# GPU Optimized fluid dynamics for heavy-ion collisions

Dennis Bazow The Ohio State University

With: U. Heinz and M. Strickland



# JETSCAPE Mission

- Theoretical understanding of Jet measurements provide details into the internal structure of the QGP, but requires sophisticated numerical modeling
- Develop software package that:
  - Requires integration of numerical simulations of various (and competing) physical models for the initial state, dynamical medium evolution and the medium modification of jets
  - Use of advanced statistical methods in order to compare theory calculations with experimental data

# JETSCAPE software framework

- Open source
- Will consist of numerical models to simulate:
  - Wave function of the incoming nuclei
  - Fluid dynamical evolution of the plasma
  - Transport and modification of jets

Will focus here in this talk.

 Use Gaussian Process emulators based on Bayesian statistics to systematically determine model parameters that accurately predict the experimental observables

Numerically expensive. Use graphic processing units (GPUs) to accelerate the process

# GPU vs. CPU

- CPU is optimized for sequential serial code performance
- GPU has massively parallel architecture designed to optimize the performance of a simultaneous execution of thousands of tasks

| Model            |                  | Intel Xeon Phi | GeForce GTX Titan Z |
|------------------|------------------|----------------|---------------------|
| Processor cores  |                  | 61             | 5760                |
| Clock speed      | Core             | 1238           | 705                 |
| (MHz)            | Turbo/Boost      | 1333           | 876                 |
| Memory           | Size (GB)        | 16             | 12.288              |
| Configuration    | Bandwidth (GB/s) | 352            | 672                 |
| Processing power | Single precision | 2416.58        | 8121.6              |
| (GFLOPS)         | Double precision | 1208.29        | 2707.2              |

### What algorithms benefit from parallelism?

# Simplest case: Embarrassingly parallel

Addition of two vectors a and b of length N

```
For j = 1:N; c(j)=a(j)+b(j)
Idealized case
```

Launch N concurrent threads.

Data is split up so that every addition operation is performed simultaneously

# How does this help hydro codes? Lets first review the algorithm.

# Fluid dynamic stage of a heavy ion collision

Solve the conservation laws and relaxation equations

$$\begin{split} \partial_{\mu}T^{\mu\nu} &= 0 \ , \\ \tau_{\Pi}\dot{\Pi} + \Pi &= -\zeta\theta + \mathcal{J} \ , \end{split} \quad & \\ \tau_{\pi}\dot{\pi}^{\langle\mu\nu\rangle} + \pi^{\mu\nu} &= 2\eta\sigma^{\mu\nu} + \mathcal{J}^{\mu\nu} \ . \end{split} \quad & \\ \end{split} \quad & \\ \end{split}$$

In flux conservative form using curvilinear coordinates:

$$\partial_{\tau} \mathbf{q} + \partial_{i} (v_{i} \mathbf{q}) = \mathbf{J} \qquad i \in \{x, y, \eta_{s}\} \qquad \mathbf{q} \equiv \begin{pmatrix} \hat{T} & \vec{\pi} \end{pmatrix}^{T}$$
Source terms
$$\hat{T} \equiv \begin{pmatrix} T^{\tau\tau} & T^{\tau x} & T^{\tau y} & T^{\tau \eta} \end{pmatrix} \longleftarrow \qquad \text{First row of energy-momentum}$$

$$\vec{\pi} \equiv \begin{pmatrix} \pi^{\tau\tau} & \pi^{\tau x} & \pi^{\tau y} & \pi^{\tau \eta} & \pi^{xx} & \pi^{xy} & \pi^{y\eta} & \pi^{\eta\eta} & \Pi \end{pmatrix} \qquad 8$$



To update grid point j only need to read in neighboring cell data

# 3+1d viscous hydro code GPU-VH

- Solve fluid dynamic equations using the Kurganov-Tadmor algorithm
  - Highly accurate for equations governing shock, discontinuities and large gradient phenomena
- On GPUs using CUDA C
- Fluctuating ICs, shear and bulk, QCD EoS
- Validate the code using (semi-)analytic tests

# Nonconformal Bjorken flow test



Compare against semi-analytic solution which is a set of 3 coupled ODEs that can be solved to very high precision

## Gubser test





Gubser flow embodies key feature of HICs: very different longitudinal and transverse expansion rates.

IS equations for Gubser flow, results in semianalytic solution:

Marrochio&Noronha&Denicol&Luzum&Jeon&Gale, arxiv:1307.6130

Compare to viscous hydro codes – "gold standard" code test 12



0.2

0.1

 $^{-4}$ 

 $^{-6}$ 

-8

-5

Ó

x[fm]

5



0.2

0.1



x[fm]

condition Hydro started  $au_0=0.5$  fm/c Evolution of the energy density in the transverse

Ideal hydro (left),

Shear effects (middle),

Shear and bulk effects (right)

# Performance benchmarks

| Number of grid points      | C/CPU     | CUDA/GPU  | Speedup |
|----------------------------|-----------|-----------|---------|
|                            | (ms/step) | (ms/step) |         |
| $128 \times 128 \times 32$ | 7145      | 63        | 112     |
| $128 \times 128 \times 64$ | 13937     | 123       | 112     |
| 128 	imes 128 	imes 128    | 30717     | 244       | 125     |
| $256 \times 256 \times 32$ | 25934     | 236       | 109     |
| $256 \times 256 \times 64$ | 57387     | 472       | 121     |
| 256 	imes 256 	imes 128    | 129239    | 939       | 137     |
| $256\times 256\times 256$  | 268448    | 1865      | 143     |

GPU: GeForce GTX 980 Ti (2816 cores)

Host: 2.6 GHz Intel Xeon CPU E5-2697 v3

# Conclusion/outlook

- Developed a highly efficient implementation of fluid dynamics on GPUs
- O(100) speedup over highly optimized serial CPU implementation of our code
  - Can simulate 256^3 grid size with 1000 time steps in 30 min.
  - Can simulate 1000 events on a small cluster of 4 GPUs in ~4 days.
- Necessary in order to perform a full 3+1d statistical parameter extraction
- Open source, will be downloadable from JETSCAPE git repo

### Backups

# Bulk viscosity



# **GPU-VH** computational grid



Red cells are ghost cells that are added to allow the information in the cells on the edge of the blue region (physical volume of the simulation) to be evolved in time with the same set of instructions (using the fluxes at the boundary) as for interior cells

#### Program flow chart for the two-step RK algorithm



# What is the validity of hydrodynamics in Heavy ion collisions?

$$egin{aligned} & au_\Pi\dot{\Pi}+\Pi=-\zeta heta+\mathscr{J}+\mathscr{K}+\mathscr{R}\ , \ & au_n\dot{n}^{\langle\mu
angle}+n^\mu=\kappa I^\mu+\mathscr{J}^\mu+\mathscr{K}^\mu+\mathscr{R}^\mu\ , \ & au_\pi\dot{\pi}^{\langle\mu
u
angle}+\pi^{\mu
u}=2\eta\,\sigma^{\mu
u}+\mathscr{J}^{\mu
u}+\mathscr{K}^{\mu
u}+\mathscr{R}^{\mu
u}\ . \end{aligned}$$

- $\mathcal{J}, \mathcal{J}^{\mu}$ , and  $\mathcal{J}^{\mu\nu}$  are O(Kn R<sup>-1</sup>)
- $\mathcal{K}, \mathcal{K}^{\mu}$ , and  $\mathcal{K}^{\mu\nu}$  are O(Kn<sup>2</sup>)
- $\mathcal{R}, \mathcal{R}^{\mu}$ , and  $\mathcal{R}^{\mu\nu}$  are O(R<sup>-2</sup>)



Isothermal contour at  $T_c=200\,{
m MeV}$ 

### Inverse Reynolds number



# Second order inverse Reynolds number



## Shear stress regularization



# Graphic card specs

|         |           | Clock speeds (MHz) |        | Memory Configuration |           | Processing power (GFLOPS) |           |
|---------|-----------|--------------------|--------|----------------------|-----------|---------------------------|-----------|
| Model   | Processor | Core               | Memory | Size                 | Bandwidth | Single                    | Double    |
|         | Cores     |                    |        | (GB)                 | (GB/s)    | precision                 | precision |
| GeForce | 192       | 775                | 2500   | 3.076                | 60        | 595.2                     | N/A       |
| GTX     |           |                    |        |                      |           |                           |           |
| 560M    |           |                    |        |                      |           |                           |           |
| GeForce | 2816      | 1000               | 7012   | 6.144                | 336       | 5632                      | 176       |
| GTX 980 |           |                    |        |                      |           |                           |           |
| Ti      |           |                    |        |                      |           |                           |           |
| Tesla   | 2496      | 706                | 2600   | 5.120                | 208       | 3524                      | 1175      |
| K20M    |           |                    |        |                      |           |                           |           |