# Relativistic stochastic advection-diffusion equation using Metropolis

## Gökçe Başar, Jay Bhambure, Rajeev Singh, Derek Teaney



#### **Stony Brook University NISER**





Ref: [2403.04185](https://arxiv.org/abs/2403.04185) (to be published in PRC)

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*Thank you for listening!*



Why we need stochastic relativistic hydrodynamics?

Relativistic advection-diffusion equation from density frame

Importance of Metropolis for stochastic dynamics

### Outline



#### Standard hydro success

"Standard" hydro model is amazingly "Standard" hydro model is amazingly  $\partial_{\mu}T^{\mu\nu} = 0$  with  $T^{\mu\nu} = e u^{\mu} u^{\nu} + P(e)\Delta^{\mu\nu} + {\rm dissipation}$ 



 $\rightarrow$ 

#### Standard hydro success

"Standard" hydro model is amazingly  $\partial_{\mu}T^{\mu\nu} = 0$  with  $T^{\mu\nu} = e u^{\mu}u^{\nu} + P(e)\Delta^{\mu\nu} + {\rm dissipation + noise}$ <br>successful in large collision systems



"Standard" hydro model is amazingly

What about small collision systems:  $d + Au$ ,  $He + Au$ 



- Collective behavior in small systems

It is difficult to define flow pattern with small no. of particles

In this case: fluctuations become important







#### Recap: Stochastic Viscous Hydro  $\textbf{H}\textbf{B}\textbf{B}=\textbf{B}^{\mu\nu}+u^{\mu}u^{\nu}$  **Also are also as**  $\Delta^{\mu\nu}=\textbf{B}^{\mu\nu}+u^{\mu}u^{\nu}$

Choice of hydrodynamic frame:  $u^{\nu}T^{\mu}{}_{\nu} = -e(T)u^{\mu}$ 

$$
T^{\mu\nu} = e u^{\mu} u^{\nu} + P(e) \Delta^{\mu\nu} - \eta \sigma^{\mu\nu} + \xi^{\mu\nu}
$$

$$
\equiv 2T \eta \delta_{xy}^{4} \left[ \Delta^{\mu\rho} \Delta^{\nu\sigma} + \Delta^{\mu\sigma} \Delta^{\nu\rho} - \frac{2}{d} \Delta^{\mu\nu} \Delta^{\rho\sigma} \right]
$$

to all orders

 $\langle \xi^{\mu\nu}(x) \xi^{\rho\sigma}(y) \rangle \equiv 2T\eta \delta_{x}^4$ 

Different hydro frames (Landau/Eckart) will give different answers!

But, will agree at first order after using ideal EoMs

Equations are second order in time with runaway solutions 

Unstable 
$$
j_D^i = -D\partial^i n
$$

Israel-Stewart formulation

Alternative?



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$$
\Delta^{\mu\nu}=g
$$



## Alternative: Density frame hydro

J. Armas and A. Jain, SciPost Phys. 11 no. 3, (2021) 054

 $\longrightarrow$  Hydro without boosts

 $\longrightarrow$  Easy to implement Metropolis updates



No non-hydro modes and no additional parameters

> Density frame EoMs can be derived from Landau ones if ideal EoMs are used to replace lab frame time derivatives

Equations are first order in time and stable. Numerically easy to implement

> Results obtained in different Lorentz frames will vary, but the variation is beyond the accuracy of the diffusion equation

#### Density frame & relativistic diffusion

9 J. Armas and A. Jain, SciPost Phys. 11 no. 3, (2021) 054



diffusion  $\overline{\phantom{a}}$ 

Background fluid with velocity v

 $J_D^i = -D_\parallel(v) \hat{v}^i \hat{v}^j \partial_j N - D_\perp(v) (\delta^{ij} - \hat{v}^i \hat{v}^j) \partial_j N$ ̂ ̂ ̂ ̂  $\overline{\phantom{a}}$ diffusion perpendicular to v **the contract of the contract** 



See poster by R. Singh to obtain density frame equations from Landau frame and kinetic theory



#### For Lorentz covariant fluid

$$
J^{\mu} = nu^{\mu} + j^{\mu}_D
$$

 $\longrightarrow$  Define  $N \equiv J^0$  and use lowest order equation of motion

$$
j_D^{\mu} \quad \text{with} \quad j_D^{\mu} = -D\Delta^{\mu\nu}\partial_{\nu}n
$$

$$
\partial_t n + v^i \partial_i n = 0
$$

$$
J^{i} = Nv^{i} + \frac{D}{\gamma^{3}} \hat{v}^{i} \hat{v}^{j} \partial_{j} N + \frac{D}{\gamma} (\delta^{ij} - \hat{v}^{i} \hat{v}^{j}) \partial_{j} N
$$



$$
D_{\parallel}(\nu) = \frac{D}{\gamma^3}
$$



to rewrite time derivatives, leads to the density frame form

where

diffusion parallel to v

diffusion perpendicular to v





$$
\partial_t N + \partial_i (Nv^i) = \partial_i (D^{ij} \partial_j N) \qquad \text{with} \qquad D^{ij} = \frac{D}{\gamma} (\delta^{ij} - v^i v^j)
$$



Form of the advection-diffusion equation in the density frame is

Chemical potential is defined to all orders by the charge  $J^0$   $\mu = -$ 

#### Equations are strictly first order in time and stable

Each Lorentz observer has his own hydrodynamics frame where

 $dS^0 = -\ell$ 



$$
\beta^{\mu} dT^0_{\mu} + \frac{\mu}{T} dJ^0
$$







## Approach to dissipative steady state

Start at  $t = 0$  with  $N(x)$  as a Gaussian and  $J_D = 0$  in lab frame with

 $L/l_{\text{mfp}} = \text{ width in fluid frame in units of } l_{\text{mfp}} = 2 \, c \tau_R$ 

 $J = Nv + J_D$ 

The dissipative steady state is approached on a timescale *τR*/*γ*





#### Approach to Density frame

Start at  $t = 0$  with  $N(x)$  as a Gaussian and  $J_D = 0$  in lab frame with

 $L/l_{\text{mfp}} = \text{ width in fluid frame in units of } l_{\text{mfp}} = 2 \, c \tau_R$ 

The dissipative steady state is approached on a timescale *τR*/*γ*



#### Convergence of gradient expansion

 $\gamma^2 J_D =$ *τR γ*  $\partial_x N + c_2$ *τR γ* ) 2  $v \frac{\partial^2 x}{\partial x^2} + c_3$ *τR γ* ) 3  $v \frac{\partial^3}{\partial x^N} + \dots$ 

#### Start with narrow Gaussian  $N(x)$  with rest frame width  $L/l_{\rm mfp} = 4$



## Convergence of gradient expansion

 $\gamma^2 J_D =$ *τR γ*  $\partial_x N + c_2$ *τR γ* ) 2  $v \frac{\partial^2 x}{\partial x^2} + c_3$ *τR γ* ) 3  $v \frac{\partial^3}{\partial x^N} + \dots$ 



The first term in the gradient expansion is always well behaved in contrast to higher orders

## Enough! Let's add some "noise"

#### Brownian Motion

 $\partial_t P + \{ \mathcal{H}, P \} = T \eta \nabla_p \left( \beta \nabla_p \mathcal{H} P + \nabla_p P \right)$  $-\nabla_p(e^{-\beta \mathcal{H}})$  $\overline{\phantom{a}}$ 







A unique mathematical structure which reaches equilibrium

evolves to equilibrium: *P*eq = *e*−*β*<sup>ℋ</sup>

#### Dissipative dynamics from Metropolis updates

$$
\partial_t p = -\eta \left( \frac{\partial \mathcal{H}}{\partial p} \right) + \xi
$$

$$
\longrightarrow \qquad \text{Make a proposal with the} \qquad p \to p + \Delta p \qquad \text{with} \qquad \langle \Delta p^2 \rangle
$$

$$
\rightarrow \text{Find the change in free}
$$
\n
$$
\Delta \mathcal{H} = \mathcal{H}(p + \Delta p) - \mathcal{H}(p) \simeq \left(\frac{\partial \mathcal{H}}{\partial p}\right) \Delta p
$$



Proposal is accepted if Δ
$$
X < 0
$$
. If

\nΔ $X > 0$ , accept with probability

\n
$$
P_{\text{up}} = e^{-\frac{1}{2}t}
$$



= *e*−*β*Δℋ

The accepted proposals reproduce the dissipation and variance

$$
\langle \Delta p \rangle = -\eta \left( \frac{\partial \phi}{\partial \rho} \right)
$$



### Advantages of Metropolis approach

Metropolis steps are guaranteed to converge to the required equilibrium distribution

 $\longrightarrow$ 

For  $\Delta t$  the Metropolis updates naturally reproduce the Langevin dynamics of the diffusion equation



Used for other problems: Sphaleron rate, O(4) critical point, Model B<br>G. D. Moore Nucl. Phys. B 568 (2000),

Detailed balance and the Fluctuation Dissipation Theorem are automatically preserved, independently of Δ*t*

 $\rightarrow$ 

Simplifies the renormalization of kinetic coefficients P. B. Arnold, Phys. Rev. E 61 (2000) 6091-6098

Florio, Grossi, Soloviev, Teaney, Phys. Rev. D 105 no. 5, (2022) 054512 Florio, Grossi, Teaney, Phys. Rev. D 109 no. 5, (2024) 054037 Chattopadhyay, Ott, Schaefer, Skokov, Phys. Rev. D 108 no. 7, (2023) 074004 <sup>19</sup>



#### Simple diffusion equation

Florio, Grossi, Soloviev, Teaney, Phys. Rev. D 105 no. 5, (2022) 054512







Make a proposal for a charge transfer between cells:

#### $\langle q^2 \rangle \approx 2 T \sigma \Delta t$

#### Simple diffusion equation

 $\Delta \mathscr{H} = \Big($ *δ*ℋ[*n*]  $\delta n_B$  $-\frac{\delta \mathcal{H}[n]}{s}$ The change in entropy is:





Florio, Grossi, Soloviev, Teaney, Phys. Rev. D 105 no. 5, (2022) 054512





# $\left(\frac{\mu}{\delta n_A}\right)$  *q*  $\simeq$   $(\mu_B - \mu_A)$  *q*  $\simeq$  *q*  $\partial_x \mu$

## Stochastic diffusion equation

$$
\partial_t N + \partial_i (Nv^i) = \partial_i (D^{ij} \partial_j N + \xi^i)
$$

variance

A

D

 $\frac{Q^y}{2}$ 

$$
\langle \xi^{i}(x)\xi^{j}(x')\rangle = 2 T \chi D^{ij}\delta_{xx'}
$$



$$
N_A \rightarrow N_A - \frac{Q^x}{2} + \frac{Q^y}{2}
$$

Form of the advection-diffusion equation in the density frame with noise is

> Then accept/reject according to  $\Delta S$  yields the mean diffusive current

with dissipative matrix 
$$
D^{ij} = \frac{D}{\gamma} (\delta^{ij} - v^i v^j)
$$
 and

The framework of Metropolis applies



#### Correlation functions





We have generalized to full viscous hydrodynamics

It's boring, show some video!

### Density frame vs BDNK





A. Pandya and F. Pretorius, Phys. Rev. D 104, 023015 (2021)





ongoing work stay tuned!

### Density frame vs BDNK





A. Pandya and F. Pretorius, Phys. Rev. D 104, 023015 (2021)



ongoing work stay tuned!

## Summary

The mathematical structure follows the particle in a potential example

We have generalized to full viscous hydrodynamics in Bjorken and General coordinates

Stable first order and has no non-hydrodynamic modes

Noise comes first and then dissipation

Procedure is to take an ideal step and make a random momentum transfers with specific variances

The momentum proposal is parallel transported from cell-face to cell-centers for the accept/reject

The parallel transport reproduces the covariant derivatives in the dissipative strain

It is hoped that the Metropolis algorithm for stochastic hydrodynamics will be robust and effective, yielding a significant advance in the modeling of the quark-gluon plasma created in heavy ion collisions vielding a significant advance in the modeling of the quark-gluon plasma created in heavy ion collisions

Have very good agreement with relativistic MIS and BDNK for small viscosity and works better than BDNK (and similar to MIS) for larger viscosities

*Thank you for listening!*



*Mul***ț***umesc pentru aten***ț***ie!*

**See you in next Chirality!**

# Metropolis-Hastings algorithm

and  $q(x|x^{(j)})$  be a proposal distribution, then

• Sample 
$$
x^* \sim q(x|x^{(j)})
$$
.

• Calculate the acceptance probability

$$
\rho(x^{(j)}, x^*) = \min\left\{1, \frac{f(x^*)}{f(x^{(j)})}\frac{q(x^{(j)}|x^*)}{q(x^*|x^{(j)})}\right\}.
$$

• Set  $x^{(j+1)} = x^*$  with probability  $\rho(x^{(j)}, x^*)$ , otherwise set  $x^{(j+1)} = x^{(j)}$ .

Notes:  $\bullet x^{(j)} \stackrel{d}{\rightarrow} X$  where  $X \sim f(x)$ . • The sequence  $x^{(j)}$  is not independent.

€

$$
\frac{1}{J}\sum_{j=1}^{J} h\left(x^{(j)}\right) \to E_f[h(X)] = \int_{\mathcal{X}} h(x)f(x)dx
$$

Let  $f(x)$  be the (possibly unnormalized) target density,  $x^{(j)}$  be a current value,