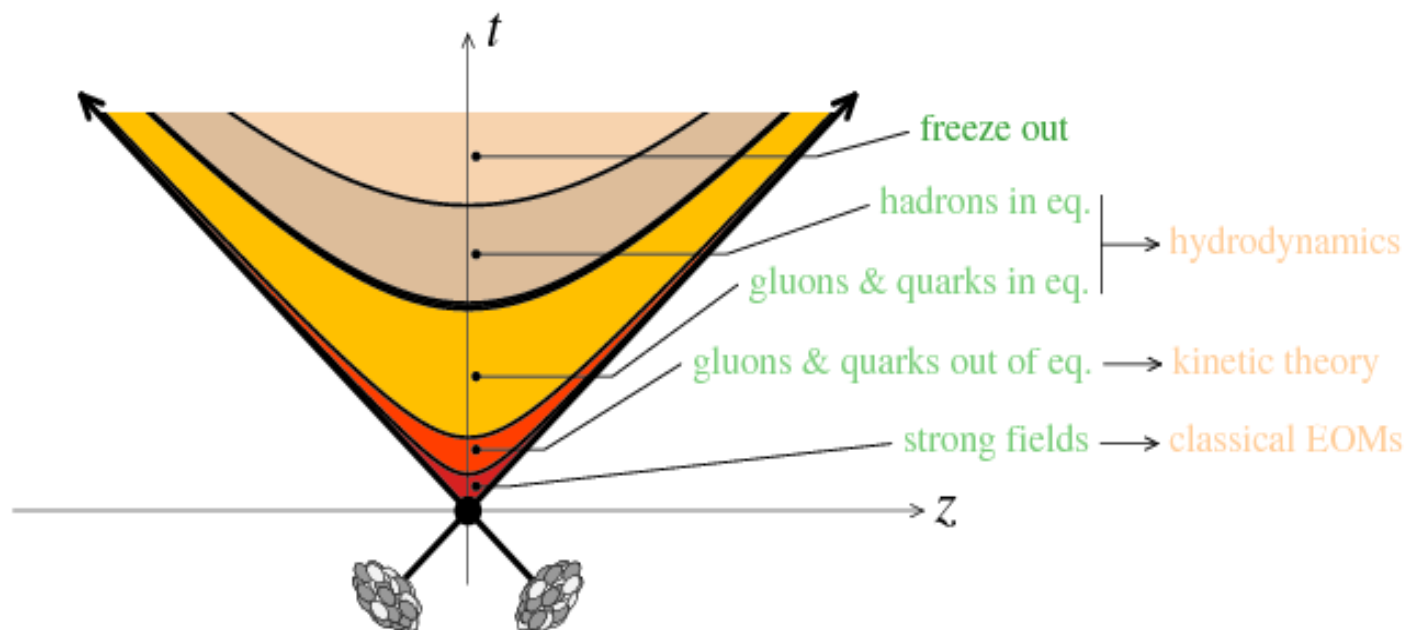
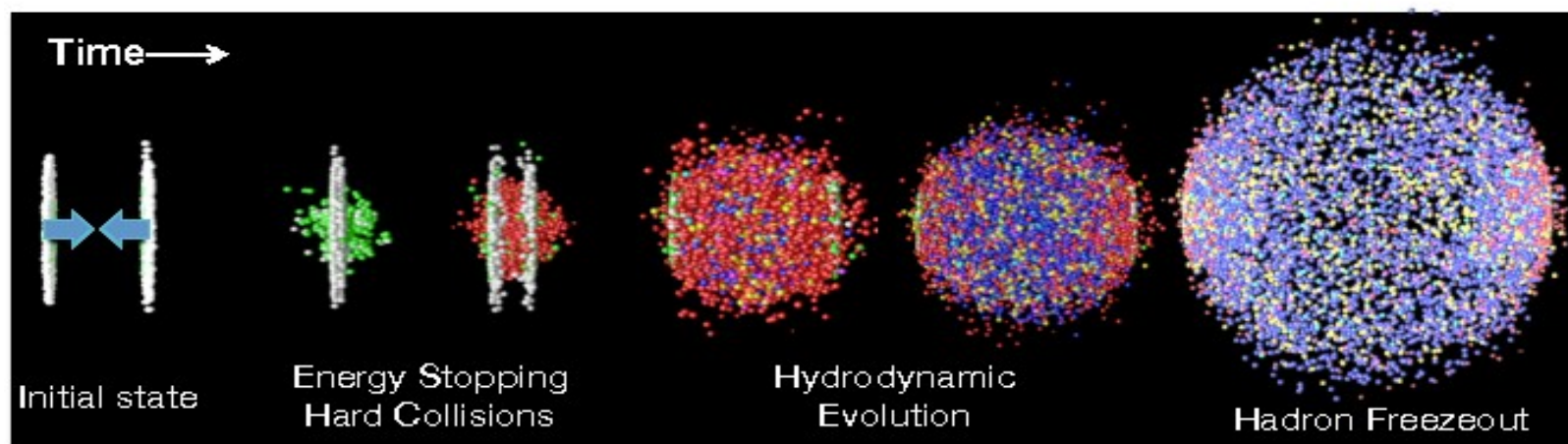
# Agenda



- Introduction
- Questions to address/study
  - Jet-medium interactions and jet-induced flow
  - Event-by-event flow and flow fluctuations
- Our (3+1) hydrodynamic code approach
- Graphics Cards (GPU) implementation
- Simulation results

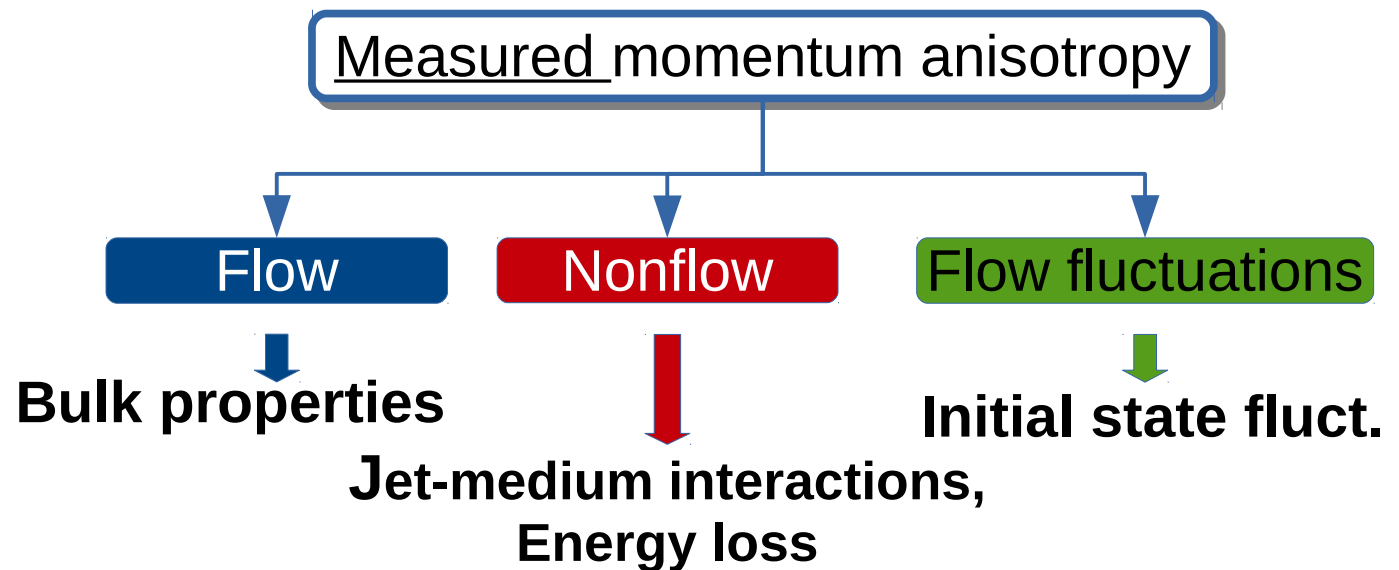
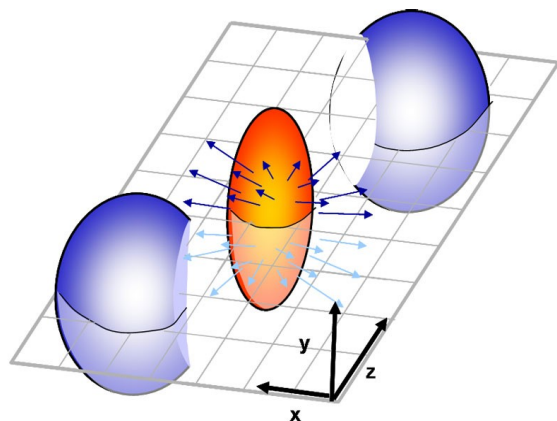


# Introduction – heavy ion collision



# Anisotropic Flow and Nonflow

- Questions to address/study:
  - Jet-medium interactions and jet-induced flow
  - Event-by-event flow and flow fluctuations



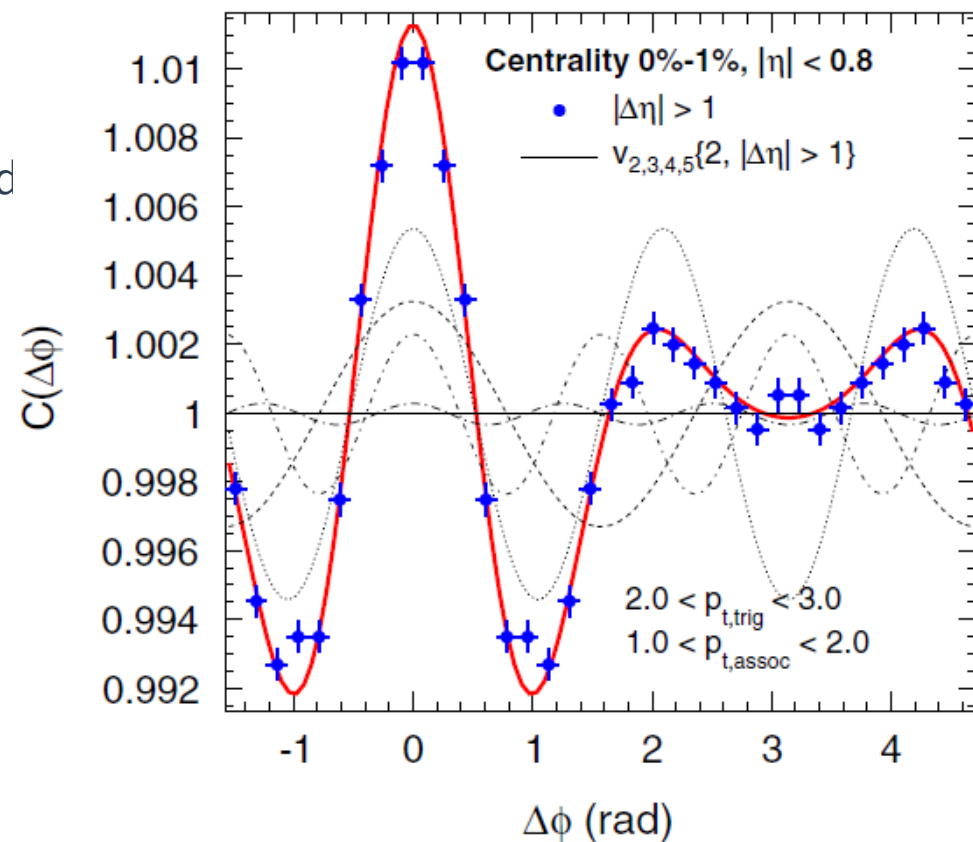
# Questions to address/study

- Collective behaviours
- Study of high resolution of jets dynamics 😊
- Event-by-event flow and flow fluctuations fast enough for good statistic 😊
- Sophisticated implementation 😡
- A lot of computer power (large amount of data grid) 😞
- Single thread simulation on CPU takes ~ a few days 😞
- Our multi thread simulation on GPU takes ~ a few minutes 😄



# Jet-medium interactions and jet-induced flow

- ALICE and ATLAS claim:
  - “double peak structure on away side in triggered two-particle correlations can be naturally explained by sum of measured anisotropic flow Fourier coefficients” → **everything is flow**
  - Is this really hydro-like flow (pressure driven expansion) ?
  - Or this structure is due to jet-medium interactions which show up in two-particle flow measurement?
- We could use 3+1 hydro code + jet energy loss algorithm to address this question



Alice, Phys. Rev. Lett. 107,  
032301 (2011)

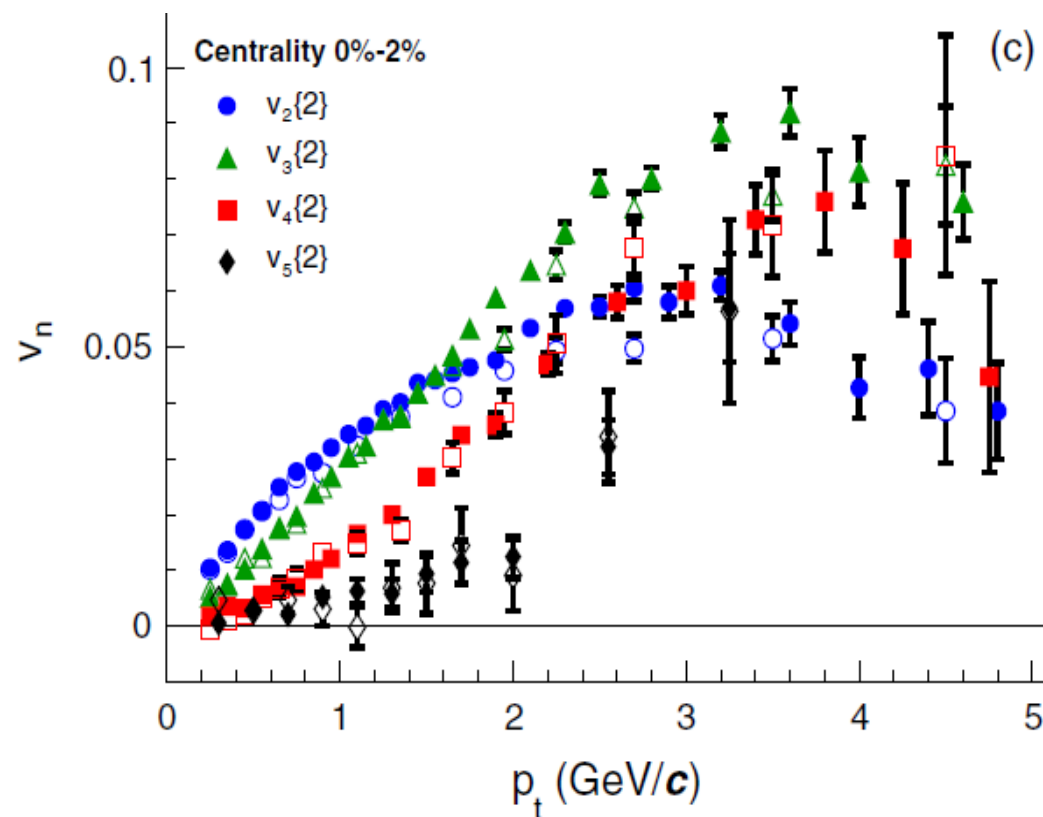




# Event-by-event flow and flow fluctuations

- Hot topic: higher harmonic anisotropic flow
- Odd flow harmonics ( $v_3$ ,  $v_5$  ...) generated only due to fluctuations
- Fast and efficient hydro code is needed to study event-by-event fluctuations and flow\*

→ GPU may help



Alice, Phys. Rev. Lett. 107, 032301 (2011)

(\*) This can be (approximately) studied using averaged fluctuations, but full event-by-event simulations give more flexibility



# Our hydrodynamic program sequence

- **Simulation stages:**
  - generating initial conditions
  - solving differential equations
  - check for freeze-out condition
  - computing freeze-out surface and particle emission functions





# Hiperbolic conservation laws

$$\begin{aligned}\partial_t E + \nabla \cdot [(E + p) \vec{v}] &= 0 \\ \partial_t \vec{M} + \nabla \cdot [\vec{M} \vec{v} + p \hat{I}] &= 0 \\ \partial_t R + \nabla \cdot [R \vec{v}] &= 0\end{aligned}$$

Lab frame variables: **E, M, R, v**

Fluid element frame variables: **e, p, n**.

$$\begin{aligned}E &= (e + p)\gamma^2 - p \\ \vec{M} &= (e + p)\gamma^2 \vec{v} \\ R &= n\gamma\end{aligned}$$

**R** - net charge density in calculational frame (laboratory frame),  
**E** - energy density in calculational frame,  
**M** - momentum density in calculational frame,  
- energy density in the local rest frame of fluid  
**p** - pressure in the local rest frame of fluid  
**n** - charge density in the local rest frame of fluid

transformation from the calculational frame to the local rest frame of the fluid

$$\begin{aligned}e &= E - Mv, \\ n &= R\sqrt{1 - v^2}.\end{aligned}$$

$$v = \frac{M}{E + p(E - Mv, R\sqrt{1 - v^2})}$$



# Equation system for the Riemann problem

$$\frac{\partial U}{\partial t} + \frac{\partial F(U)}{\partial x} + \frac{\partial G(U)}{\partial y} + \frac{\partial H(U)}{\partial z} = 0$$

where  $\mathbf{U} = (E, M_x, M_y, M_z, R)$  is a vector of conserved quantities in the laboratory rest frame

$$F(U) = \begin{bmatrix} (E+p)v_x \\ M_x v_x + p \\ M_y v_x \\ M_z v_x \\ R v_x \end{bmatrix} \quad G(U) = \begin{bmatrix} (E+p)v_y \\ M_x v_y \\ M_y v_y + p \\ M_z v_y \\ R v_y \end{bmatrix} \quad H(U) = \begin{bmatrix} (E+p)v_z \\ M_x v_z \\ M_y v_z \\ M_z v_z + p \\ R v_z \end{bmatrix}$$

$F, G, H$  are vectors of fluxes of those quantities in the  $x, y, z$  directions

$$U_{i,j,k}^{n+1} = U_{i,j,k}^n + \frac{\Delta t}{\Delta x} \left( F_{i-\frac{1}{2},j,k} - F_{i+\frac{1}{2},j,k} \right) + \frac{\Delta t}{\Delta y} \left( G_{i,j-\frac{1}{2},k} - G_{i,j+\frac{1}{2},k} \right) + \frac{\Delta t}{\Delta z} \left( H_{i,j,k-\frac{1}{2}} - H_{i,j,k+\frac{1}{2}} \right)$$

**Numerical Scheme for a three-dimensional problem**



# WENO algorithm

- **Weighted Essentially Non-Oscillatory scheme**
    - high order in space
    - weighing reconstruction candidates (vertices):
    - in high gradient regions the oscillations are cut down
    - in monotonic field region algorithm is of highest order possible
    - in some cases may be more dissipative than classical reconstruction methods
    - two types: 5th and 7th order
- generally very **good performance**



# Hydrodynamics with sources

- Our goal: study of jet-QGP interactions (parton propagating through plasma)
- Source term form is of vital importance

$$\partial_\mu T^{\mu\nu}(x) = J^\nu(x).$$

$$T^{\mu\nu} = (e + P)u^\mu u^\nu - Pg^{\mu\nu},$$

$$\mathbf{w}_t + \mathbf{f}(\mathbf{w})_x = \mathbf{s}(\mathbf{w}, x),$$

$$\mathbf{w}_i^{n+1} = \mathbf{w}_i^n - \lambda \left( \hat{\mathbf{f}}_{i+\frac{1}{2}} - \hat{\mathbf{f}}_{i-\frac{1}{2}} \right) + \Delta t \mathbf{s}(\mathbf{w}_i^n, x_i)$$

$$-\frac{dp_a^0}{dt} = A \times \frac{8}{3} \pi \alpha_s^2 T^2 \left( 1 + \frac{1}{6} n_f \right) \log \frac{\sqrt{4T} p_a^0}{m_D}.$$

arXiv:1402.6469v2 [nucl-th]



# QGP – jet interaction

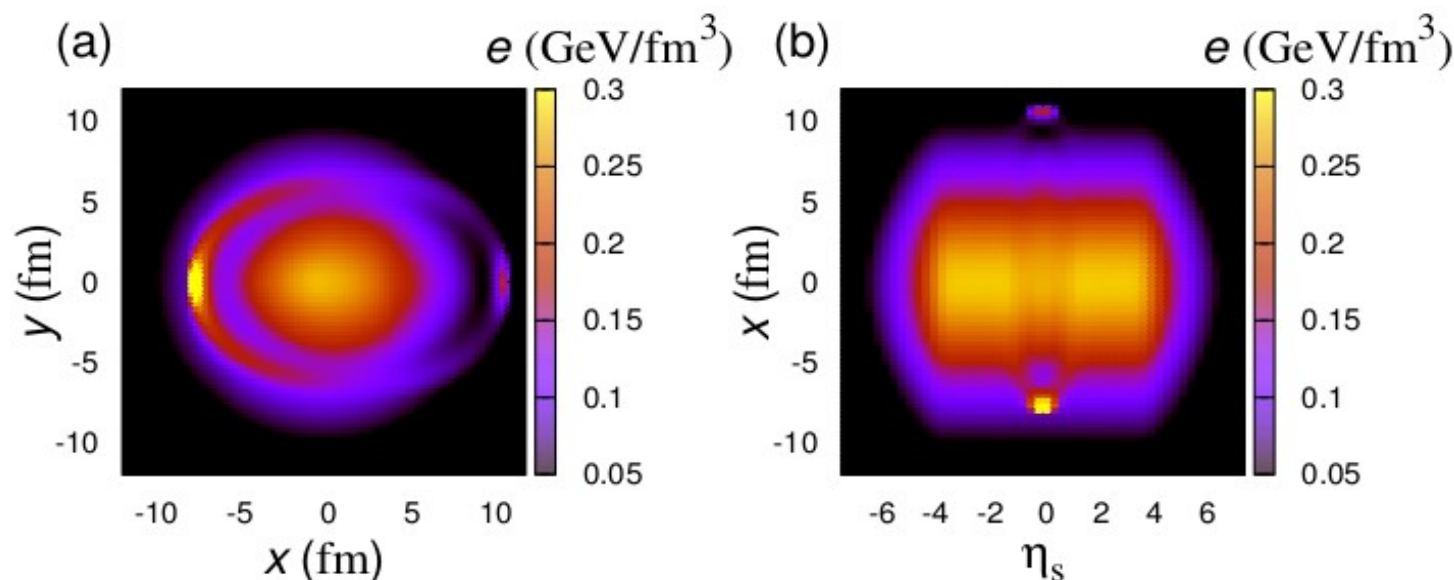


FIG. 1: (Color online) Energy density distribution of the expanding QGP fluid at  $\tau = 9.6 \text{ fm}/c$  (a) in transverse plane at  $\eta_s = 0$  and (b) in reaction plane at  $y = 0$ . A pair of energetic partons is created at  $(\tau = 0, x = 1.5 \text{ fm}, y = 0, \eta_s = 0)$  and travels in the opposite direction along the  $x$ -axis at the speed of light.

arXiv:1402.6469v2 [nucl-th]



# Energy deposition

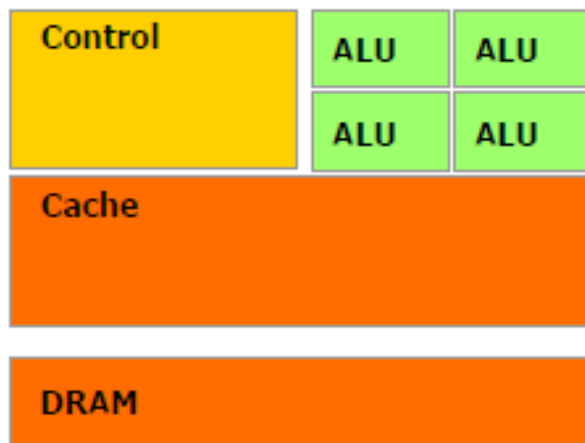
- Term responsible for modeling interactions between the jet and the plasma
- We used:

$$\left(-\frac{dE}{dx}\right) = \kappa_{rad} \frac{C_R}{C_F} T^3 x + \kappa_{coll} \frac{C_R}{C_F} T^2,$$

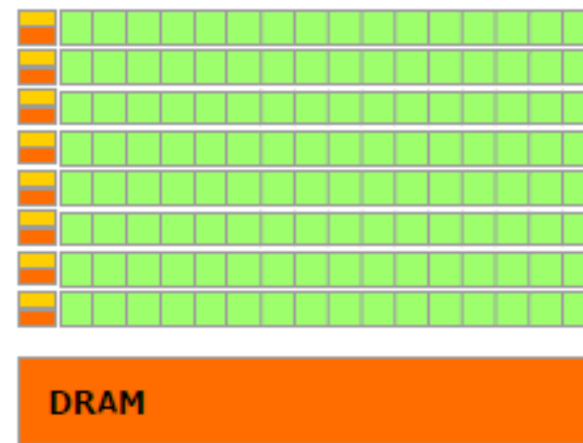
- Two mechanisms of jet energy loss:
  - gluon radiation
  - collisions of partons in dense medium



# CPU vs. GPU architectures



**CPU**



**GPU**

- CPU multiple cores
- GPU thousands of cores
- A lot of resources dedicated to computations
- Parallel streaming multiprocessors
- Limited memory hierarchy



# GPU execution



Serial code

Parallel kernel

Kernel0<<<>>>()



Serial code

Host



Device

Grid 0

Block (0, 0)



Block (1, 0)



Block (2, 0)



Block (0, 1)



Block (1, 1)



Block (2, 1)



Host



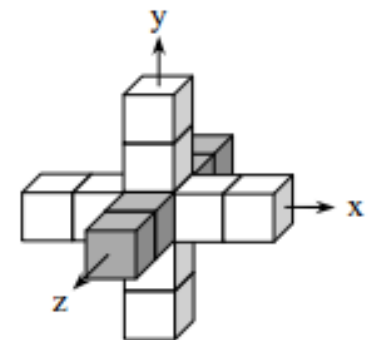
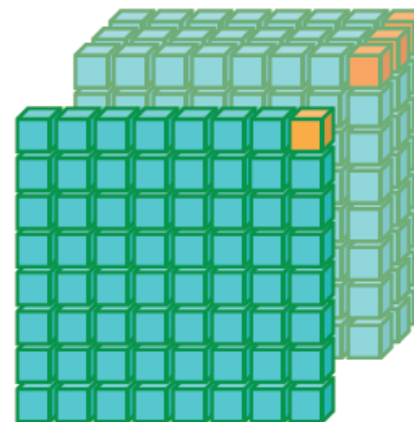
# Hydrodynamics on GPU

- Each thread corresponds to a point in XY plane. The kernel then loops over Z axis, so that each thread calculates points on a line parallel to OZ.

```

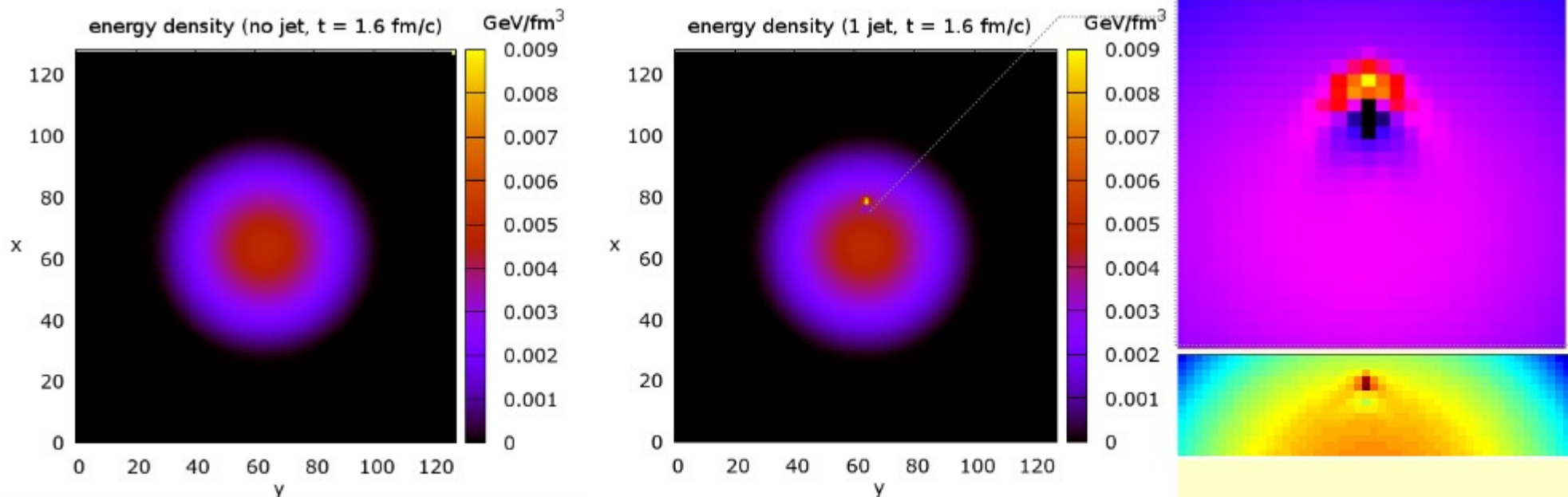
For n in 1..N do
  For k in 3..Z-Dimension - 2 do
    Load neighbor cells from surface
    memory.
    Compute cell U(i,j,k).
    Write result to surface memory.
    Synchronize threads.
  End for
End for

```



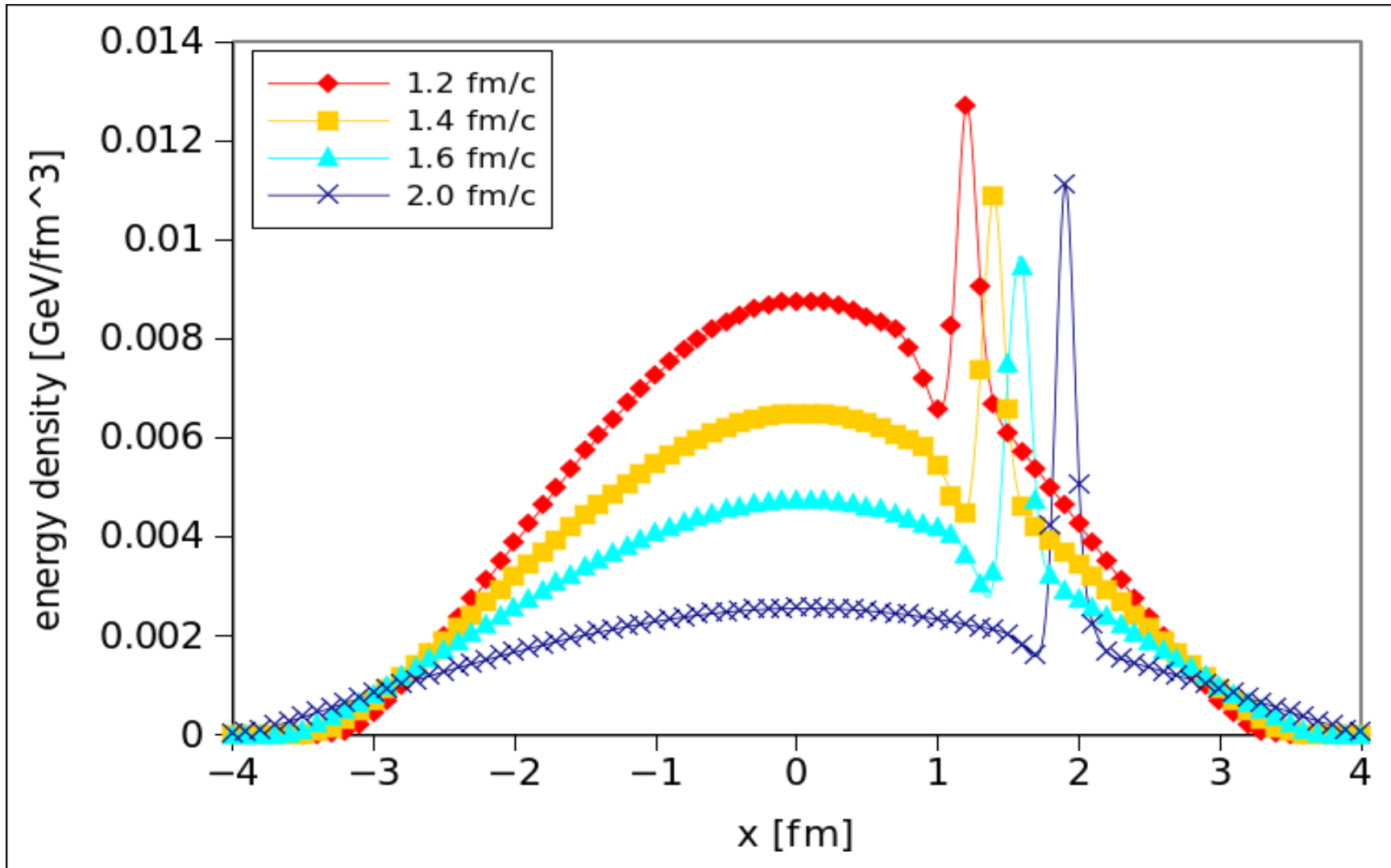
Algorithm is implemented using **surface memory**

# Simulation results



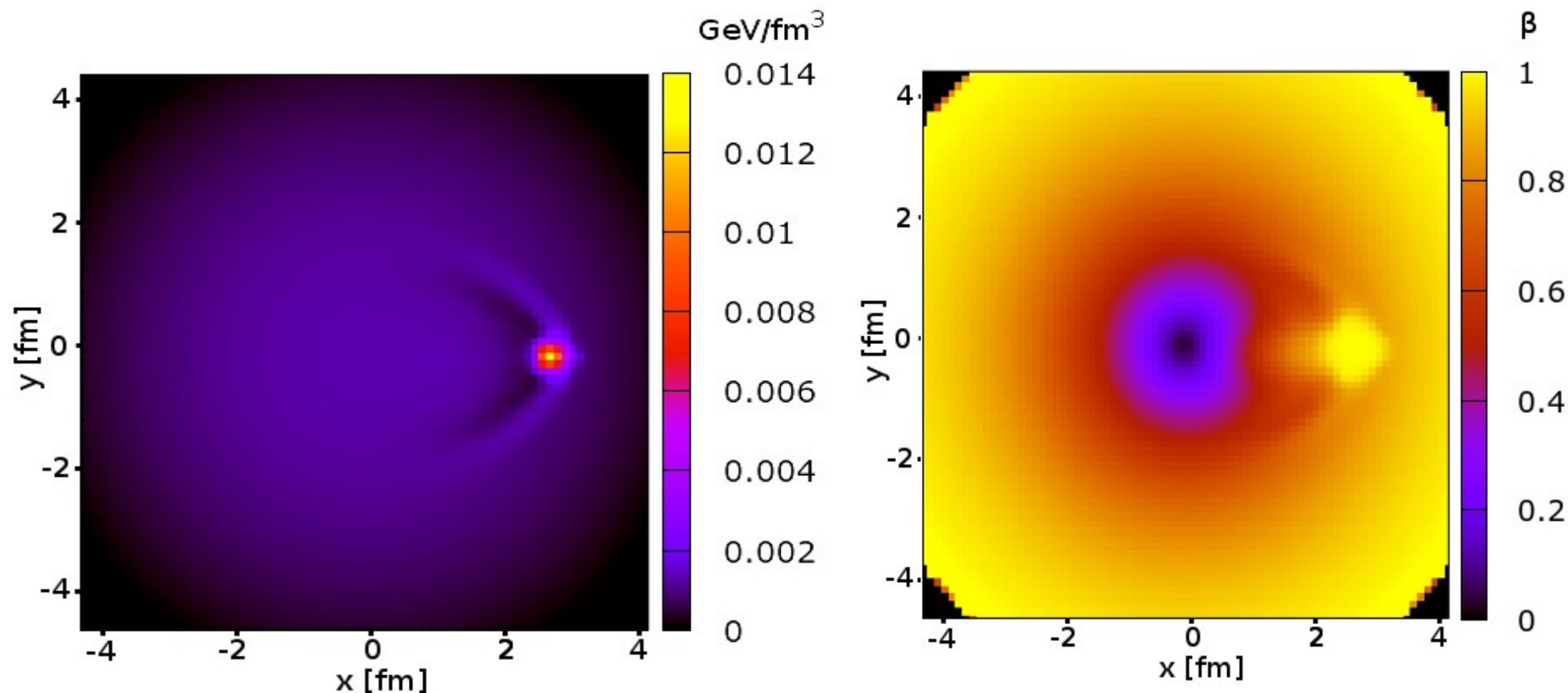
Energy density cross-section at  $z = 0$ . Left: no jet, middle: propagation of jet, right: zoom on the forming Mach cone ( $x, y$  are cell indices)

# Simulation results



# Simulation results – single parton

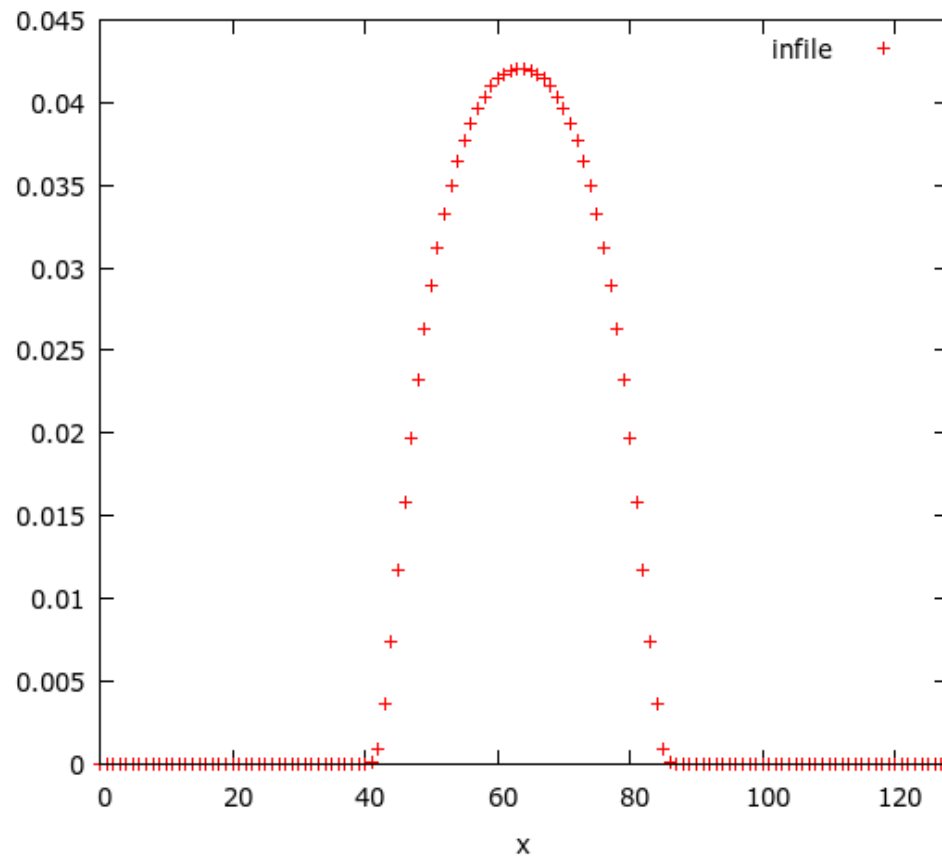
- Energy density and velocity profile (xy plane,  $z=0$ )
  - $dx = 0.1$  fm,  $dt = 0.02$  fm/c, grid:  $256^3$ , EOS  $p = e/3$ ,  $t = 2.4$  fm/c



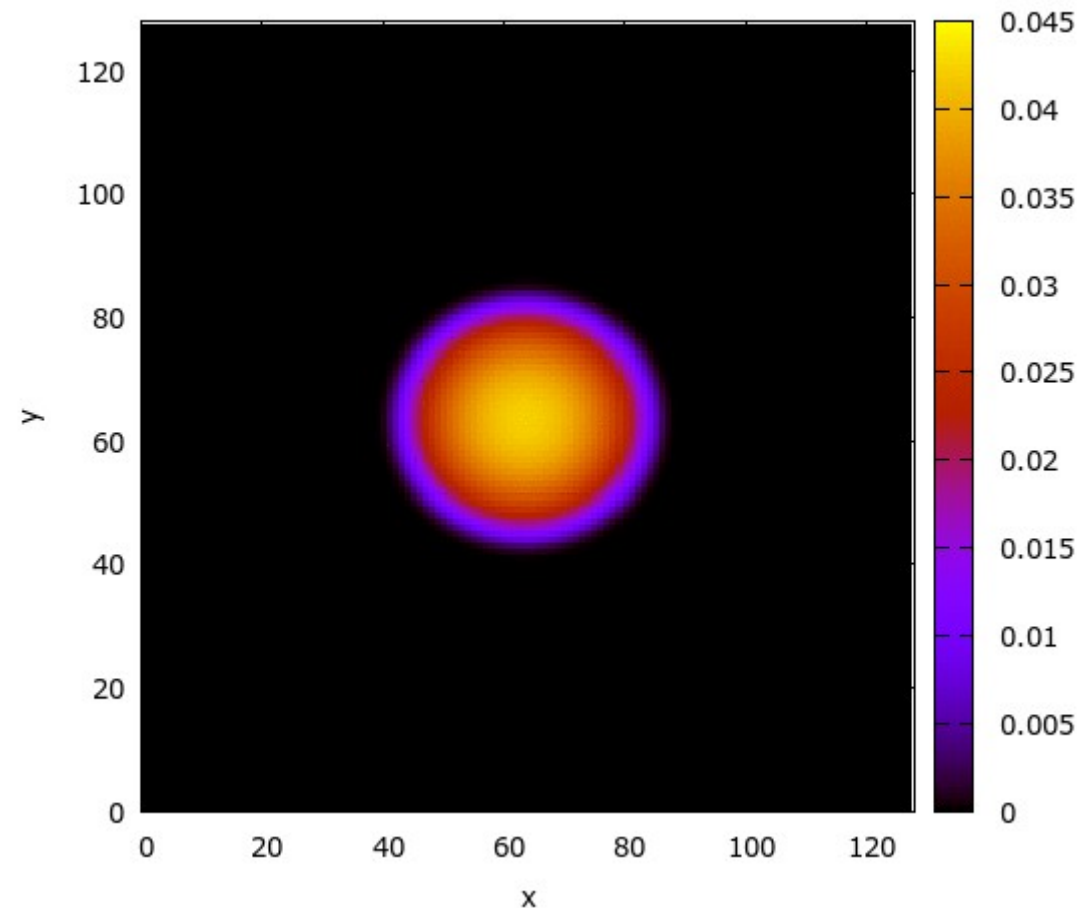
# Simulation results



data<sub>es</sub>ection<sub>x0</sub>.dat

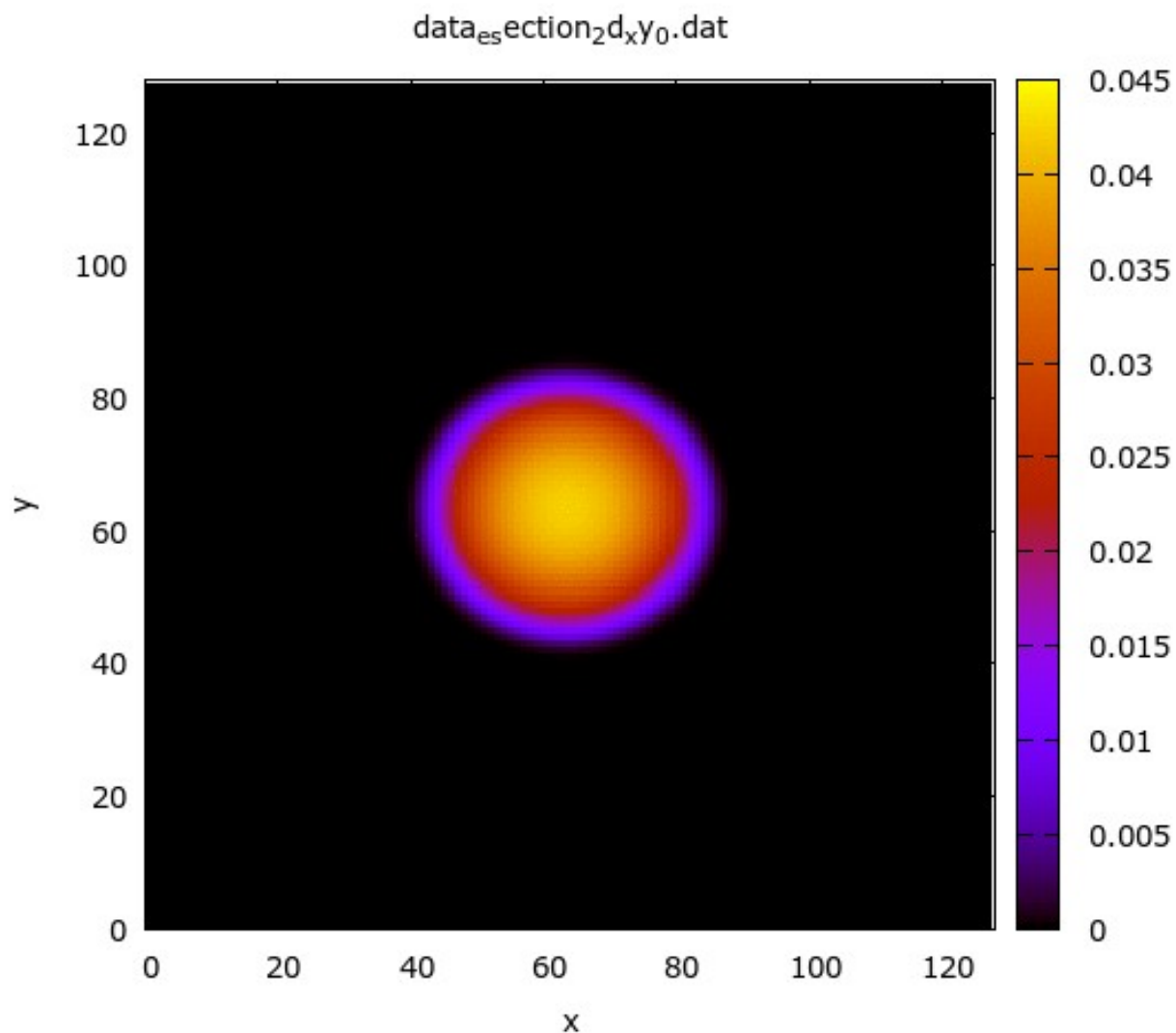


data<sub>es</sub>ection<sub>2d</sub><sub>x</sub>y<sub>0</sub>.dat





# Simulation results – two partons





# Freeze-out

- freeze-out implementation – in progress

- Cooper-Frye formula:

$$E \frac{dN}{dp^3} = \int_{\sigma} d\sigma_{\mu} p^{\mu} f(x, p) \approx \sum_{\sigma} \Delta\sigma_{\mu} p^{\mu} f(x, p)$$

- freezeout conditions: isochronic, isothermal
- momentum distribution on hypersurface
- use existing hadron freeze-out generator
  - THERMINATOR 2



# Summary



- **initial conditions from UrQMD**
  - short simulation ( $\sim 1\text{fm}/c$ )
  - Monte Carlo  $\rightarrow$  energy & momentum density
- **hydrodynamics with sources**
- **algorithms, performance & stability tests**
  - implemented & tested: WENO
- **matching the parametrization (custom class / THERMINATOR2::Lhyquid3d) is ongoing**



**Thank you for your attention**

**additional / backup slides**

# Why GPU?

- **Full simulation on standard CPU:**
  - from few hours to few days (depending on grid size)
- **Computing on clusters (CPU)?**
  - effective but costly
- **Another solution – GPU computing**
  - great speed-up for parallel problems
  - cost effective (lowest price per FLOPS)
  - flexible (scalable)
  - C-based language (easy to learn)

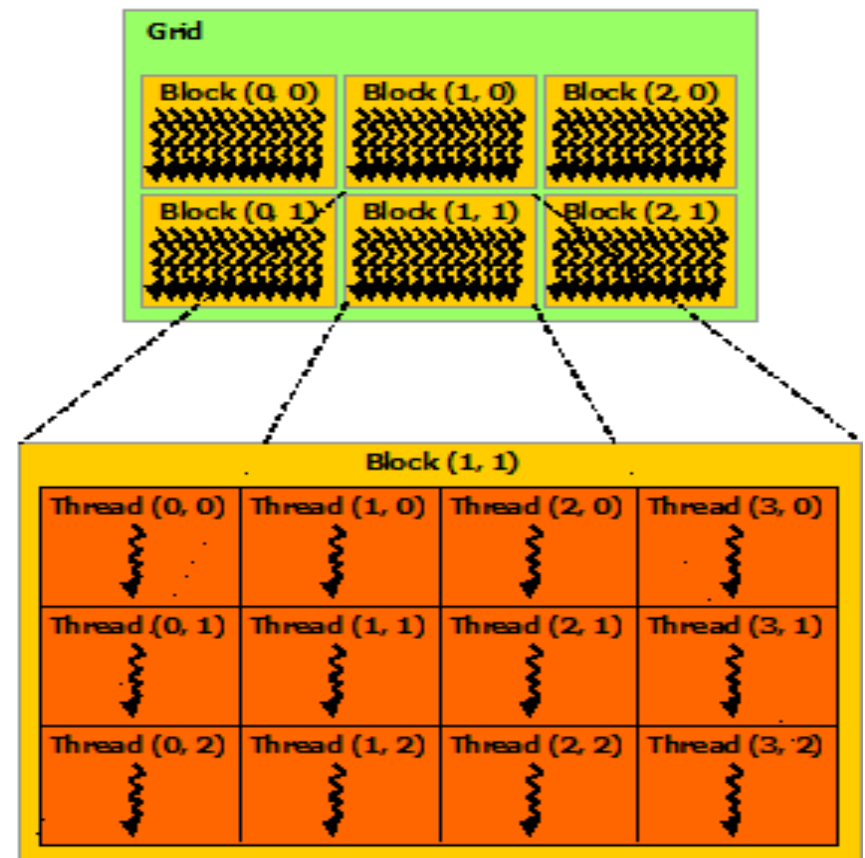
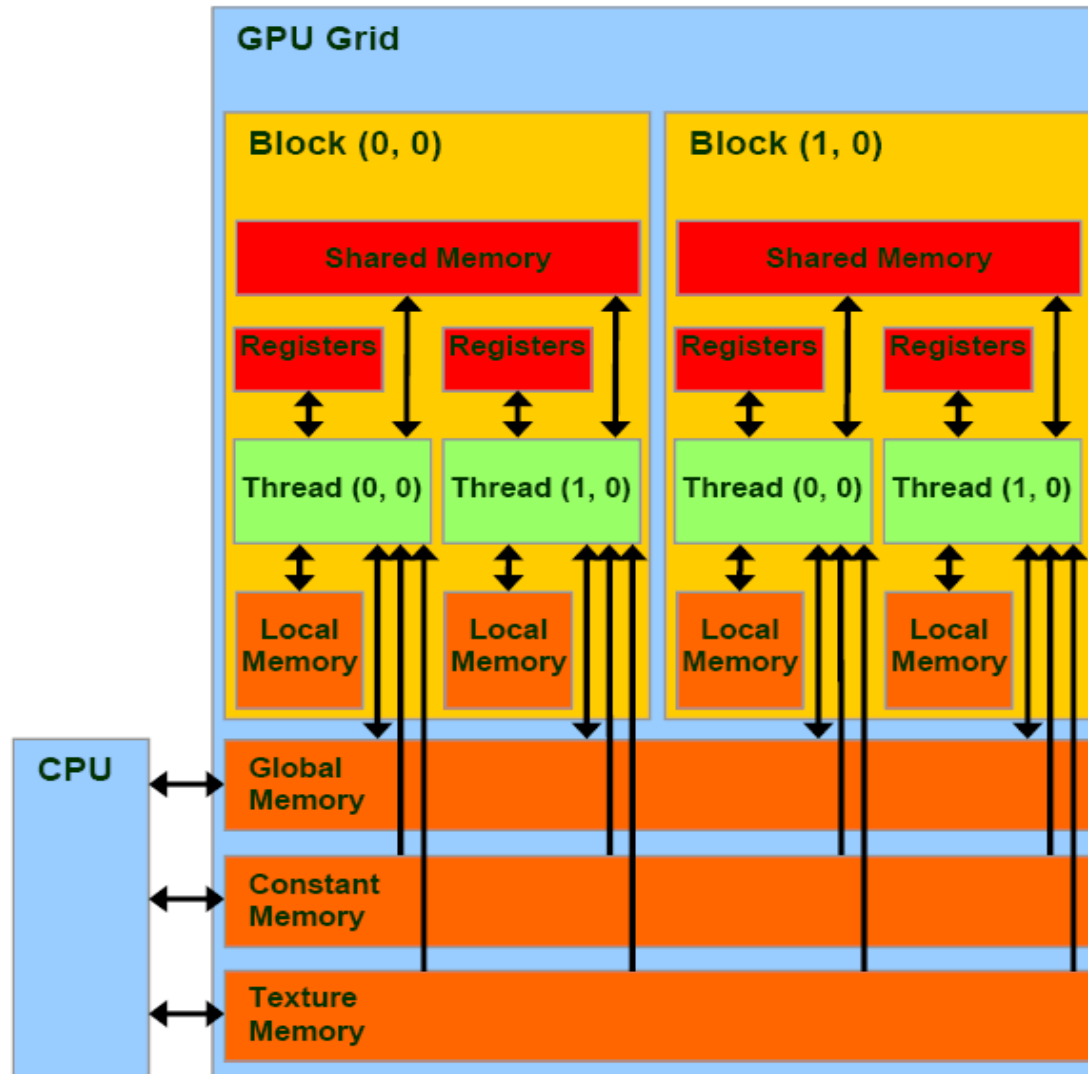


# GPU architecture

- GPU is specialized for compute-intensive, highly parallel computation - exactly what graphics rendering is about - and therefore designed such that more units are devoted to data processing rather than data caching and flow control
- well-suited to address problems that can be expressed as data-parallel computations - the same program is executed on many data elements in parallel - with high arithmetic intensity - the ratio of arithmetic operations to memory operations
- relative speed-up (GPU vs. CPU): up to  $\sim 10^2$

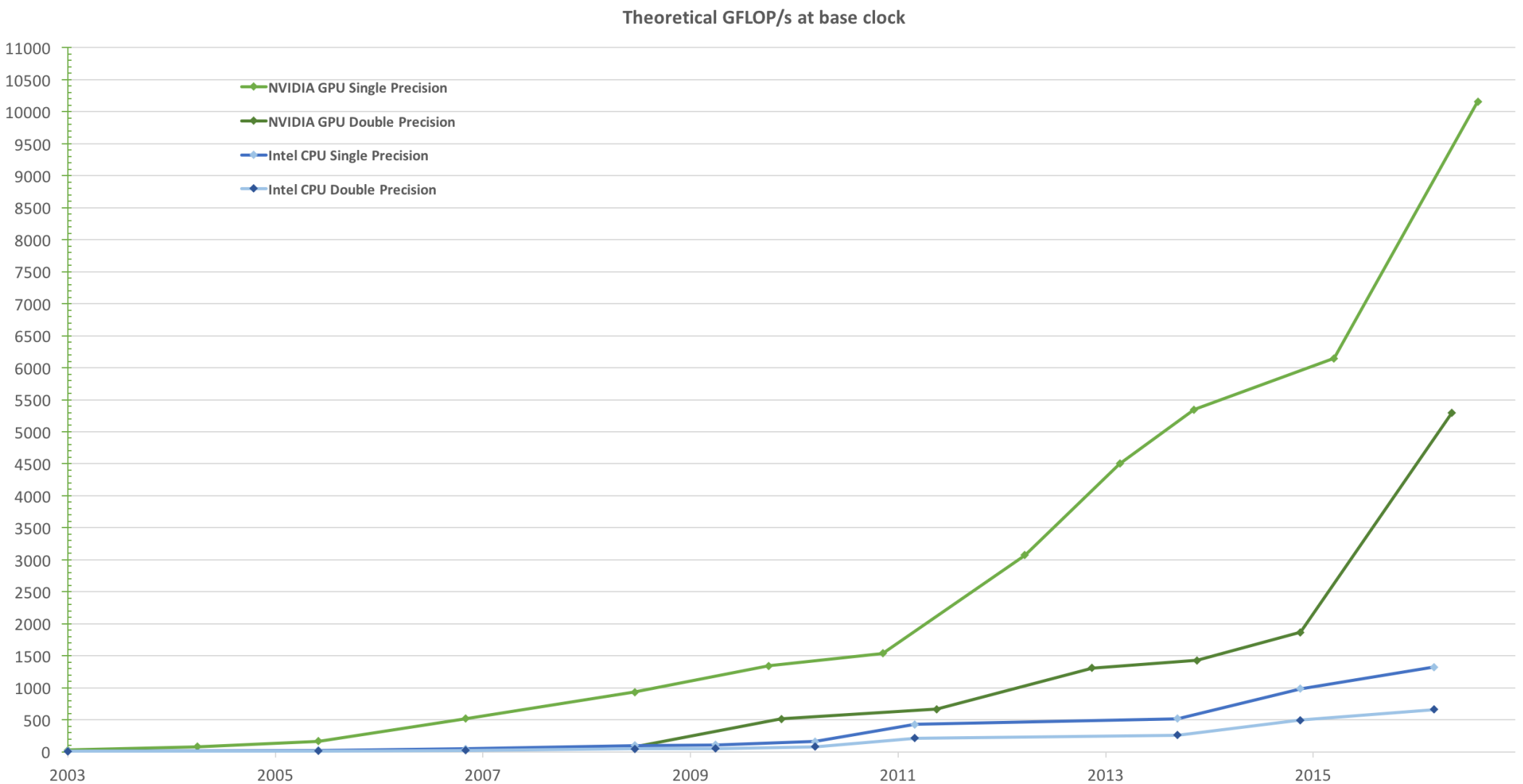


# Memory hierarchy and threads organization





# Comparison of performance tests



# Ellipsoidal flow (initial conditions)

- Collective effect (QGP characteristic)
  - finite system, EOS:  $p=0$
- dimensions:  $120 \times 120 \times 120$  cells
- $\Delta x = 0.1 \text{ fm}$ ,  $\Delta t = 0.02 \text{ fm}/c$
- 150 steps

$$C_e = 2.0 \text{ GeV}/\text{fm}^3$$

$$C_n = 0.75 \text{ GeV}/\text{fm}^3$$

$$T_0 = 2.0$$

$$T_1 = 0.4$$

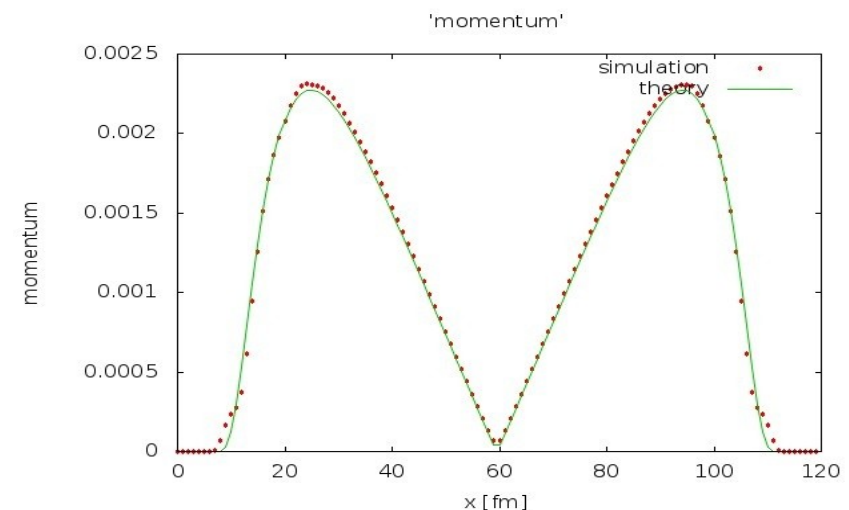
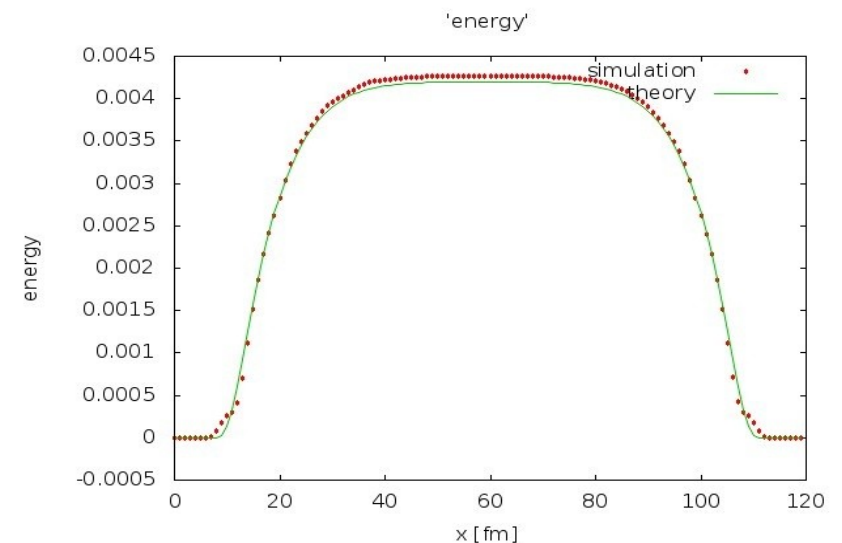
$$T_2 = 0.6$$

$$T_3 = 0.8$$

$$b_e = 1.0$$

$$b_n = 1.0$$

$$p_0 = 0.0$$



# UrQMD model



- Ultra-relativistic Quantum Molecular Dynamics
- Monte Carlo simulation package for nuclear collisions (including early stage interactions and post-freezeout kinematics)



# UrQMD - output



outputfile\_Pb.txt (~/MGR\_HYDRO/initial\_urqmd) - gedit

File Edit View Search Tools Documents Help

outputfile\_Pb.txt

```

UrQMD version: 20030 1000 20030 output_file 14
projectile: (mass, char) 208 82 target: (mass, char) 208 82
transformation betas (NN,lab,pro) 0.0000000 0.9953427 -0.9953427
impact_parameter_real/min/max(fm): 2.00 0.00 2.00 total_cross_section(mbarn): 125.66
equation_of_state: 0 E_lab(GeV/u): 0.2000E+03 sqrt(s)(GeV): 0.1946E+02 p_lab(GeV/u): 0.2009E+03
event# 1 random seed: 12345 (fixed) total_time(fm/c): 1 Delta(t)_0(fm/c): 1.000
op 0 0 0 1 * 0 0 0 0 0 0 0 0 0 0
op 0 0 0 0 0 0 1 0 1 0 0 0 0 2 1
op 0 0 0 1 1 0 0 0 0 0 0 0 0 1 0
pa 0.1000E+01 * 0.5200E+00 0.2000E+01 0.3000E+00 0.0000E+00 0.3700E+00 0.0000E+00 0.9300E-01 0.3500E+00 0.2500E+00 0.0000E+00 0.5000E+00
pa 0.2700E+00 0.4900E+00 0.2700E+00 0.1000E+01 0.1600E+01 0.8500E+00 0.1550E+01 0.0000E+00 0.0000E+00 0.0000E+00 0.0000E+00 0.0000E+00
pa 0.9000E+00 0.5000E+02 0.1000E+01 0.1000E+01 0.1000E+01 0.1500E+01 0.1600E+01 0.0000E+00 0.2500E+01 0.1000E+00 0.3000E+01 0.2750E+00
pa 0.4200E+00 0.1080E+01 0.8000E+00 0.5000E+00 0.0000E+00 0.5500E+00 0.5000E+01 0.8000E+00 0.5000E+00 0.8000E+06 0.1000E+01 0.2000E+01
pvec: r0 rx ry rz p0 px py pz m ityp 2i3 chg lcl# ncl or
0 416 0 0 0 0 0 0 0
0.00000000E+00 0.61099591E+01 -0.28393721E+01 -0.99626092E+00 0.11001949E+02 0.16037956E+00 -0.11840749E+00 0.10962950E+02 0.90380091E+00 1 1 1 0 0 0
0.00000000E+00 -0.18987429E+01 -0.13829171E+01 -0.92541293E+00 0.91657277E+01 -0.17692738E+00 0.40985448E-01 0.91187084E+01 0.90925109E+00 1 1 1 0 0 0
0.00000000E+00 -0.35632387E+01 -0.70830572E+00 -0.70868658E+00 0.11117605E+02 0.16259113E-01 0.90984848E-01 0.11079269E+02 0.91781738E+00 1 1 1 0 0 0
0.00000000E+00 0.22001082E+01 -0.13372307E+01 -0.43907619E+00 0.85340738E+01 0.83976038E-01 -0.36548416E-01 0.84841743E+01 0.91695976E+00 1 1 1 0 0 0
0.00000000E+00 0.10153121E+01 -0.49639108E+01 -0.10555902E+01 0.10943882E+02 -0.19740149E+00 0.18157218E+00 0.10904503E+02 0.88792929E+00 1 1 1 0 0 0
0.00000000E+00 -0.16195766E+01 -0.22302280E+01 -0.45642678E+00 0.97478235E+01 0.12660479E+00 0.19021252E+00 0.97033829E+01 0.90122902E+00 1 1 1 0 0 0
0.00000000E+00 0.36048057E+01 0.14602044E+01 -0.66712296E+00 0.98734190E+01 -0.95380914E-01 -0.11568479E+00 0.98295091E+01 0.91797284E+00 1 1 1 0 0 0
0.00000000E+00 0.13130267E+01 -0.41542281E+01 -0.11685357E+01 0.10670021E+02 0.14764340E+00 -0.86859783E-01 0.10629632E+02 0.91154462E+00 1 1 1 0 0 0
0.00000000E+00 0.17755413E+00 0.16886709E+01 -0.91141529E+00 0.10563075E+02 -0.13306053E+00 0.43823594E-03 0.10522257E+02 0.91812603E+00 1 1 1 0 0 0
0.00000000E+00 0.20394431E+01 -0.50496937E+01 -0.41741951E+00 0.11157691E+02 0.15109330E+00 -0.10005175E+00 0.11119391E+02 0.90574662E+00 1 1 1 0 0 0
0.00000000E+00 0.43501158E+01 -0.40909857E+01 -0.30272108E+00 0.10576221E+02 -0.15597302E+00 -0.13256116E+00 0.10535383E+02 0.90567756E+00 1 1 1 0 0 0
0.00000000E+00 -0.38462671E+01 0.23622512E+01 -0.30779717E+00 0.91244083E+01 0.15020875E+00 -0.68747448E-01 0.90771835E+01 0.91229223E+00 1 1 1 0 0 0
0.00000000E+00 0.18894087E+01 -0.20656848E+01 -0.35189354E+00 0.11635868E+02 -0.11583927E+00 -0.71151498E-01 0.11599673E+02 0.90693167E+00 1 1 1 0 0 0
0.00000000E+00 0.23452131E+01 -0.60361293E+01 -0.10067200E+01 0.91368083E+01 -0.13780045E+00 -0.16949629E+00 0.90897376E+01 0.90012095E+00 1 1 1 0 0 0
0.00000000E+00 -0.32612488E+01 -0.27037071E+01 -0.96017069E+00 0.88883892E+01 -0.10211154E-01 0.15995070E+00 0.88401332E+01 0.91094423E+00 1 1 1 0 0 0
0.00000000E+00 0.19360986E+01 0.24628861E+01 -0.11264016E+01 0.96869259E+01 -0.23650086E+00 0.28956463E-01 0.96422322E+01 0.89839941E+00 1 1 1 0 0 0
0.00000000E+00 -0.91715486E+00 0.46796862E+01 -0.48441300E+00 0.95083602E+01 0.31083883E-01 0.12158875E+00 0.94628038E+01 0.92114450E+00 1 1 1 0 0 0
0.00000000E+00 -0.23249251E+01 -0.67729907E+00 -0.10845515E+01 0.10459035E+02 0.17616040E+00 -0.58439968E-01 0.10417707E+02 0.91013410E+00 1 1 1 0 0 0
0.00000000E+00 0.23551537E+01 0.30623579E+01 -0.51094082E+00 0.87148899E+01 0.12451564E+00 0.54372328E-01 0.86658411E+01 0.91325977E+00 1 1 1 0 0 0
0.00000000E+00 0.42546944E+01 0.20689252E+01 -0.73401790E+00 0.10656352E+02 0.23306757E+00 -0.67608183E-01 0.10615810E+02 0.89640483E+00 1 1 1 0 0 0
0.00000000E+00 0.23238839E+01 -0.31861250E+01 -0.32055131E+00 0.10210140E+02 -0.23121119E-01 0.14493777E+00 0.10167739E+02 0.91788010E+00 1 1 1 0 0 0

```

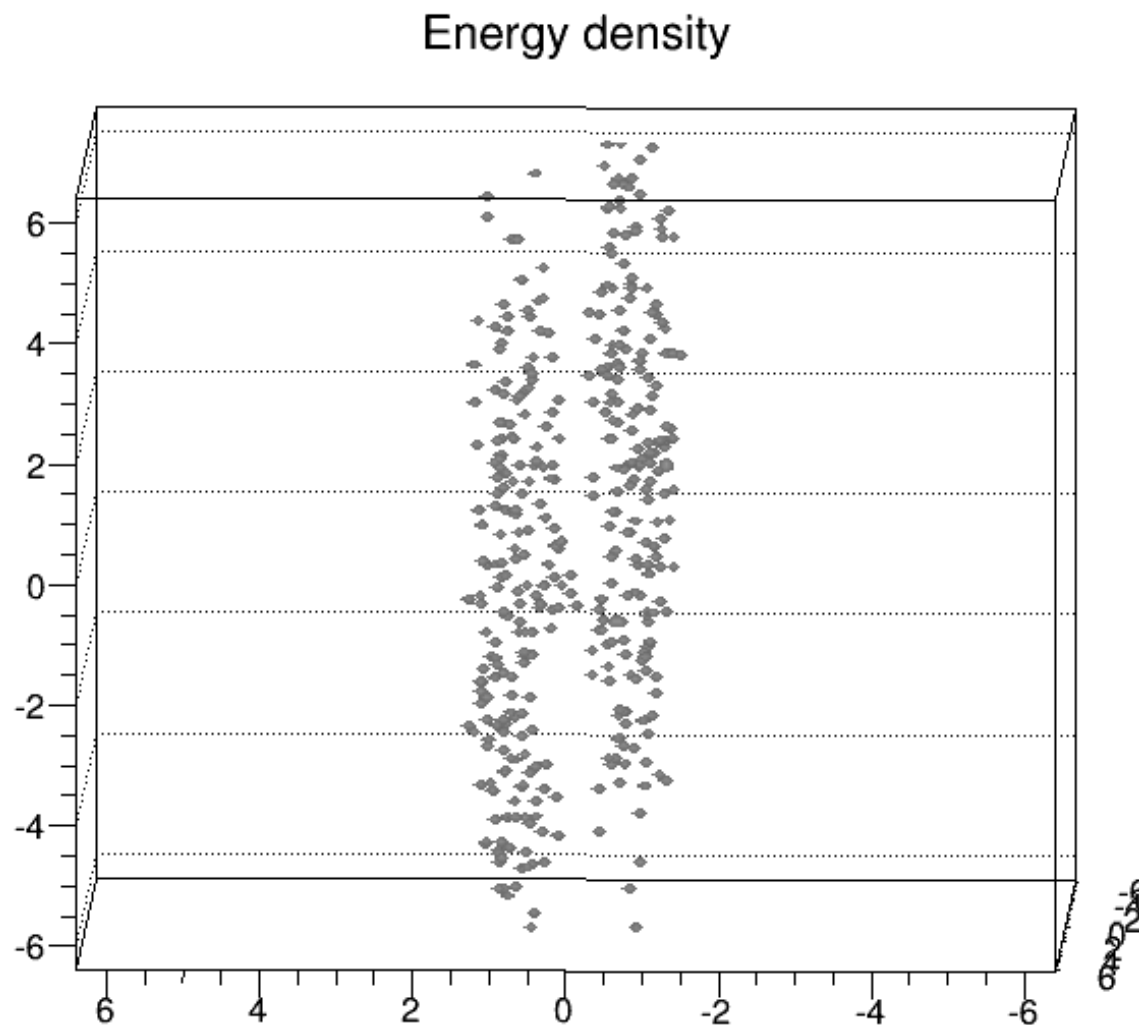


# UrQMD – initial conditions

- Au-Au 200A GeV
- $b = 2 \text{ fm}$
- $t = 1 \text{ fm}/c$

Simulation:

- EOS:  $p = e^2/3$
- $128 \times 128 \times 128$
- $dx = 0.1 \text{ fm}$
- $dt = 0.02 \text{ fm}/c$

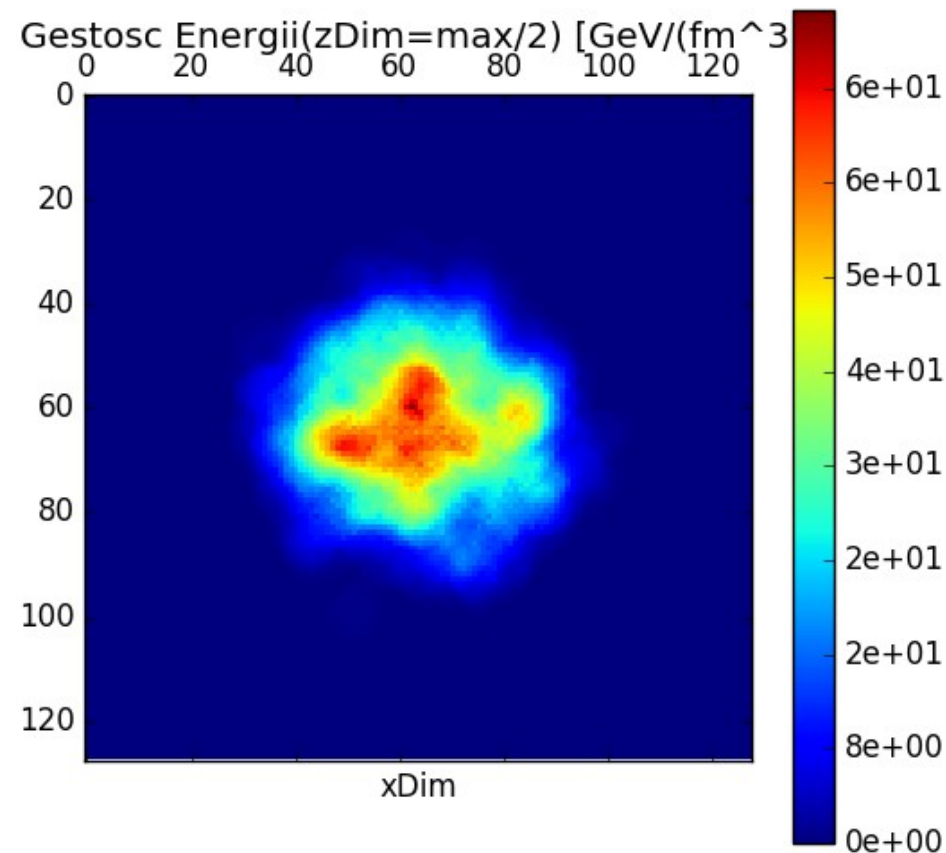
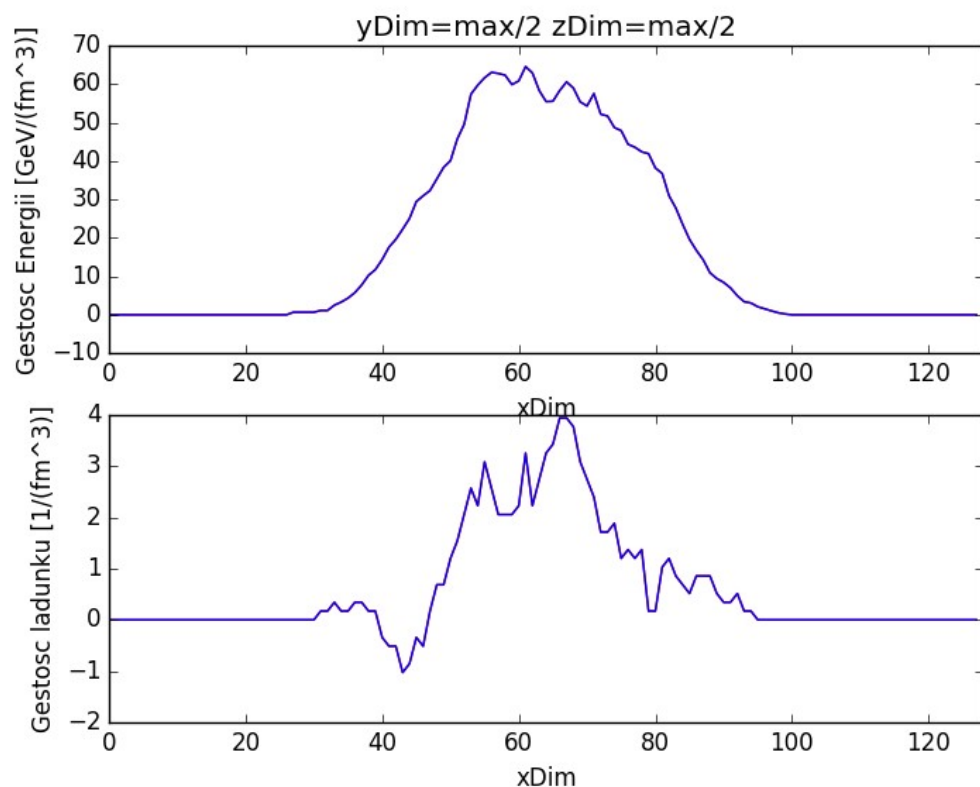




# Simulation: energy density (I)

Initial conditions for averaging 10 UrQMD events

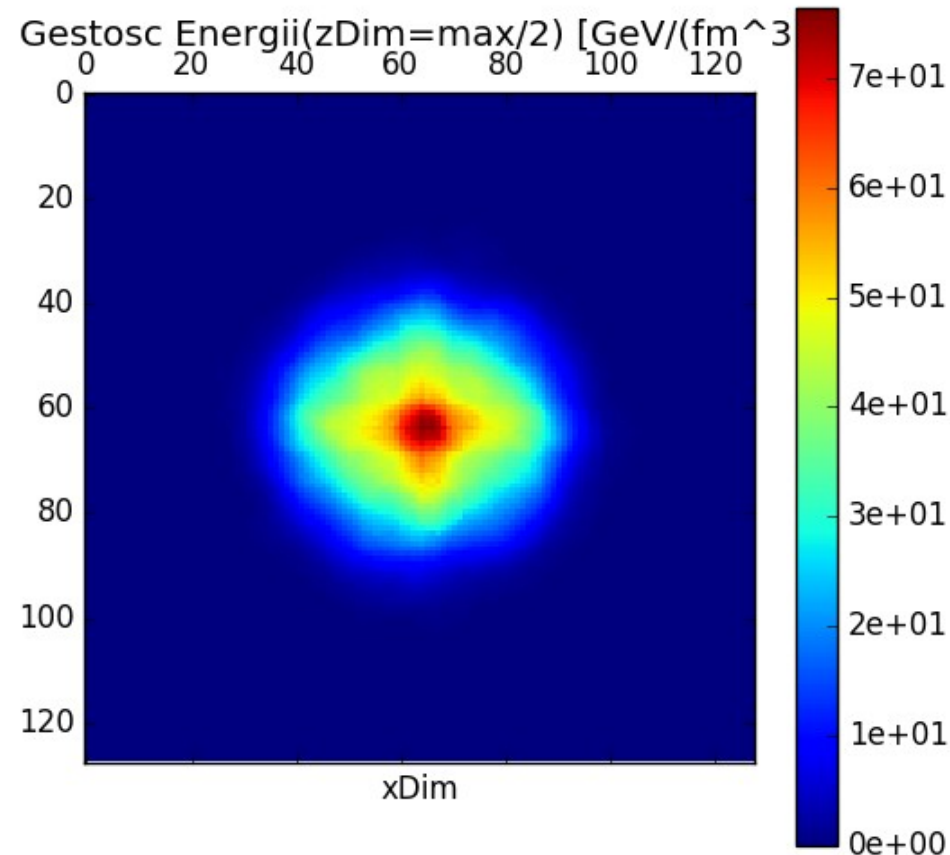
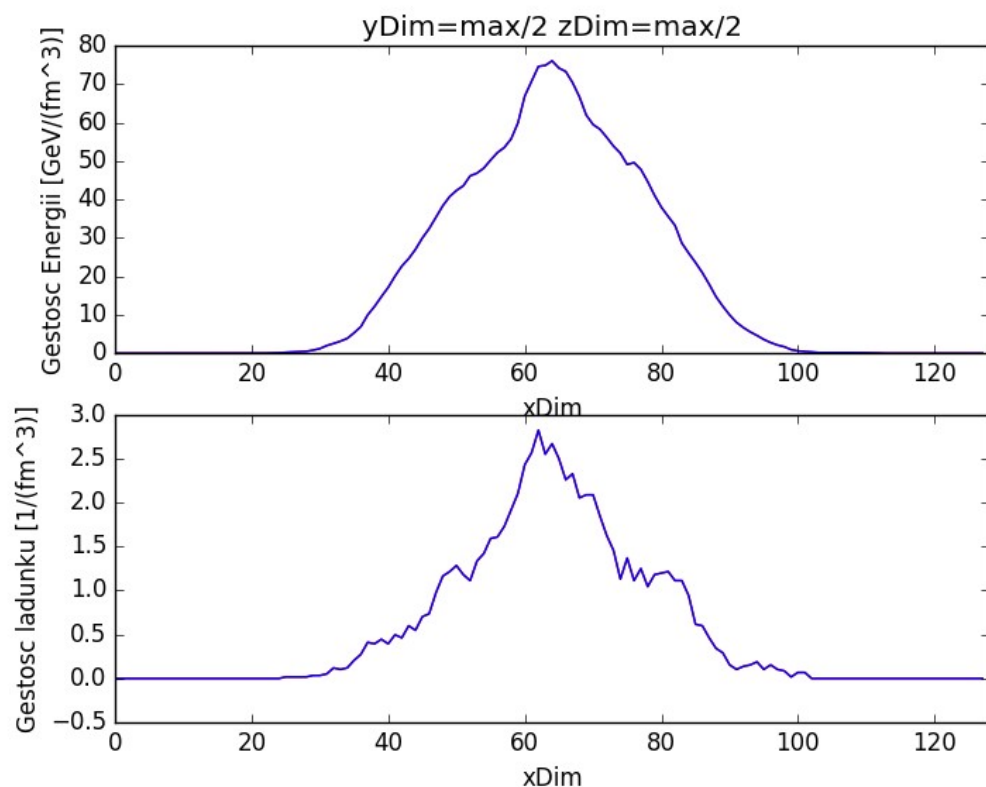
**Au+Au @ 200 GeV/c**  
**0-10% most central**



# Simulation: energy density (II)

Initial conditions for averaging 100 UrQMD events

**Au+Au @ 200 GeV/c**  
**0-10% most central**





# Simulation: energy density (III)

Initial conditions for averaging 150 UrQMD events

**Au+Au @ 200 GeV/c**  
**0-10% most central**

