Dynamical Models & the fluid nature of the QGP

北京大学 物理学院 QCD与中高能核物理暑期学校 2023年7月10-25日

宋晨起

July 18 2023

Landscape of nuclear physics

degrees of freedeom



Landscape of nuclear physics





Confinement

Deconfinement

QGP (quark gluon plasma): a deconfinement phase of the QCD matter





Phases diagram





A brief history of relativistic heavy ion physics

1974: Workshop on "GeV/nucleon collisions of heavy ions"

We should investigate.... phenomena by distributing energy of high nucleon density of a relatively large volume" ---T.D.Lee

1984: SPS starts, (end 2003)

1986: AGS stars, (end 2000)

2000: RHIC starts

2010: LHC starts

Future: FAIR & NICA



A brief history of relativistic heavy ion physics

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We should investigate.... phenomena by distributing energy of high nucleon density of a relatively large volume" ---T.D.Lee





核子重如牛,对撞生新态

big bang: the very early history of the universe



little bang: the different stage for a relativistic heavy ion collisions



QGP-the most perfect fluid in the world

| | Nev | vsroom | Home |
|--|-----|--------|------|
|--|-----|--------|------|

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LHC to Restart in 2009

Disappearing Superconductivity Reappears -- in 2-D

Electron Pairs Precede High-Temperature Superconductivity

World's biggest computing grid launched

First Beam for Large Hadron Collider



RHIC Scientists Serve Up "Perfect" Liquid

New state of matter more remarkable than predicted -- raising many new questions

April 18, 2005

TAMPA, FL -- The four detector groups conducting research at the <u>Relativistic Heavy Ion Collider</u> (RHIC) -- a giant atom "smasher" located at the U.S. Department of Energy's Brookhaven National Laboratory -- say they've created a new state of hot, dense matter out of the quarks and gluons that are the basic particles of atomic nuclei, but it is a state quite different and even more remarkable than had been predicted. In <u>peer-reviewed papers</u> summarizing the first three years of RHIC findings, the scientists say that instead of behaving like a gas of free quarks and gluons, as was expected, the matter created in RHIC's heavy ion collisions appears to be more like a *liquid*.

"Once again, the physics research sponsored by the Department of Energy is producing historic results," said Secretary of Energy Samuel Bodman, a trained chemical engineer. "The DOE is the principal federal funder of basic research in the physical sciences, including nuclear and high-energy physics. With today's announcement we see that investment paying off."

"The truly stunning finding at RHIC that the new state of matter created in the collisions of gold ions is more like a liquid than a gas gives us a profound insight into the earliest moments of the universe," said Dr. Raymond L. Orbach, Director of the DOE Office of Science.

Also of great interest to many following progress at RHIC is the emerging connection between the collider's results and calculations using the methods of string theory, an approach that attempts to explain



BNL News, 2005

Secretary of Energy Samuel Bodman



Theoretical tools for QGP evolution



Dynamical Model

Boltzmann approach

microscopic view



Hydrodynamics

macroscopic view



Boltzmann approach

microscopic view





Gas: particles only know about each other when they bump

Hydrodynamics

macroscopic view





Liquid: particles exert forces on one another all the time, flows in a coordinated fashion 6



ideal hydro

 $\partial_{\mu}S^{\mu} = 0$

Local equilibrium system $e(x) p(x) n(x) u^{\mu}(x)$

viscous hydro

$$\partial_{\mu}S^{\mu} \geq 0$$

Near equilibrium system $e(x) p(x) n(x) u^{\mu}(x)$ $\pi^{\mu\nu}(x) \Pi(x)$



hydrodynamics



Hydrodynamics:

-A macroscopic tool to describe the expansion of QGP or hadronic matter

Conservation laws

$$\partial_{\mu} N^{\mu}(x) = 0$$

 $\partial_{\mu} T^{\mu\nu}(x) = 0$

5 equ. 14 independent variables

- reduce # of independent variables (ideal hydro)
- or provide more equations? (viscous hydro)

Viscous hydrodynamics



Conservation laws:

 $\partial_{\mu}T^{\mu\nu}(x) = 0. \qquad \partial_{\mu}N^{\mu}_{i}(x) = 0,$

2nd order I-S equ:

$$\begin{split} \dot{\Pi} &= -\frac{1}{\tau_{\Pi}} \bigg[\Pi + \zeta \theta - l_{\Pi q} \nabla_{\mu} q^{\mu} + \Pi \zeta T \partial_{\mu} \big(\frac{\tau_{\Pi} u^{\mu}}{2\zeta T} \big) \bigg], \\ \Delta_{\nu}^{\mu} \dot{q}^{\nu} &= -\frac{1}{\tau_{q}} \bigg[q_{\mu} + \lambda \frac{nT^{2}}{e+p} \nabla^{\mu} \frac{\nu}{T} + l_{q\pi} \nabla_{\nu} \pi^{\mu\nu} + l_{q\Pi} \nabla^{\mu} \Pi - \lambda T^{2} q^{\mu} \partial_{\mu} \big(\frac{\tau_{q} u^{\mu}}{2\lambda T^{2}} \big) \bigg], \\ \Delta^{\mu\alpha} \Delta^{\nu\beta} \dot{\pi}_{\alpha\beta} &= -\frac{1}{\tau_{\pi}} \bigg[\pi^{\mu\nu} - 2\eta \nabla^{\langle \mu} u^{\nu \rangle} - l_{\pi q} \nabla^{\langle \mu} q^{\nu \rangle} + \pi_{\mu\nu} \eta T \partial_{\alpha} \big(\frac{\tau_{\pi} u^{\alpha}}{2\eta T} \big) \bigg], \\ \text{Input: "EOS"} \quad \boldsymbol{\varepsilon} = \boldsymbol{\varepsilon}(\boldsymbol{p}) \qquad \text{initial and final conditions} \end{split}$$

Viscous hydro: Shear viscosity η & elliptic flow V₂



-V2 can be used to extract the QGP shear viscosity

Effect from Hadronic evolution



-These two HRG effects are not included in early viscous hydro calculations

viscous hydro + hadron cascade (URQMD) hybrid approach

URQMD includes the partially chemical equilibrium nature & hadronic dissipative effects

VISHNU & iEBE-VISHNU hybrid approach



VISHNU: H. Song, S. Bass, U. Heinz, PRC2011

- -initial conditons
- -Viscous hydro (VISH2+1)
- -Hadron Cascade
- **-EoS:** (s95p-PCE, etc)
- iEBE- VISHNU:-Event-by-Event VISHNUShen, Qiu, Song et al CPC2016



Collective Flow

Elliptic Flow

Azimuthal distributions



$$E\frac{dN}{d^3p} = \frac{dN}{dyp_T dp_T d\varphi} = \frac{1}{2\pi} \frac{dN}{dyp_T dp_T} [1 + 2v_2(p_T, b)\cos(2\varphi) + \dots]$$

QGP with fluctuating density



Elliptic Flow & higher order flow harmonics



 $N(\phi) \propto 1 + 2v_1 \cos(\phi) + 2v_2 \cos(2\phi) + 2v_3 \cos(3\phi) + \dots$

 \rightarrow measured flow: v_n



The Success of Hydrodynamics



-hydrodynamics nice describe of integrated and differential Vn of all charged and identified hadrons

Various Flow Predictions ftom Hydrodynamics



H. Xu, Z. Li and H. S*, Phys. Rev. C93, no. 6, 064905 (2016); W. Zhao, H. Xu and **H. S*,** Eur. Phys. J. C 77, no. 9, 645 (2017); X. Zhu, Y. Zhou, H. Xu and **H. S*,** Phys. Rev. C95, no. 4, 044902 (2017); W. Zhao, L. Zhu, H. Zheng, C. M. Ko and **H. S*.,** Phys. Rev. C 98, no. 5, 054905 (2018); Li, Zhao, Zhou, **H.S***, in preparation (2020)

Flow & QGP viscosity @ top RHIC and LHC energies







Lowest bound of specific shear viscosity

-classical definition:

$$\frac{F}{A} = \eta \, \frac{du}{dy}$$



-kinetic theory:

$$\eta \sim mn\overline{v}l_{mfp}$$



$$\frac{\eta}{s} \sim \frac{1}{k_B} \overline{v} m l_{mfp} \sim \frac{1}{k_B} (\frac{1}{2} m \overline{v}^2) (\frac{l_{mfp}}{\overline{v}}) \sim \frac{e\tau}{k_B} \quad (s \sim k_B n)$$

uncertainty principle: $\implies \frac{\eta}{s} \geq \frac{h}{k_B}$

Extracting QGP viscosity-early attempt



 $1 \times (1/4\pi) \le (\eta/s)_{QGP} \le 2.5 \times (1/4\pi)$

Extract QGP properties from bulk observ.

-massive data evaluation

Exp Observables

- particle yields
- spectra
- elliptic flow
- triangular flow & higher order flow harmonics
- event by event Vn distributions
- higher-order event plane correlations

...

Hydro model & its Inputs:

- -Initial conditions
- -EoS
- shear viscosity
- bulk viscosity
- Heat conductivity
- relaxation times
- freeze-out/switching cond.

....

An quantitatively extraction of the QGP viscosity





-An quantitatively extraction of the QGP viscosity with iEBE-VISHNU and the massive data evaluation
-η/s(T) is very close to the KSS

J. Bernhard, S. Moreland, S.A. Bass, J. Liu, U. Heinz, PRC 2015

bound of $1/4\pi$

Extracting QGP viscosity with massive data evaluation



Extracted QGP viscosity with ever increasing precision







Hottest Matter on Earth



Flow & viscosity at RHIC-BES



Recent model development for RHIC BES



G. Denicol, C. Gale, S. Jeon, A. Monnai, B. Schenke and C. Shen, Phys. Rev. C98, 034916 (2018) ; M. Li and C. Shen, Phys. Rev. C98, 064908 (2018) Net baryon diffusion transports more baryon numbers to the mid-rapidity region / extracting heat conductivity In the future
Recent development of hybrid model for RHIC BES

Dynamical initial conditions

 $\partial_{\mu}T^{\mu\nu} = J^{\nu}_{\text{source}}$ $\partial_{\mu}J^{\mu} = \rho_{\text{source}}.$

C. Shen and B. Schenke, Phys. Rev. C97 (2018) 024907

EoS with finite T & μ



A. Monnai, B. Schenke and C. Shen, arXiv:1902.05095 [nucl-th].

$$\Delta^{\mu\nu} Dq_{\nu} = -\frac{1}{\tau_q} \left(q^{\mu} - \kappa_B \nabla^{\mu} \frac{\mu_B}{T} \right) - \frac{\delta_{qq}}{\tau_q} q^{\mu} \theta - \frac{\lambda_{qq}}{\tau_q} q_{\nu} \sigma^{\mu\nu} + \frac{l_{q\pi}}{\tau_q} \Delta^{\mu\nu} \partial_{\lambda} \pi^{\lambda}{}_{\nu} - \frac{\lambda_{q\pi}}{\tau_q} \pi^{\mu\nu} \nabla_{\nu} \frac{\mu_B}{T}, \quad (13)$$
$$\Delta^{\mu\nu}{}_{\alpha\beta} D\pi^{\alpha\beta} = -\frac{1}{\tau_{\pi}} (\pi^{\mu\nu} - 2\eta \sigma^{\mu\nu}) - \frac{\delta_{\pi\pi}}{\tau_{\pi}} \pi^{\mu\nu} \theta - \frac{\tau_{\pi\pi}}{\tau_{\pi}} \pi^{\lambda\langle} \sigma^{\nu\rangle}{}_{\lambda} + \frac{\phi_7}{\tau_{\pi}} \pi^{\langle\mu}{}_{\alpha} \pi^{\nu\rangle\alpha} + \frac{l_{\pi q}}{\tau_{\pi}} \nabla^{\langle\mu} q^{\nu\rangle} + \frac{\lambda_{\pi q}}{\tau_{\pi}} q^{\langle\mu} \nabla^{\nu\rangle} \frac{\mu_B}{T}. \quad (14)$$

G. Denicol, C. Gale, S. Jeon, A. Monnai, B. Schenke and C. Shen, Phys. Rev. C98, 034916 (2018) ; M. Li and C. Shen, Phys. Rev. C98, 064908 (2018)

Net baryon diffusion

Extracting $\eta/s(\sqrt{s})$ from RHIC BES (I)





<u>Data</u>

- RHIC BES Au+Au 7.7-200 A GeV Model

-3+1d viscous hydro + UrQMD -pre-equilibrim stage UrQMD -EoS (Chiral Model with T, μ)

I. A. Karpenko, P. Huovinen, H. Petersen and M. Bleicher, Phys. Rev. C91, no. 6, 064901 (2015)



Extracting $\eta/s(\sqrt{s})$ from RHIC BES (II)



 $\frac{1}{\eta/s(T,\mu)}$ $\zeta/s(T,\mu)$ K/s(T, μ)

J. Auvinen, J. E. Bernhard, S. A. Bass and I. Karpenko, Phys. Rev. C97, no. 4, 044905 (2018)



Hottest Matter on Earth





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Flow and QGP signals at small systems

Correlations & Flow in p-Pb collisions



-Many flow-like signals have been observed in high multiplicity p-Pb collisions

Flow in p-Pb -- Hydrodynamics Simulations



Initial state or Final state effects?

Initial state effects:

– Various Models interpolations

- -K. Dusling and R. Venugopalan, PRL 2012, PRD2013, NPA 2014
- -A. Dumitru and A. V. Giannini, NPA 2015, A. Dumitru and V. Skokov PRD2015
- -B. Schenke, S. Schlichting, P. Tribedy, and R. Venugopalan, PRL2016
- -K. Dusling et al, Phys. Rev. Lett 120 042002 (2018)
- -C. Zhang, et al Phys. Rev. Lett. 122, no. 17, 172302 (2019).

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Final state interactions:

- -P. Bozek, W. Broniowski, G. Torrieri, PRL2013
- -K. Werner, et. Al., PRL2014
- -G.-Y. Qin, B. Muller. PRC2014
- -Y. Zhou, X. Zhu, P. Li, and H. Song, PRC2015
- P. Bozek, A. Bzdak, and G.-L. Ma, PLB2015
- P. Romatschke, Eur.Phys.J. C77 21(2017)
- -W. Zhao, Y. Zhou, H. Xu, W. Deng and H. Song, Phys. Lett. B 780, 495 (2018)

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Reminder : QGP signals in large systems



NCQ scaling of v2 in p-Pb collisions

| Low PT | <mark>Intermediate Рт</mark> | High PT |
|--------------------------|------------------------------|----------------------|
| 0 2 GeV | 6 GeV | Рт |
| Collective Flow: | NCQ Scaling of V2: | Hard Probes: |
| Hydrodynamics | -Recent Exp measurementsneed | no longer leave |
| final states interaction | systematic theoretical | obvious hints due |
| Initial state effects | investigation | to the limited size. |
| (strong debate) | | |



ALICE data: PLB,726, 164 (2013). CMS data: PRL, 121, 082301 (2018). ATLAS data: PRC, 96, 024908 (2017).

-Where does such approximate NCQ scaling of v2 come from

-Is it an indication of partonic degree of freedom?

coalescence model & NCQ scaling of v2

Thermal & hard Partons:

- Thermal partons generated by hydro
- Hard partons generated by PYTHIA8, then suffered with energy loss by LBT

Coalesence processes:

- thermal thermal parton coalescence
- thermal hard parton coalescence
- hard hard parton coalescence



Hydro-Coal-Frag Hybrid Model

Thermal hadrons (VISH2+1):

 generated by hydro. with Cooper-Frye. Meson: *P*_T< 2*P*₁; baryon: *P*_T< 3*P*₁.

<u>Coalescence hadrons (Coal Model)</u>:

-generated by coalescences model including thermal-thermal, thermal-hard & hard-hard parton coalescence.

Fragmentation hadrons (LBT):

-the remnant hard quarks feed to fragmentation .

UrQMD afterburner:

-All hadrons are feed into UrQMD for hadronic evolution, scatterings and decays Zhao, Ko, Liu, Qin & Song, PRL 125 7 072301 (2020).



Main Parameters:

3GeV

-*Thermal partons from* hydro with $P_T > P_1$.

5GeV

PT

-Hard partons from LBT with $P_T > P_2$. Fixed by the pT spectra

 $p_{T1} = 1.6 GeV \text{ and } p_{T2} = 2.6 GeV$

v2(pT) and NCQ scaling



-Hydro-Coal-Frag model gives a nice description of $v_2(\dot{p}_T)$ of pion, kaon and proton over p_T from 0 to 6 GeV.

-At intermediate p_T , Hydro-Coal-Frag model can obtain an approximate NCQ scaling as shown by the data.

Zhao, Ko, Liu, Qin & Song, PRL 125 7 072301 (2020).



Zhao, Ko, Liu, Qin & Song,PRL 125 7 072301 (2020

<u>The importance of</u> <u>Partonic flow in</u> <u>p-Pb collisions</u>

Without coalescence, Hydro-Frag largely underestimates the v2(pT)at intermediate pT, violating the NCQ Scaling of v2

Can one fluid rule it all? (for p-p p-Pb and Pb-Pb collisons)

Low PT region



-Hydrodynamics can simultaneously describe v2, v3 and v4 for p-p, p-Pb and Pb-Pb collisions.

R.D.Weller and P.Romatschke, Phys. Lett. B 774 (2017), 351

Can one fluid rule it all? (for p-p p-Pb and Pb-Pb collisons)



-**However**, the description of C2{4} become worse and worse from p-Pb to p-p collisions

B.Fu & H.Song, paper in preparation.

Can one fluid rule it all? (for p-p p-Pb and Pb-Pb collisons)



-The NCQ scaling become worse from p-Pb to p-p collisions

-Fragmentation become important tends to break-up the NCQ scaling

Large systems : traditional hydrodynamics are great success

Small systems : hydrodynamics and the fluid behavior is not that good



-Small systems may approach or beyond the limit of hydro; The situation is worse for smaller systems Wu ... Song, paper in preparation.

Can one fluid rule it all? (for p-p p-Pb and Pb-Pb collisons)

Small systems :

- -Phonemically, hydrodynamics and the fluid behavior is not that good
- -Fragmentation/mini-jets become more & more important for smaller systems
- -Small systems may approach or beyond the limit of hydro
- -Isotropization & thermalizations is slower for small systems



Comments & Discussions

Hydrodynamic side:

-Isotropization & thermalizations for Large and small systems (need more efforts)

-Properly treat pre-equilibrium stage /isotropization for small systems

-Anisotropic hydrodynamics

M. Alqahtani, et al Phys. Rev. Lett. 119(2017)042301

-Hybrid approach IP-Glasma+hydro

B.Schenke, et al Phys Lett B 803 (2020) 135322

-Hybrid approach core+ corona

Y. Kanakubo, Y. Tachibana, T. Hirano. Phys.Rev.C 106 (2022) 5, 054908

-initial state fluctuations for various systems¹⁰⁻²



Exploring the small collision systems

Geometry scan



Rich collision systems at RHIC and the LHC



¹⁹⁷Au+¹⁹⁷Au、²³⁸U+²³⁸U、²⁰⁸Pb+²⁰⁸Pb、¹²⁹Xe+¹²⁹Xe、⁹⁶Zr+⁹⁶Zr、 ⁹⁶Ru+⁹⁶Ru、⁶⁴Cu+⁶⁴Cu、¹⁶O+¹⁶O、p+²⁰⁸Pb、p+p



-Relativistic heavy collisions start from nuclei

-Rich collision systems to explore the nuclear structure





initial conditions: (with deformations)

heavy ion collision at intermediate energies excites nuclei during the collision Relativistic heavy ion collision can probe the nuclear deformation

 Relativistic heavy collisions start from nuclei

-Collision time < 10⁻²⁴ s directly probe the ground state of nuclei



Collision time < 10⁻²⁴ s





Relativistic heavy ion collision can probe the nuclear deformation

- Relativistic heavy collisions start from nuclei

-Collision time < 10⁻²⁴ s directly probe the ground state of nuclei

-Well calibrated calculations to focus on the initial state effects from the succeeding evolution



Probe the Nuclear Deformation with Isobar collisions





 $egin{split} eta_2 &= 0.06 \ eta_3 &= 0.20 - 0.27 \end{split}$

⁹⁶Ru+⁹⁶Ru and ⁹⁶Zr+⁹⁶Zr Collisions @ RHIC isobar run



-Obviously different early magnetic field for Ru+Ru and Zr+Zr collisions

-Aim to search the Chiral Magnetic Effect (CME) and probe nontrivial structure of the QCD vacuum



Search CME with Isobar collisions



between the two isobar systems. Observed differences in the multiplicity and flow harmonics at the matching centrality indicate that the magnitude of the CME background is different between the two species. No CME signature that satisfies the predefined criteria has been observed in isobar collisions in this blind analysis.

-Observed differences in both multiplicity and v2 imply that CME background are different for ⁹⁶Ru+⁹⁶Ru and ⁹⁶Zr+⁹⁶Zr Collisions at matching centralities

Nuclear Deformation



Deformation of ⁹⁶Ru and ⁹⁶Zr

PHYSICAL REVIEW C

VOLUME 42, NUMBER 3

SEPTEMBER 1990

Strong octupole and dipole collectivity in 96 Zr: Indication for octupole instability in the A = 100 mass region

⁹⁶Zr has very large octupole deformation from $B(E3; 0_1^+ \rightarrow 3_1^-)$



Hydrodynamic calculation with initially deformed nuclei



Initial conditions (TRENTO)

-Sample nucleon position in deformed nuclei with:

$$\rho(r,\theta,\phi) = \frac{\rho_0}{1+e^{(r-R(\theta,\phi))/a_0}}$$
Quadrupole: Octupole:
$$R(\theta,\phi) = R_0 \left(1+\beta_2 [\cos\gamma Y_{2,0}+\sin\gamma Y_{2,2}] +\beta_3 \sum_{m=-3}^3 \alpha_{3,m} Y_{3,m} +\beta_4 \sum_{m=-4}^4 \alpha_{4,m} Y_{4,m}\right)$$

V2 and V3 for Ru+Ru and Zr+Zr collisions



-With fine tuning parameters, iEBE-VISHNU fits V2 & V3 for Ru+Ru collisions

-Using β₂ β₃ in table1, it "predicts" V₂ &
V₃ for Zr+Zr collisions & the related ratio
-- (the data are roughly described).

| "standard" | Ru | Zr |
|----------------|-------|-------|
| a ₀ | 0.46 | 0.52 |
| β_2 | 0.162 | 0.060 |
| β ₃ | 0.00 | 0.200 |
| | | |

ac{3}for Ru+Ru and Zr+Zr collisions



$$\begin{aligned} & \operatorname{ac}_{2}\{3\} = \langle v_{2}^{2} v_{4} \cos 4(\Phi_{2} - \Phi_{4}) \rangle, \\ & \chi_{4,22} \equiv \frac{\operatorname{ac}_{2}\{3\}}{\langle v_{2}^{4} \rangle} = \operatorname{nac}_{2}\{3\} \sqrt{\frac{v_{4}\{2\}^{2}}{2v_{2}\{2\}^{4} - v_{2}\{4\}^{4}}}. \end{aligned}$$



ac{3} is sensitive to quadrupole and octupole deformations

Applications of Deep Learning in Relativistic Hydrodynamics

Why Deep Learning in Physics?



"Unlike earlier attempts ... Deep Learning systems can see patterns and spot anomalies in data sets far larger and messier than human beings can cope with."



Can "Black-box" models learn patterns and models solely from data without relying on scientific knowledge?
Applications of Deep Learning in Physics

- Y. D. Hezaveh, L. Perreault Levasseur and P. J. Marshall, Nature 548, 555 (2017)
- J. Carrasquilla and G. R. Melko, Nature Phys. 13, 431 (2017)
- Carleo et al., Science 355, 602-606 (2017)
- E. P. L. van Nieuwenburg, Y. H. Liu, S. Huber, Nature Phys. 13, 435 (2017)
- Pierre Baldi, Peter Sadowski, and Daniel Whiteson, Nature Commun. 5 (2014) 4308
- Luke de Oliveira, Michela Paganini, and Benjamin Nachman, Comput Softw Big Sci (2017) 1: 4
- Long-Gang Pang et al., Nature Commun. 9 (2018) no.1, 210

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Θ...

Searching for Exotic Particles in High-Energy Physics



Deep learning can improve the power for the collider search of exotic particles

P. Baldi, P. Sadowski, & D. Whiteson Nature Commun. 5, 4308 (2014)

Classifying the Phase of Ising Model

For the case of Ising gauge theory

$$H = -J \sum_{p} \prod_{i \in p} \sigma_i^z$$

J. Carrasquilla and R. G. Melko. Nature Physics 13, 431–434 (2017)



Identify QCD Phase Transition with Deep Learning



DNN efficiently decode the EOS information from the complex final particle info event by event

LG. Pang, K.Zhou, N.Su, H.Petersen, H. Stoecker, XN. Wang. Nature Commun.9 (2018) no.1, 210

baryon chemical potential μ_B

More Comments

on several examples of supervised learning

Image identification









Higgs signal or background? P.Baldi,et al,Nature Commun.(2014)

High temperature or low temperature phase?

Carrasquilla & Melko. Nature Physics (2017)

EoS L or EOSQ ? Pang,et al Nature Commun.(2018)

"Unlike earlier attempts ... Deep Learning systems can see patterns and spot anomalies in data sets far larger and messier than human beings can cope with."

Image generation



For hydrodynamics can we use deep learning to learn/predict the pattern transformation between initial and final profiles?

Initial energy density profiles
-----> final energy density velocity profiles



For the non-linear hydro system, can the black-box network could learn pattern transformations solely from data without relying on scientific knowledge?

(conservation laws)

Applications of deep learning to relativistic hydrodynamics

H. Huang, B. Xiao, H. Xiong, Z. Wu, Y. Mu and H. Song; NPA 2019 Phys. Rev. Res. 3 2 023256(2021)

Traditional hydrodynamics



$$\partial_{\mu}T^{\mu\nu}(x) = 0$$





-Such deep learning systems do not need to be programmed with the hydro equation $\partial_{\mu}T^{\mu\nu}(x) = 0$ Instead, they learn on their own

Deep Learning

Step1) Generate the training/testing data sets from hydro



Step2) Design & train the deep neural network



Step3) Test the deep neural network

| E4 (1-0.61m/c) | 120 105 90 75 | The Tes | The Testing Data Sets | | | | |
|----------------|------------------------|-----------------|-----------------------|--------|-------|--------|--|
| | - 45 - 30 - 15 | hydro | MC-Gl | MC-KLN | AMPT | Trento | |
| | 0 | VISH 2+1 | 10000 | 10000 | 10000 | 10000 | |

sUnet prediction vs. hydro simulations

 $\tau - \tau_0 = 6.0 \text{fm/c}$



sUnet prediction vs. hydro simulations $\tau - \tau_0 = 6.0 \text{ fm/c}$



sUnet prediction vs. hydro simulations

Eccentricity distributions:



Simulation time: sUnet vs. hydro





With the well trained network, the final state profiles can be quickly generated from the initial profiles.

Outlook

For hydrodynamics

Initial energy density profiles -----> final energy density velocity profiles

Final particle profiles

-----> Initial energy density profiles

For Nuclear Physics





Many many more to explore Enjoy it! have fun!



Hottest Matter on Earth



Most Vortical Fluid