

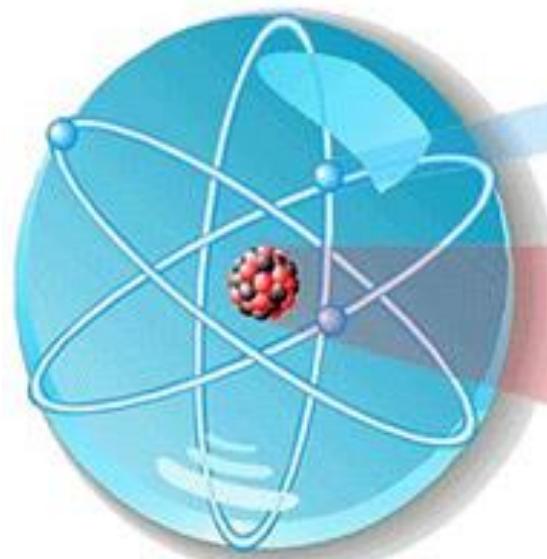
# Dynamical Models & the fluid nature of the QGP

Huichao Song

宋慧超

Peking University

原子核结构与中高能重离子碰撞交叉学  
科理论讲习班，湖州，2021年7月9-24日



atom  $\sim 10^{-8}$  cm



nucleus  
 $\sim 10^{-12}$  cm



electron  
 $< 10^{-16}$  cm



proton  
(neutron)

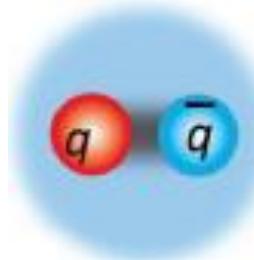
quark  
 $< 10^{-16}$  cm



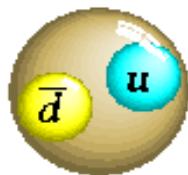
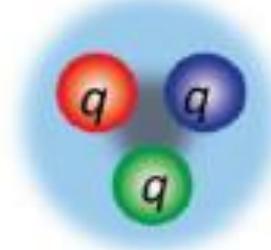
$\sim 10^{-13}$  cm

# Hadrons

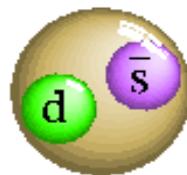
meson



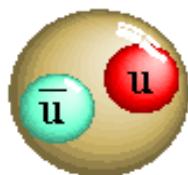
baryon



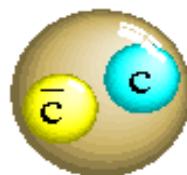
$\pi^+$



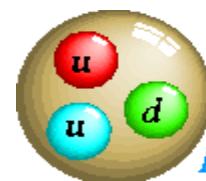
$K^0$



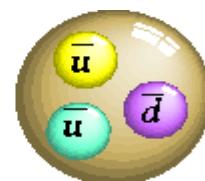
$\pi^0$



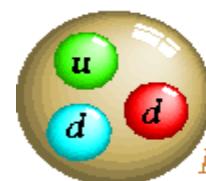
$J/\psi$



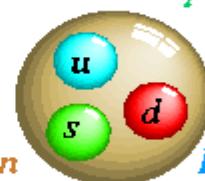
Proton



Anti-proton



Neutron



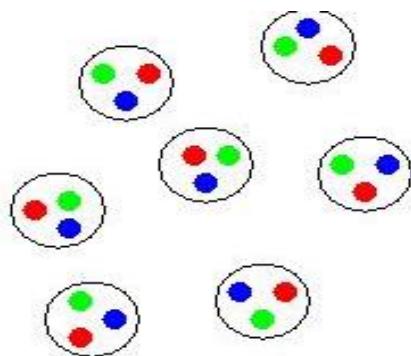
Lambda

... ... ... ...

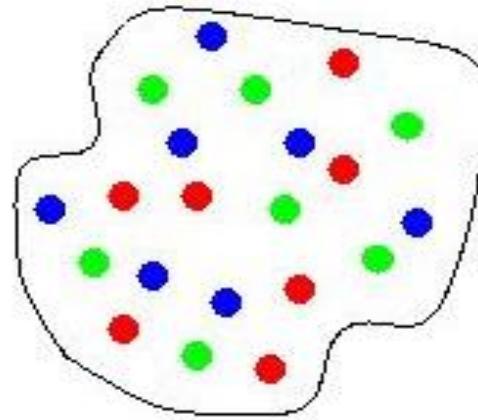
... ... ... ...

**Quark and Gluons:** confined in hadrons through strong forces described by QCD

## Nuclear Matter



## Quark Gluon Plasma



Phase Transition

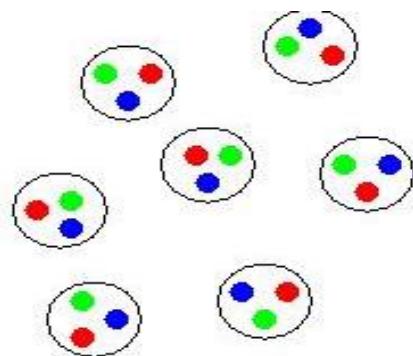
$$T_c \sim 2 \times 10^{12} \text{ K}$$

Confinement

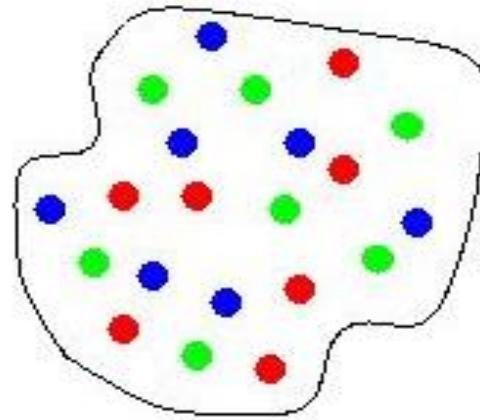
Deconfinement

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

## Nuclear Matter



## Quark Gluon Plasma



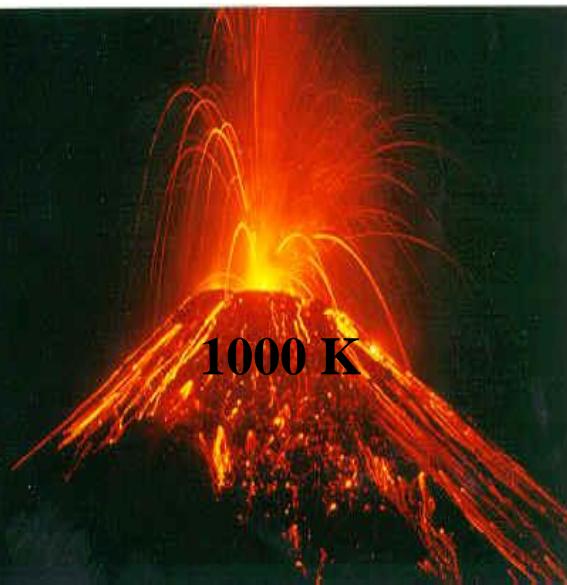
Phase Transition

$$T_c \sim 2 \times 10^{12} \text{ K}$$

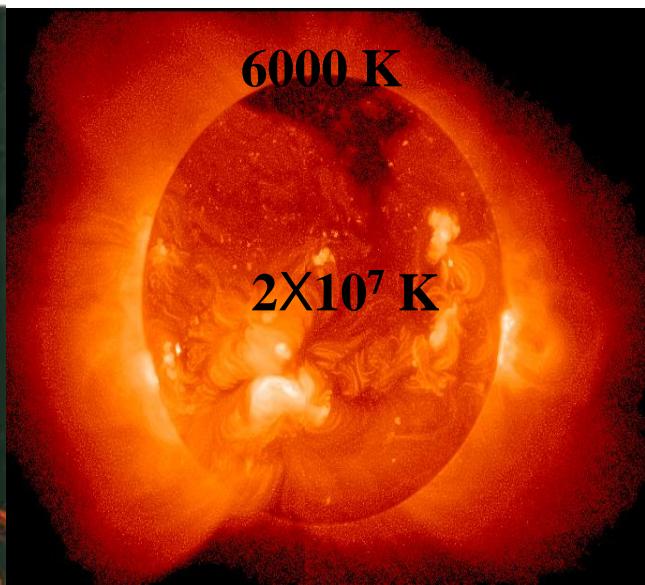
Confinement

Deconfinement

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

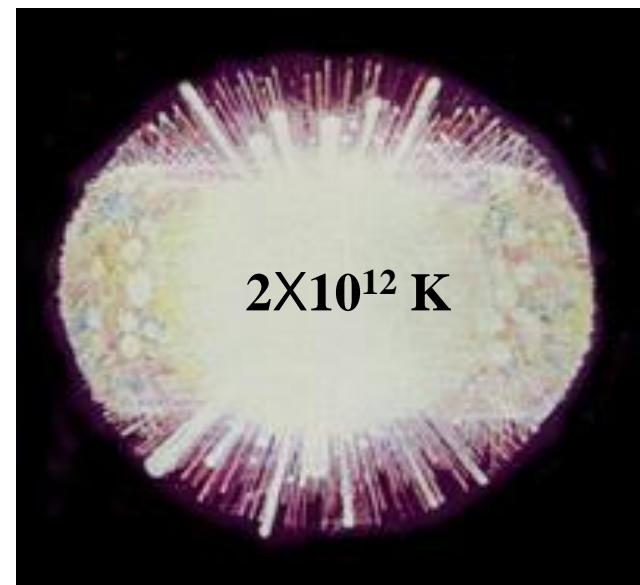


1000 K

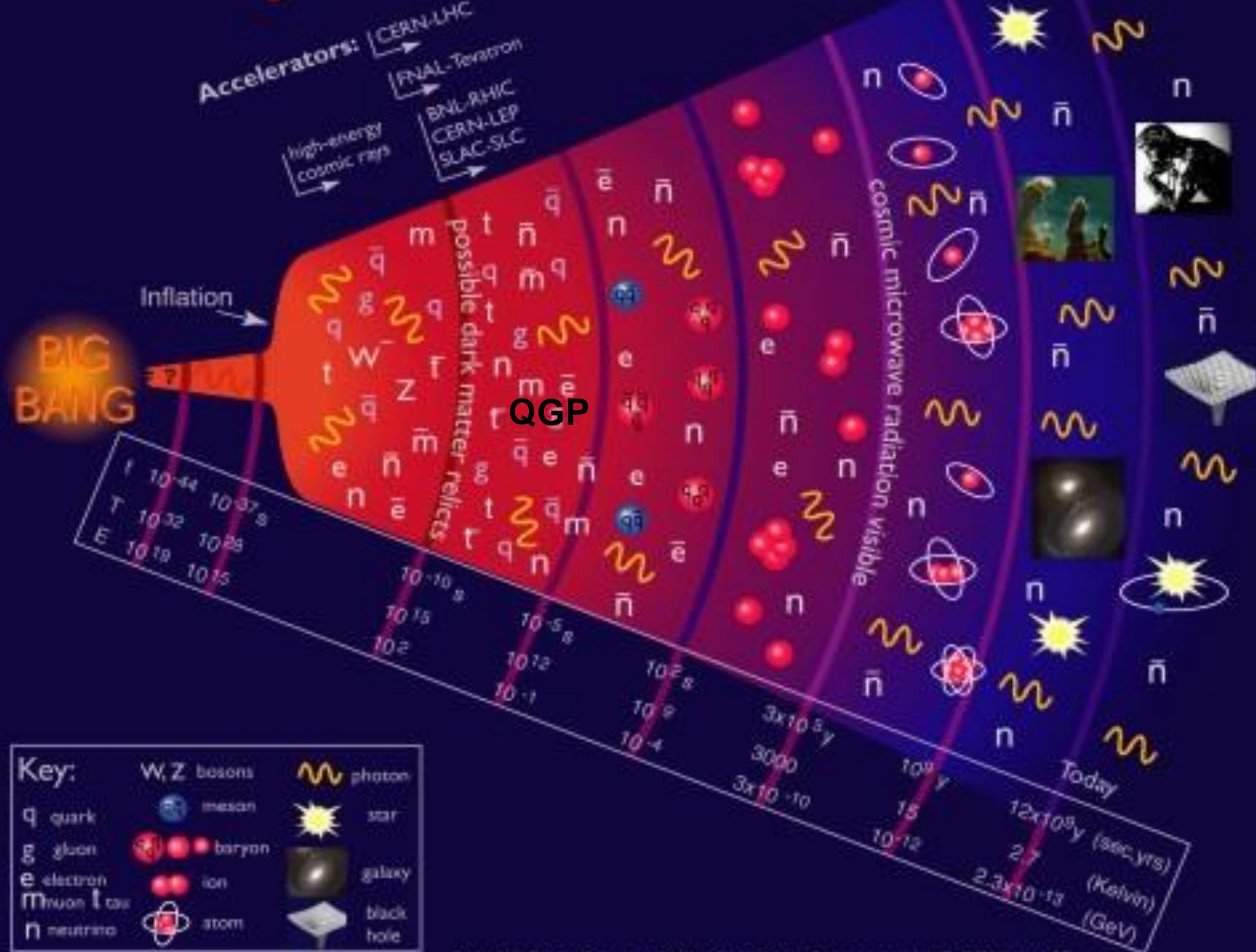


6000 K

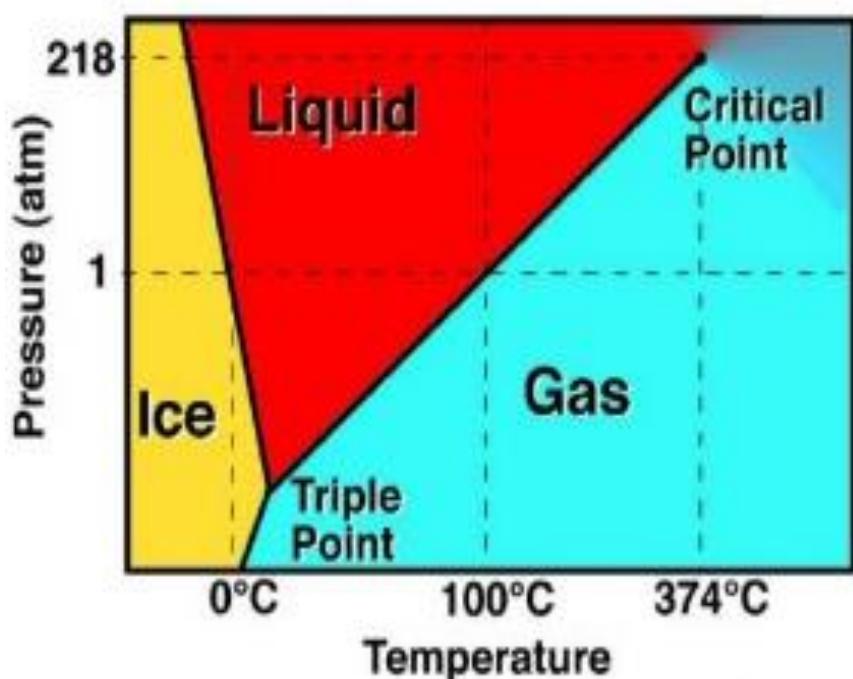
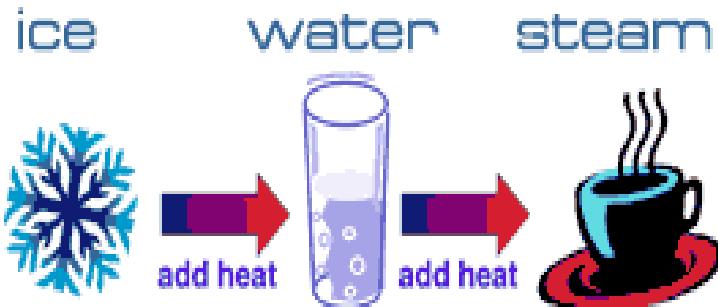
$2 \times 10^7 \text{ K}$



$2 \times 10^{12} \text{ K}$

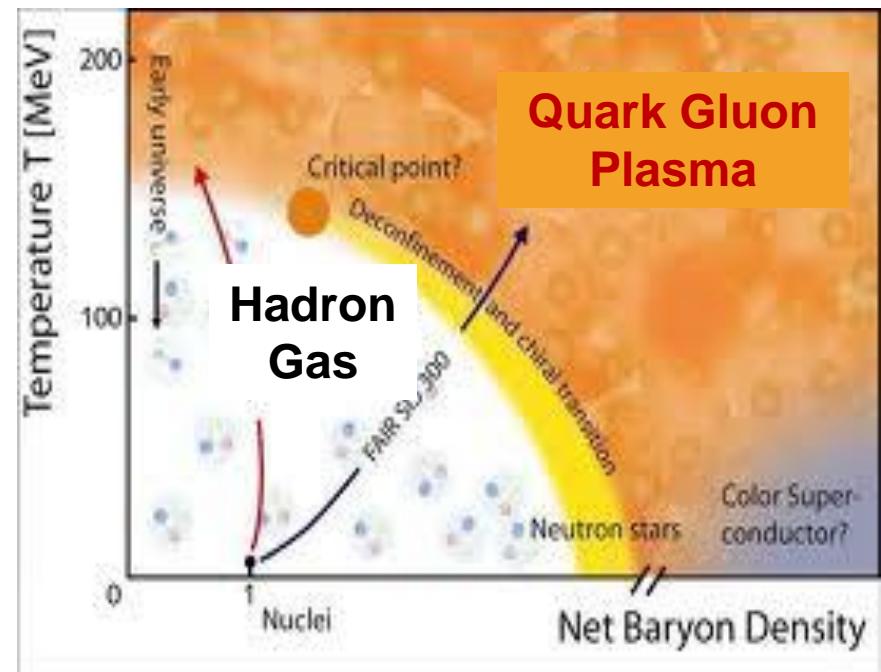
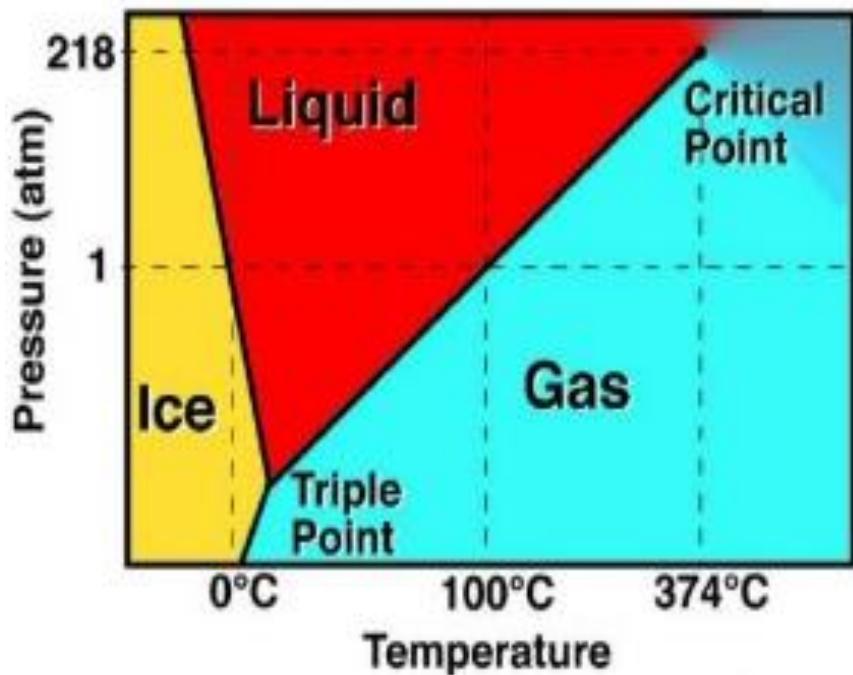
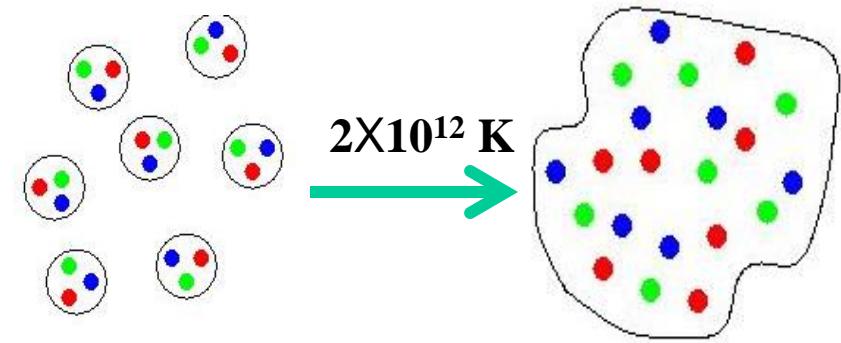
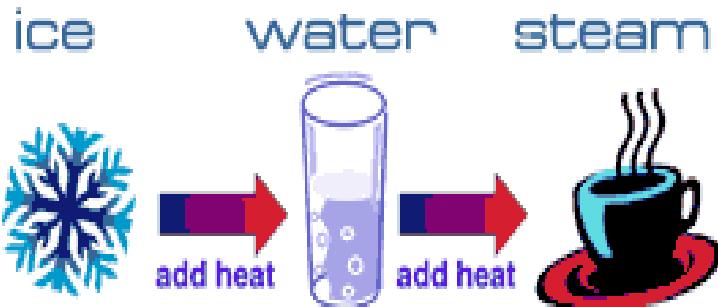


# Phases diagram



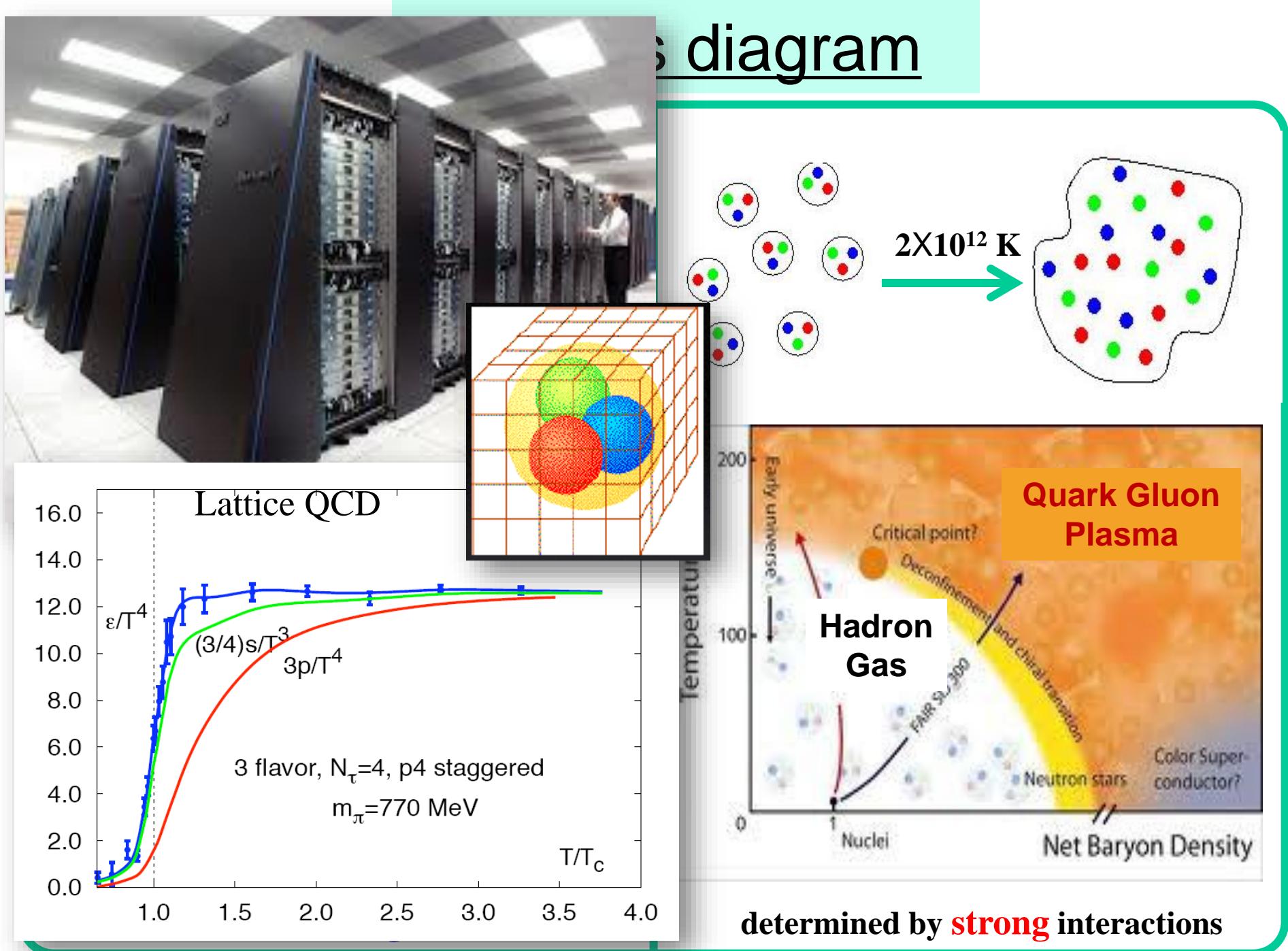
determined by **electromagnetic** interactions

# Phases diagram



determined by **electromagnetic** interactions

determined by **strong** interactions



# QCD Phase transition

$$\varepsilon = g \frac{\pi^2}{30} T^4$$

Energy density for “g” massless d.o.f.

$$\varepsilon = 3 \cdot \frac{\pi^2}{30} T^4$$

Hadronic Matter:  
3  $\pi$  with spin=0

$$\varepsilon = 37 \cdot \frac{\pi^2}{30} T^4$$

Quark Gluon Plasma:

# QCD Phase transition

$$\varepsilon = g \frac{\pi^2}{30} T^4$$

Energy density for “g” massless d.o.f.

$$\varepsilon = 3 \cdot \frac{\pi^2}{30} T^4$$

Hadronic Matter:  
3  $\pi$  with spin=0

$$\varepsilon = 37 \cdot \frac{\pi^2}{30} T^4$$

Quark Gluon Plasma:

$$\varepsilon = g \frac{\pi^2}{30} T^4$$

$$= \left\{ 2 \cdot 8_g + \frac{7}{8} \cdot 2_s \cdot 2_a \cdot 2_f \cdot 3_c \right\} \frac{\pi^2}{30} T^4$$

8 gluons, 2 spins;  
2 quark flavors, anti-quarks,  
2 spins, 3 colors

$$= 37 \cdot \frac{\pi^2}{30} T^4$$

d.o.f : 3  $\rightarrow$  37 (!)

$$\varepsilon = g \frac{\pi^2}{30} T^4$$

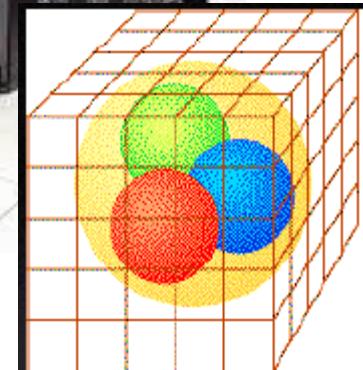
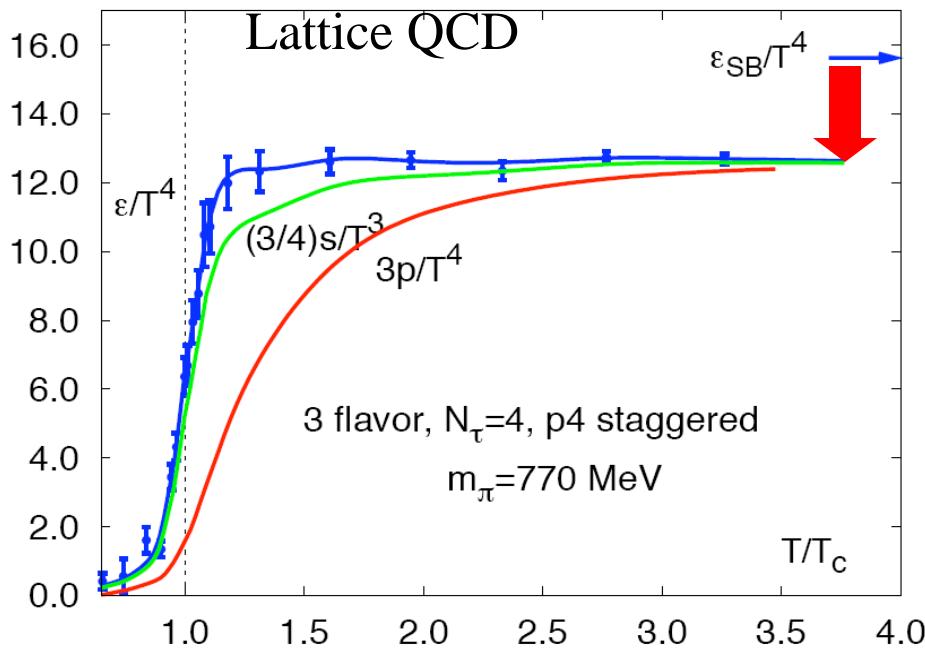
Energy density for “g” massless d.o.f.

$$\varepsilon = 3 \cdot \frac{\pi^2}{30} T^4$$

Hadronic Matter:  
3  $\pi$  with spin=0

$$\varepsilon = 37 \cdot \frac{\pi^2}{30} T^4$$

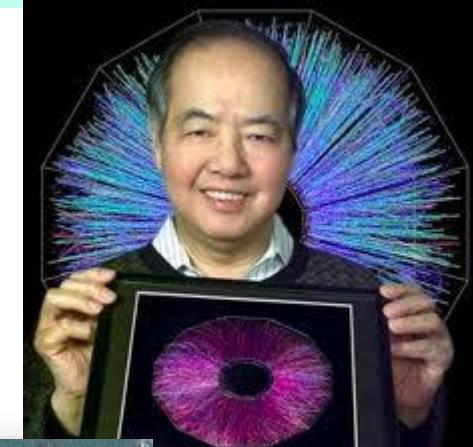
Quark Gluon Plasma:  
8 gluons;  
2 quark flavors, antiquarks, 2 spins, 3 colors



# A brief history of relativistic heavy ion physics

**1974:** Workshop on “BeV/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 starts, (end 2000)

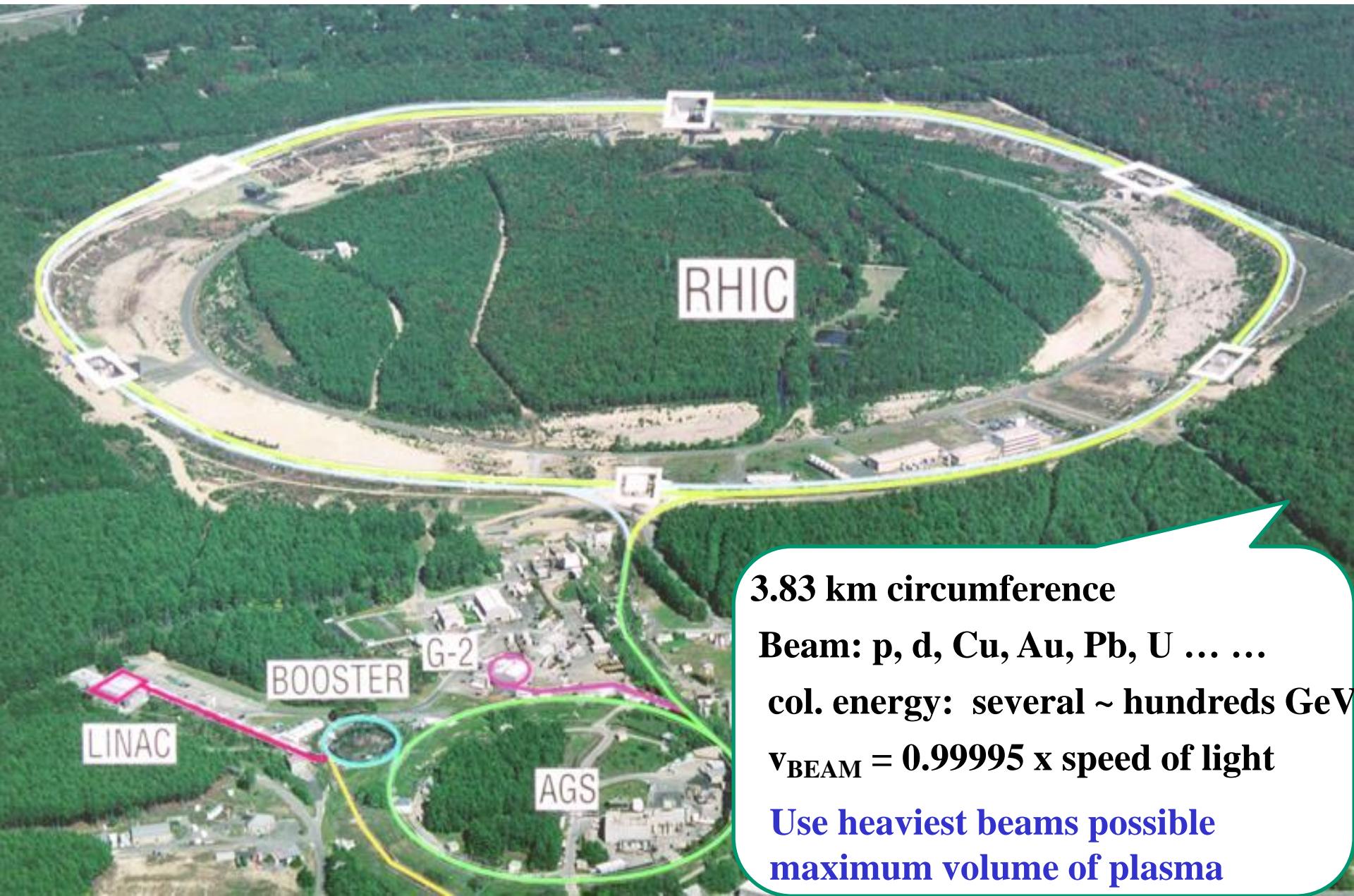
**2000:** RHIC starts

**2010:** LHC starts

**Future:** FAIR & NICA



# Brookhaven National Laboratory



**3.83 km circumference**

**Beam: p, d, Cu, Au, Pb, U ... ...**

**col. energy: several ~ hundreds GeV**

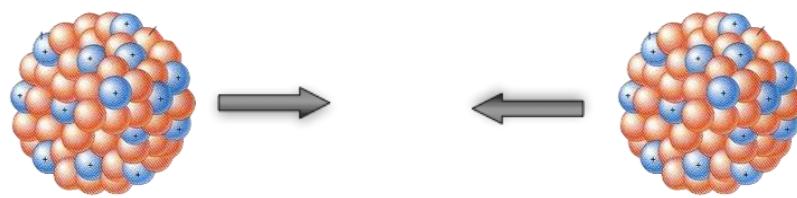
**$v_{BEAM} = 0.99995 \times \text{speed of light}$**

**Use heaviest beams possible  
maximum volume of plasma**

- RHIC = Relativistic Heavy Ion Collider
- Located at Brookhaven National Laboratory



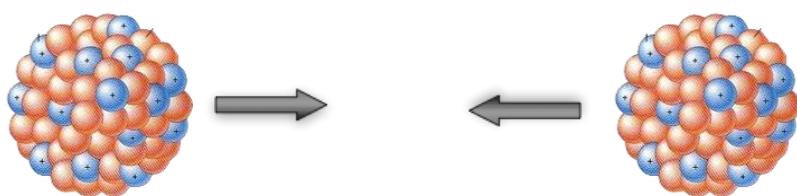
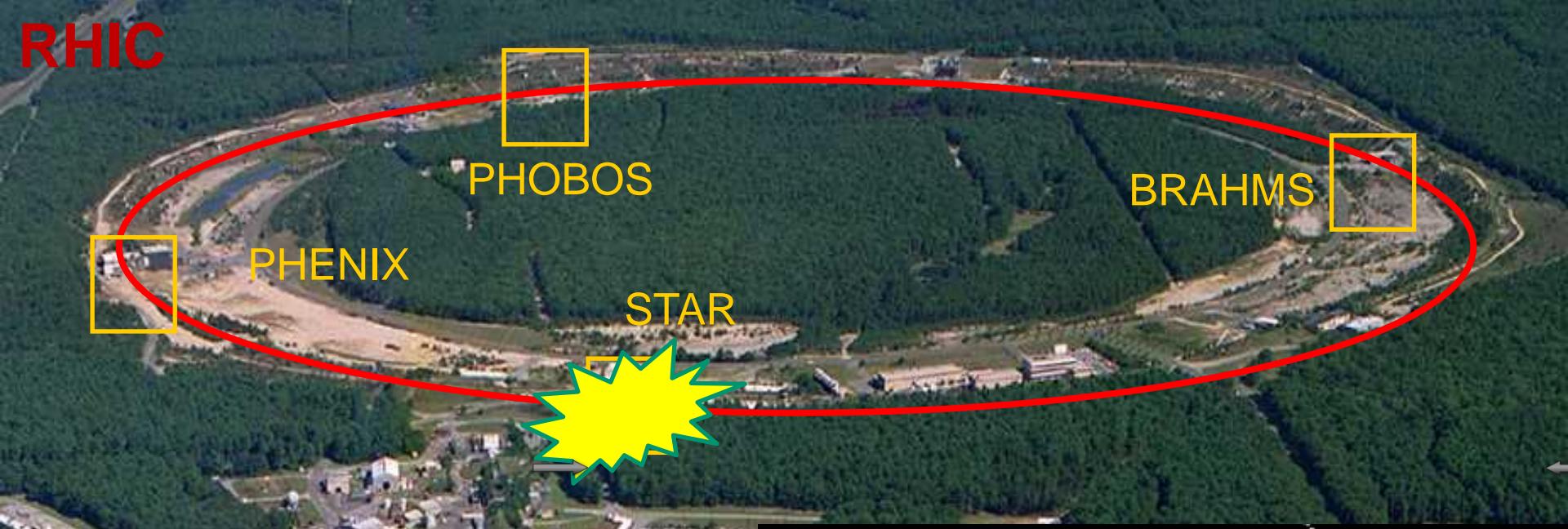
RHIC



$$v_{\text{BEAM}} = 0.99995 \times \text{speed of light}$$



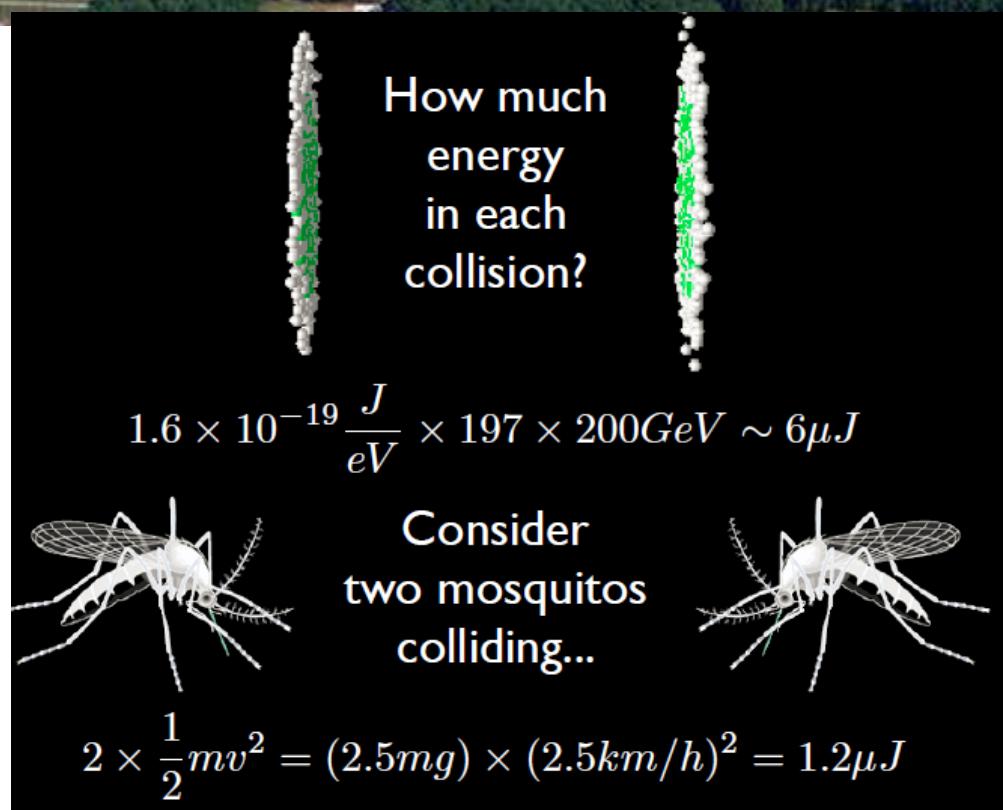
# RHIC



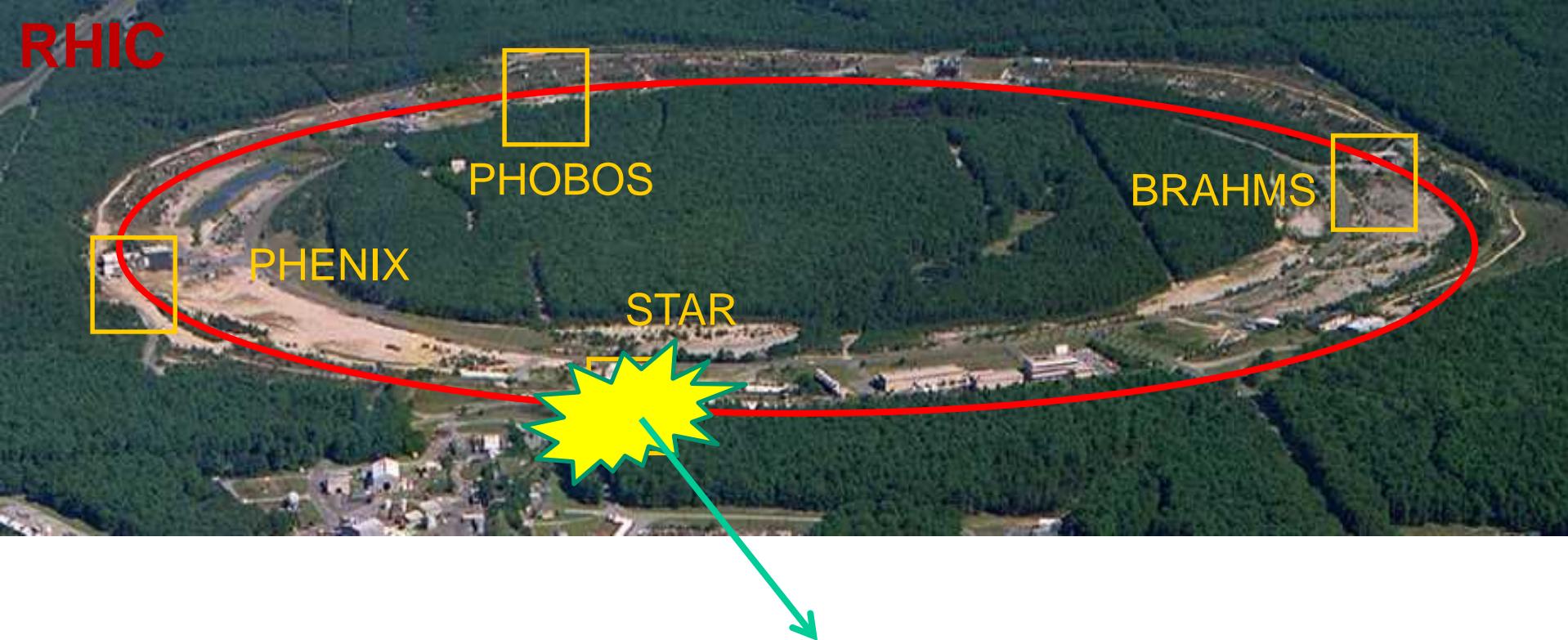
$$v_{\text{BEAM}} = 0.99995 \times \text{speed of light}$$



Energy deposition in super tiny volume



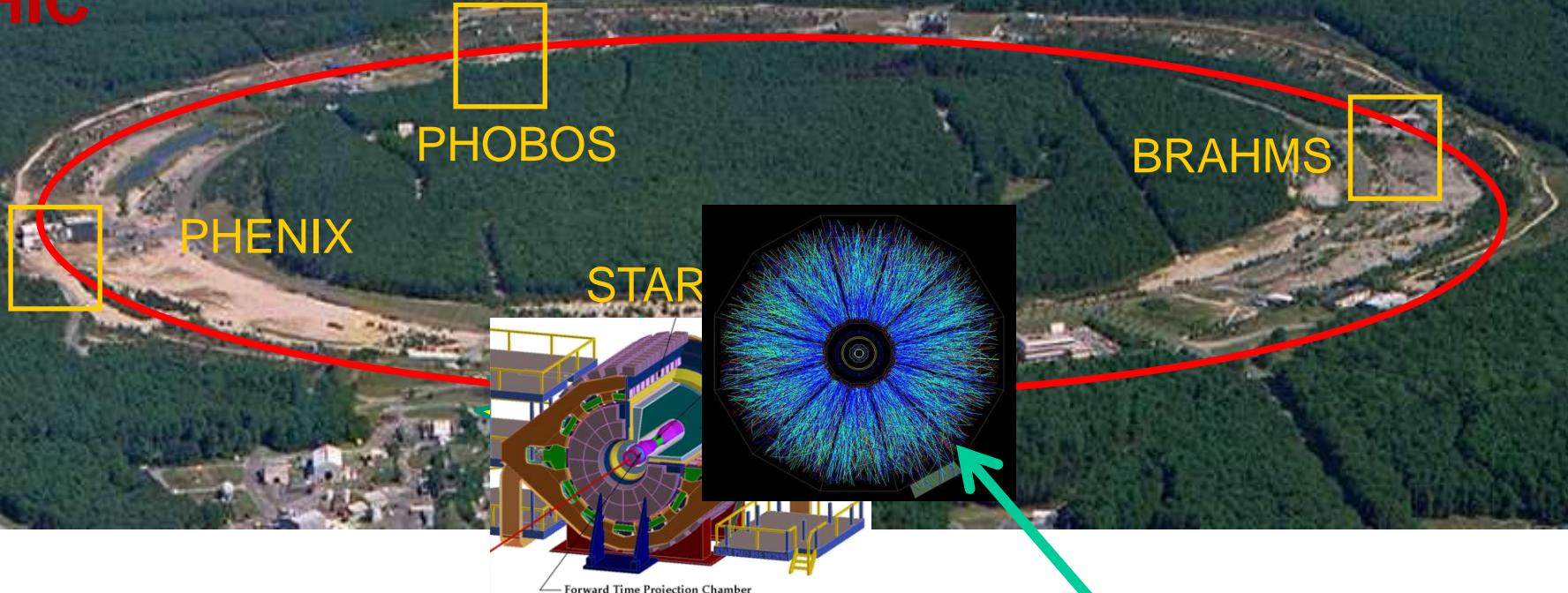
RHIC



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



RHIC



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

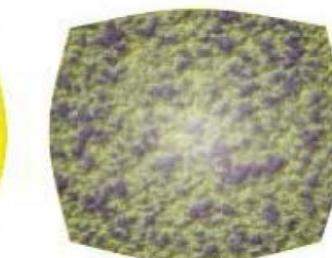
Initial state



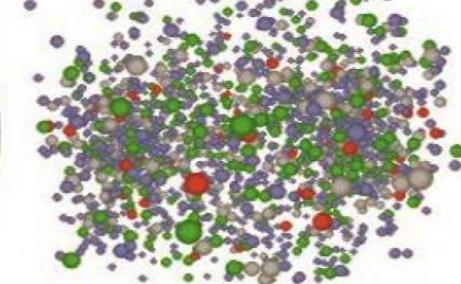
Hydro expansion  
of QGP or hadron gas



Preequilibrium

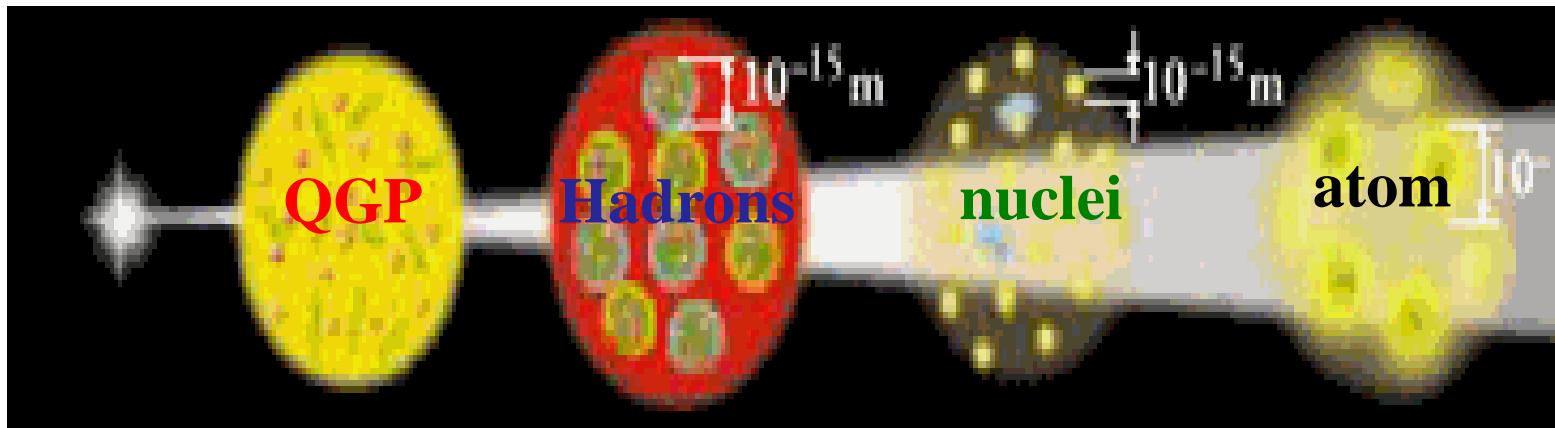


hadronisation

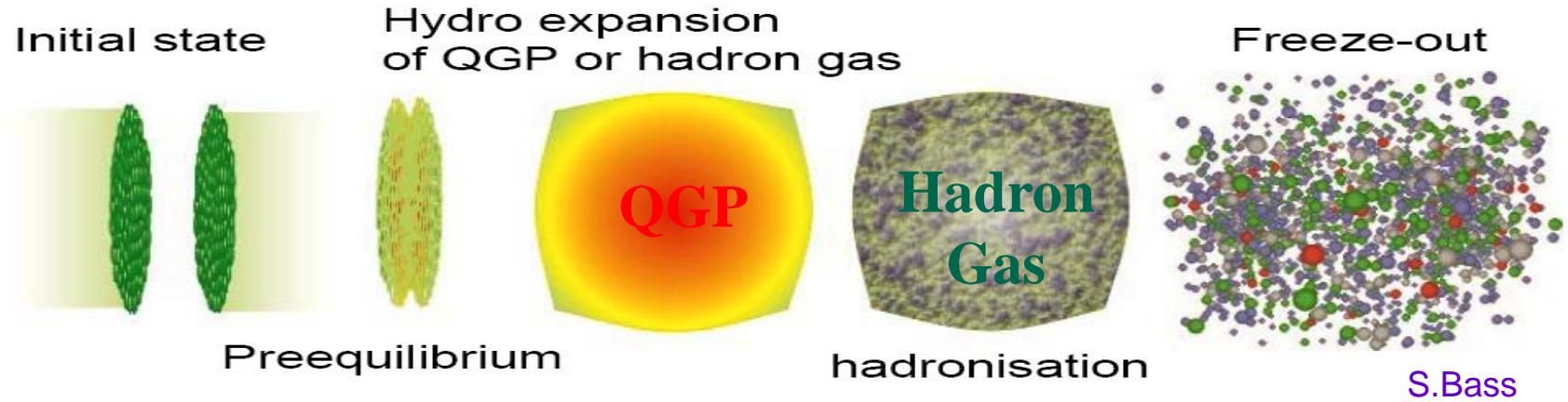


Freeze-out

## 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

BNL News, 2005

<a href="#">Newsroom Home</a>
<a href="#">News Archives</a>
<a href="#">Photo Archive</a>
<a href="#">Streaming Video</a>
<a href="#">@brookhaven TODAY</a>
<a href="#">Fact Sheets</a>
<a href="#">Science Magazine</a>
<a href="#">Management Bios</a>
<a href="#">About Brookhaven</a>

## **:: Physics News**

[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](#)

 [Get BNL News via RSS](#)

## 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 [Relativistic Heavy Ion Collider \(RHIC\)](#) -- 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 [peer-reviewed papers](#) 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."

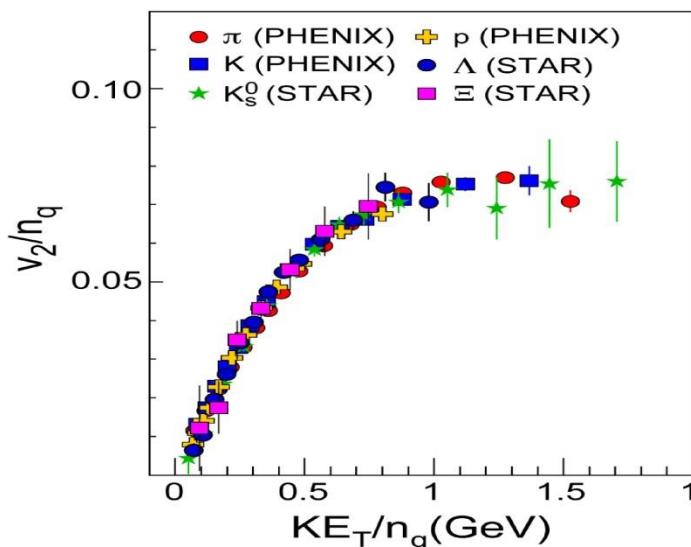
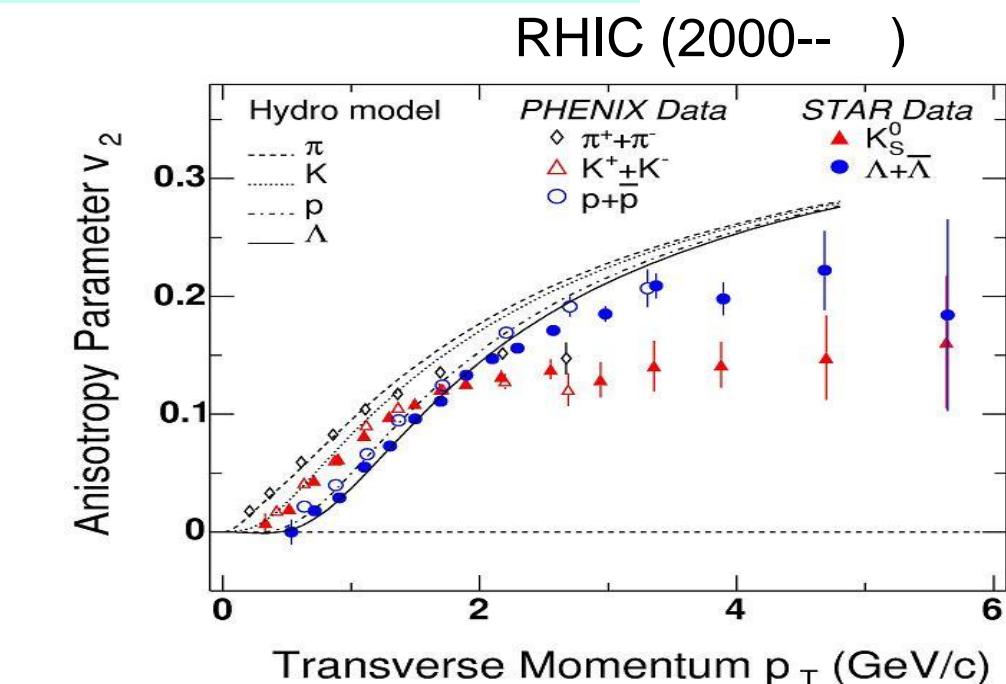
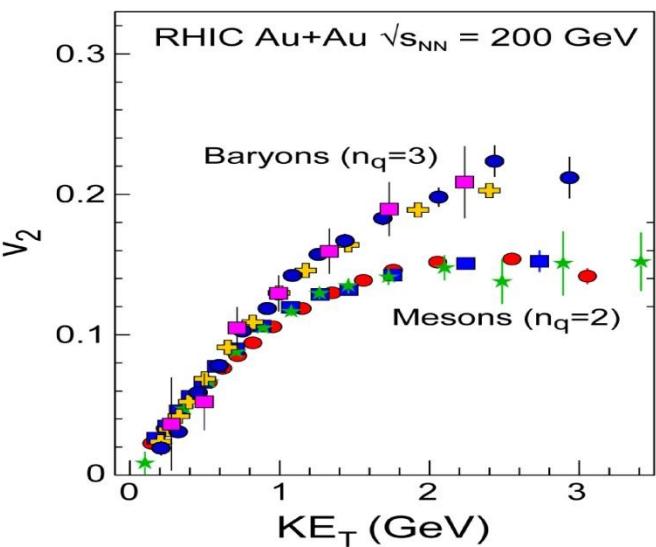
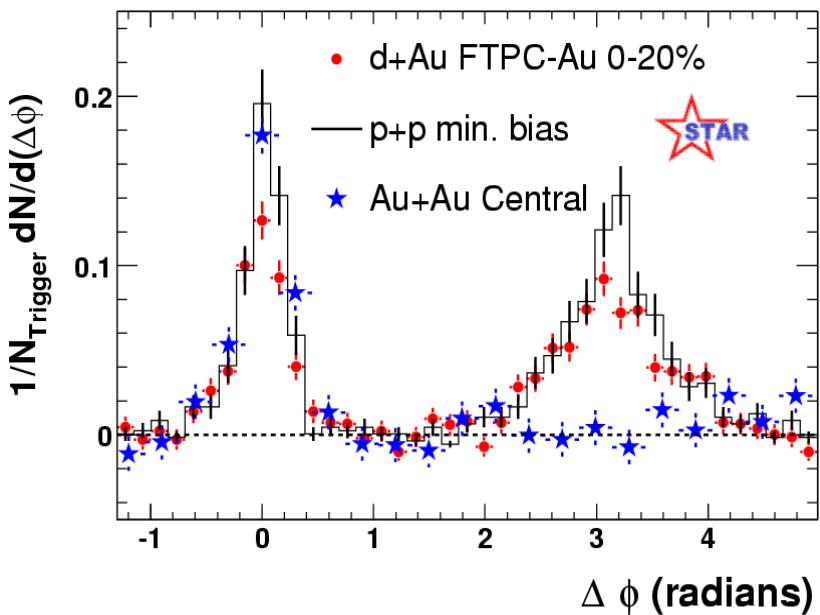
"The truly stunning finding at RHIC that the new state of matter created in the collisions of gold ions is more like a liquid than a gas gives us a profound insight into the earliest moments of the universe," said Dr. Raymond L. Orbach, Director of the DOE Office of Science.

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

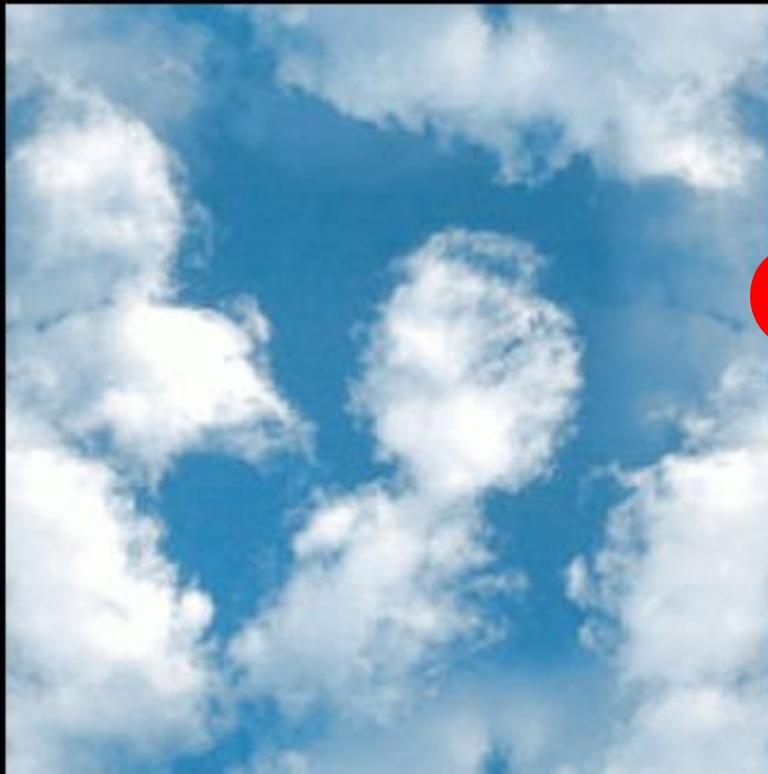


Secretary of Energy  
Samuel Bodman

# The QGP was discovered



# What State of Matter?



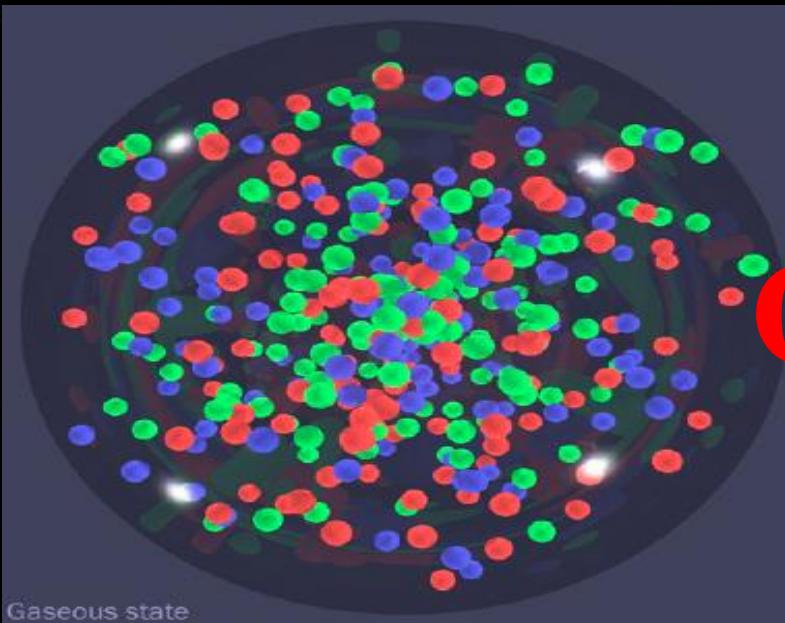
QGP



Does it act  
like an ideal gas?

Does it flow,  
like a (compressible) liquid?

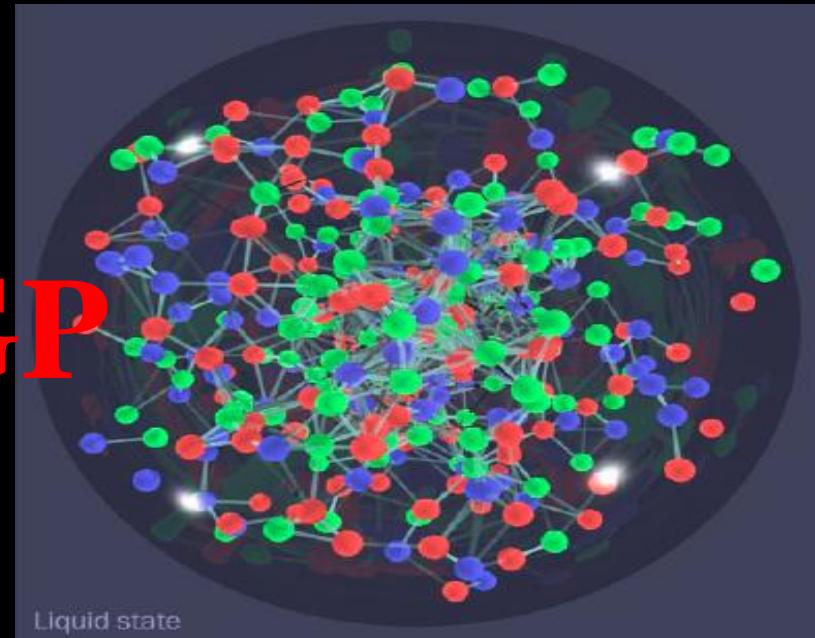
# What State of Matter?



Gaseous state

**Gas:** particles only know about each other when they bump

Does it act like an ideal gas?

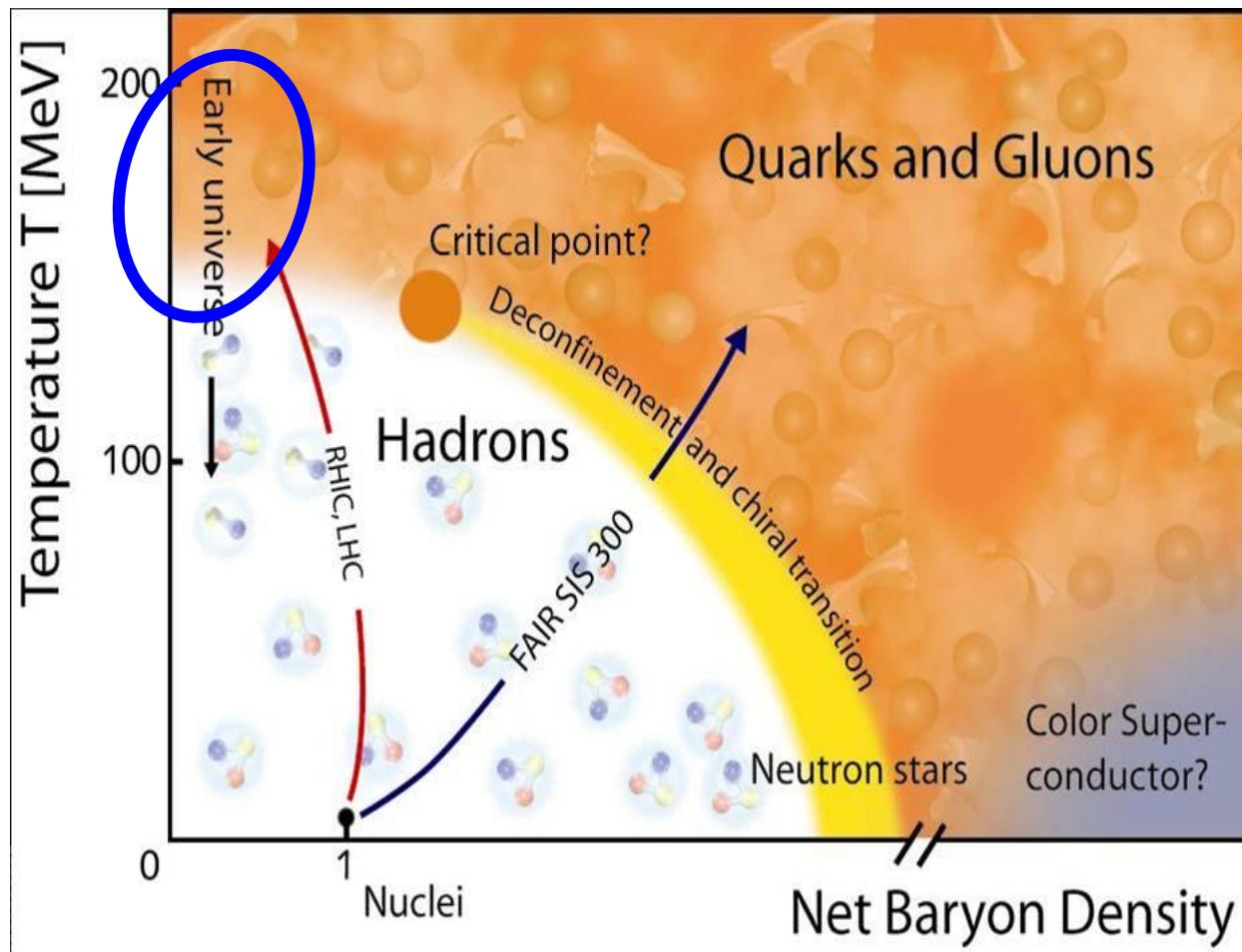


Liquid state

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

Does it flow, like a (compressible) liquid?

# Hydrodynamics & flow at top RHIC & LHC energies

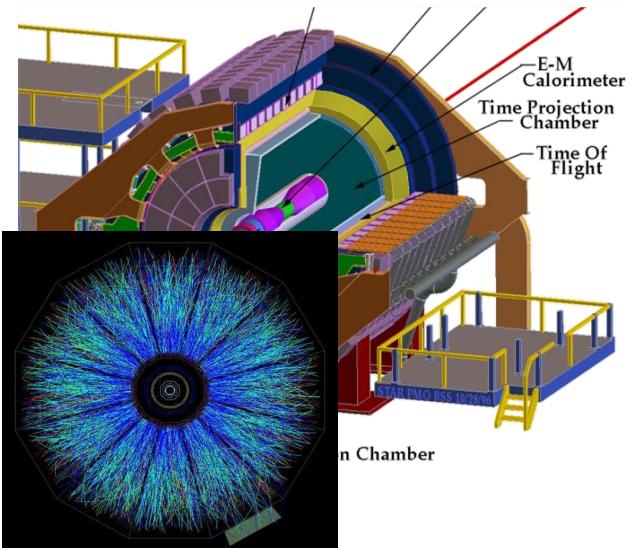


Life time  $\sim 10^{-23}$  s

size  $\sim 10^{-14}$  m



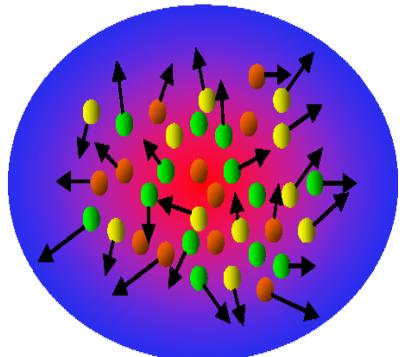
Numerical simulation



## Dynamical Model

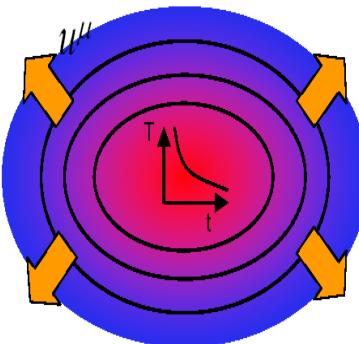
### Boltzmann approach

microscopic view



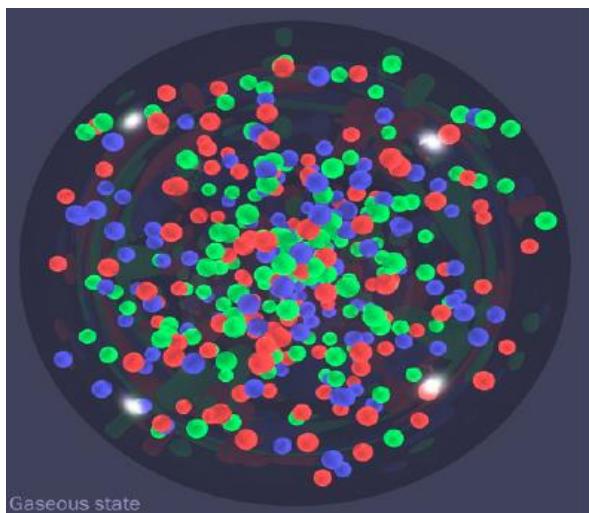
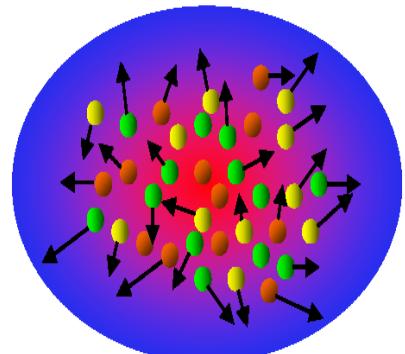
### Hydrodynamics

macroscopic view



# Boltzmann approach

microscopic view

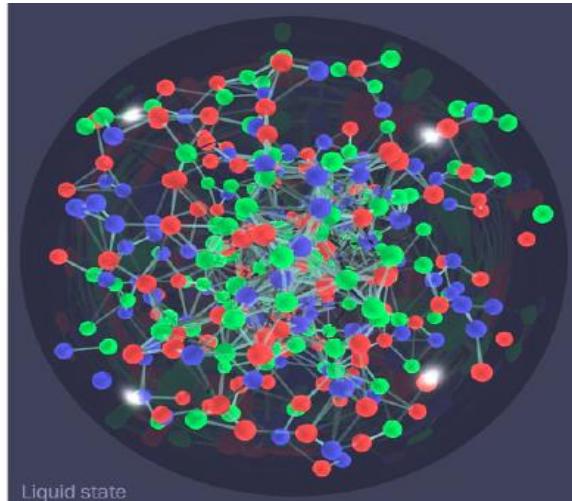
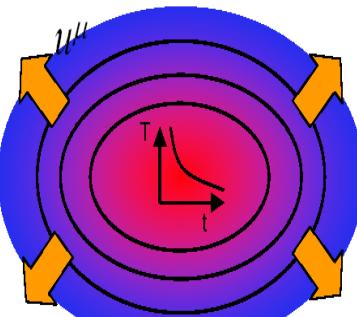


Gaseous state

Gas: particles only know about each other when they bump

# Hydrodynamics

macroscopic view



Liquid state

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

# Hydrodynamics

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

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

Initial state



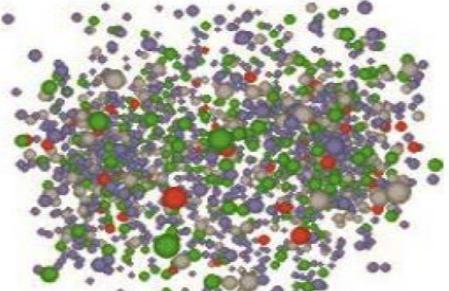
Hydro expansion  
of QGP or hadron gas



hydro

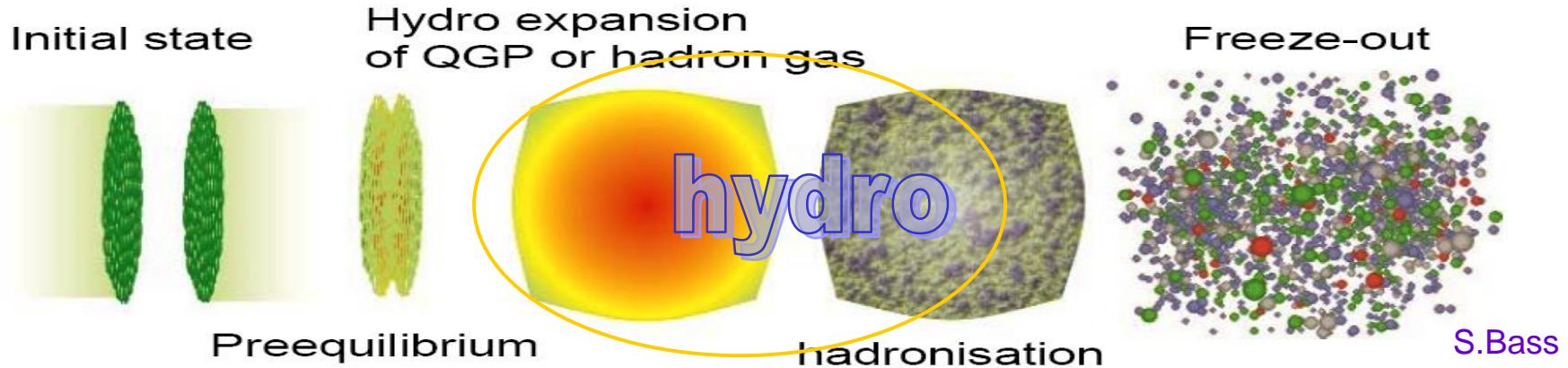
hadronisation

Freeze-out



S.Bass

# Viscous hydrodynamics



Conservation laws:

$$\partial_\mu T^{\mu\nu}(x) = 0 \quad T^{\mu\nu} = (e + p + \Pi) u^\mu u^\nu - (p + \Pi) g^{\mu\nu} + \pi^{\mu\nu}$$

$$\tau_\pi \Delta^{\alpha\mu} \Delta^{\beta\nu} \dot{\pi}_{\alpha\beta} + [\pi^{\mu\nu} = 2\eta\sigma^{\mu\nu}] - \frac{1}{2} \pi^{\mu\nu} \frac{\eta T}{\tau_\pi} \partial_\lambda \left( \frac{\tau_\pi}{\eta T} u^\lambda \right)$$

- Israel-Stewart eqns.

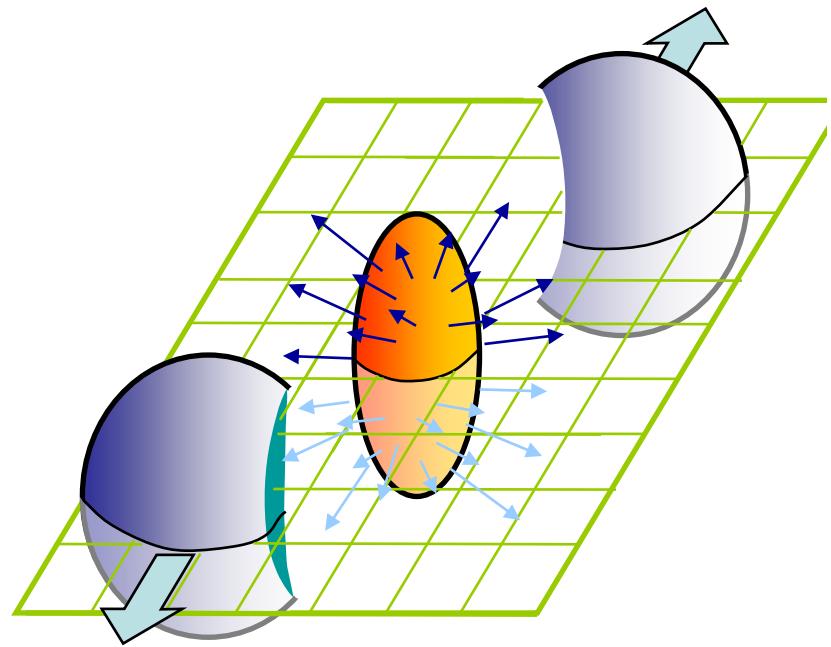
$$\tau_\Pi \dot{\Pi} + [\Pi = -\zeta(\partial \cdot u)] - \frac{1}{2} \Pi \frac{\zeta T}{\tau_\Pi} \partial_\lambda \left( \frac{\tau_\Pi}{\zeta T} u^\lambda \right)$$

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

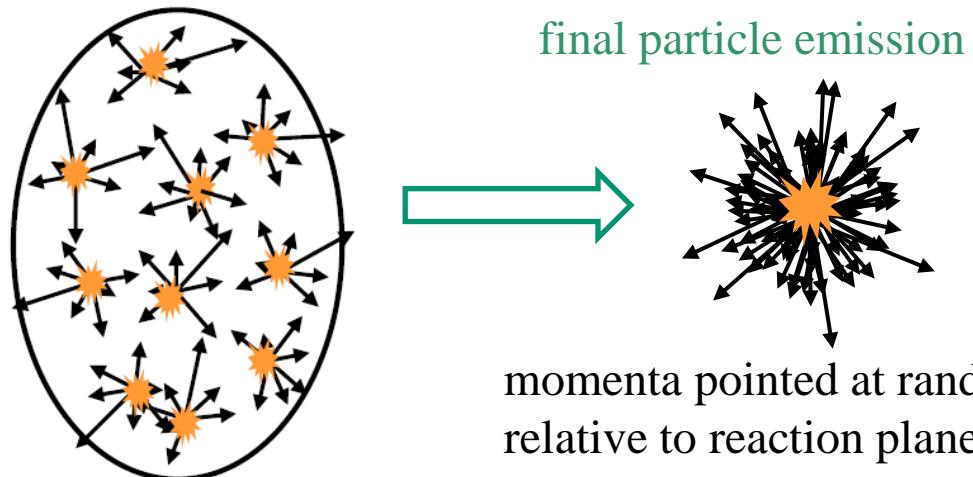
Input: “EOS”  $\varepsilon = \varepsilon(p)$  initial and final conditions

Bjorken appro. :  $v_z = z/t$  reduces (3+1)-d hydro to (2+1)-d hydro

# Collective expansion

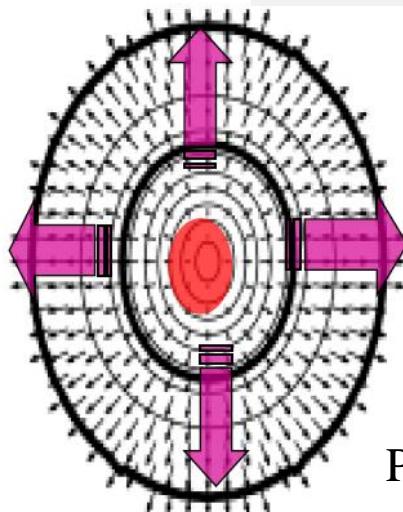


## Superposition of independent p+p:

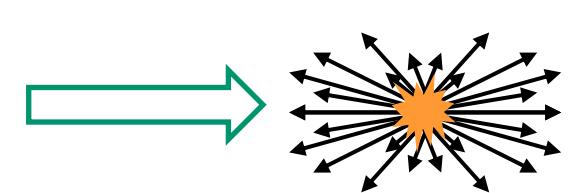


momenta pointed at random  
relative to reaction plane

## Evolution as a bulk system



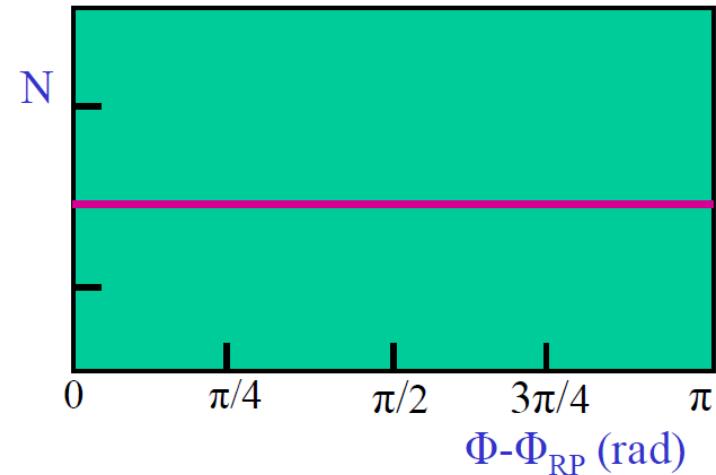
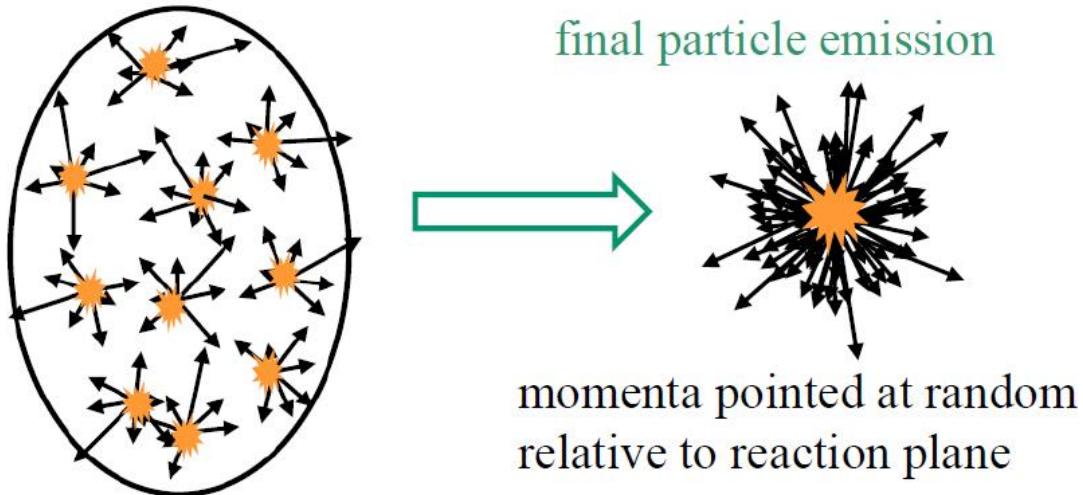
final particle emission



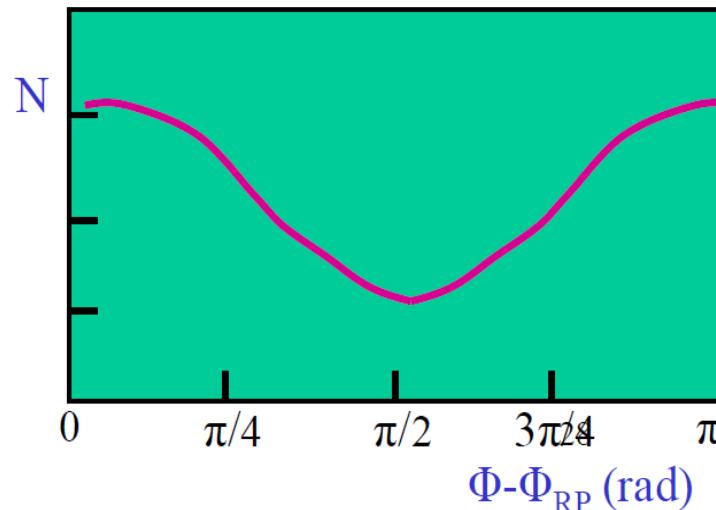
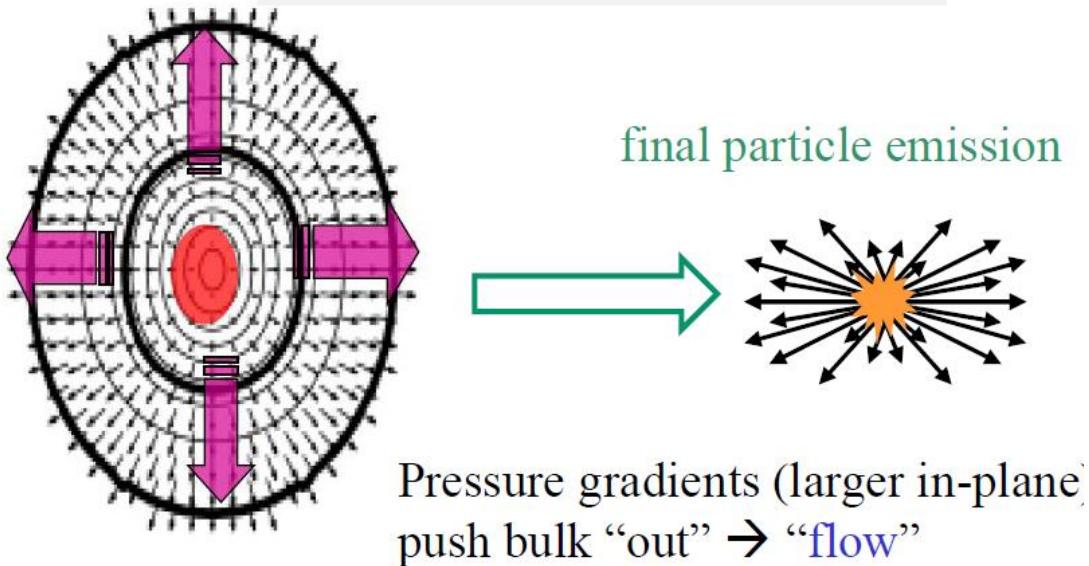
Pressure gradients (larger in-plane)  
push bulk “out” → “flow”

# Azimuthal distributions

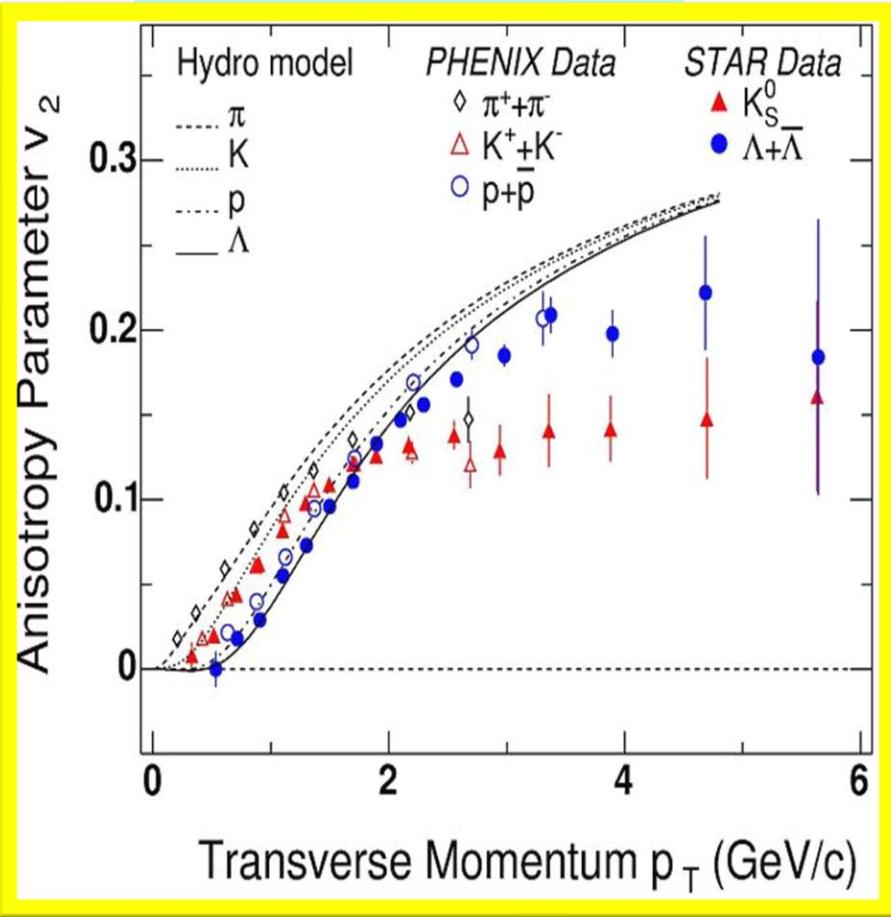
## Superposition of independent p+p:



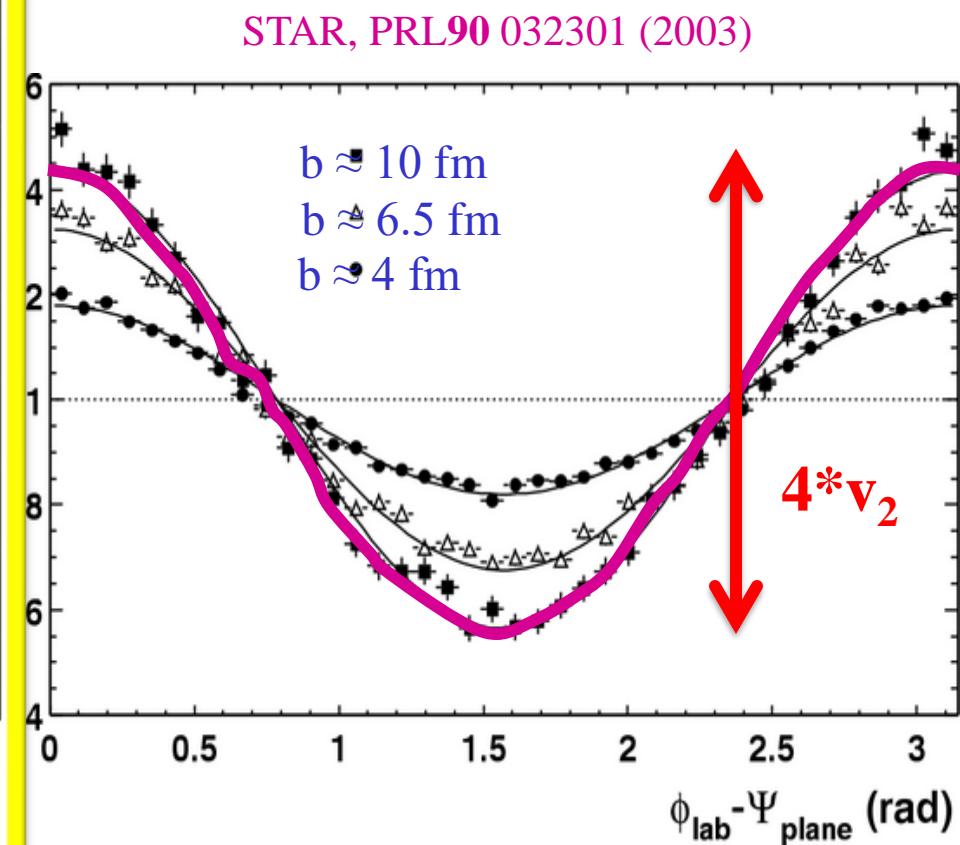
## Evolution as a bulk system



# Elliptic Flow

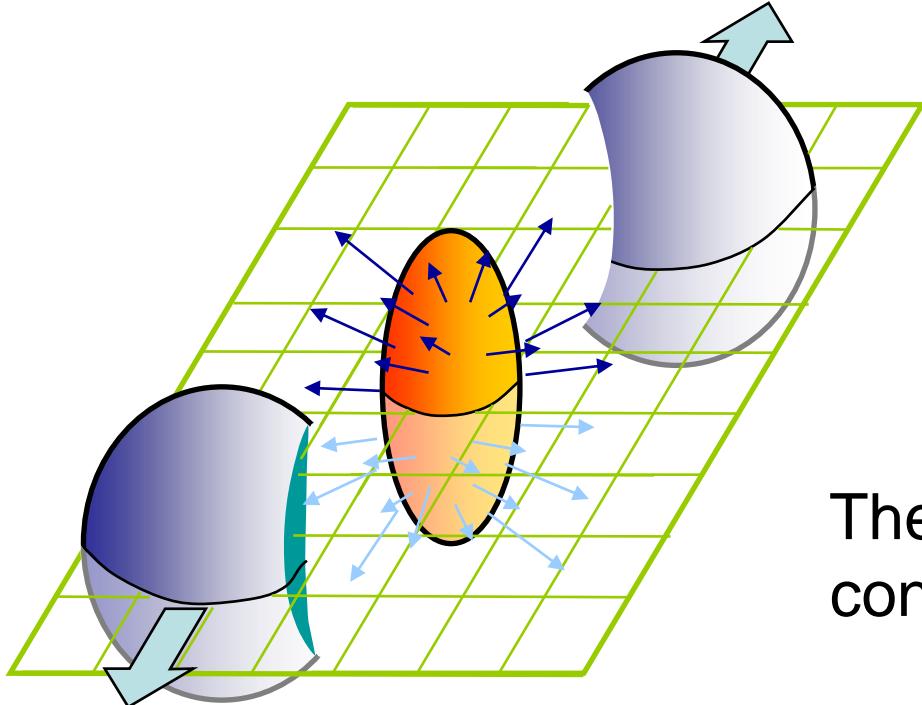


# Azimuthal distributions



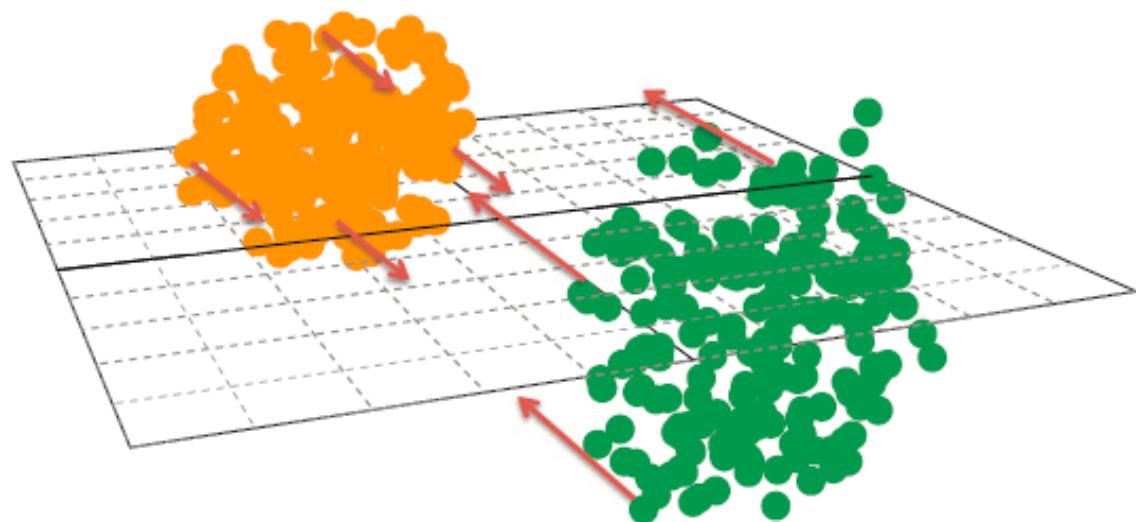
$$E \frac{dN}{d^3p} = \frac{dN}{dyp_T dp_T d\varphi} = \frac{1}{2\pi} \frac{dN}{dyp_T dp_T} [1 + 2v_2(p_T, b)\cos(2\varphi) + \dots]$$

Instead of two smooth colliding nuclei

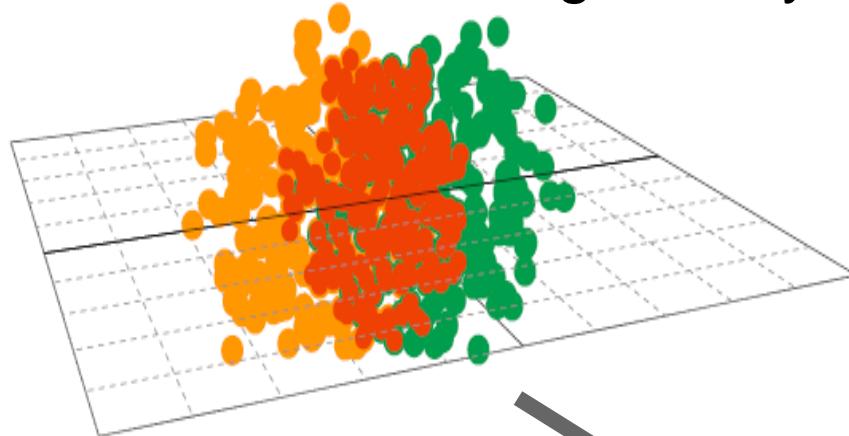


## Initial stage fluctuations

The position of initial nucleons constantly fluctuate

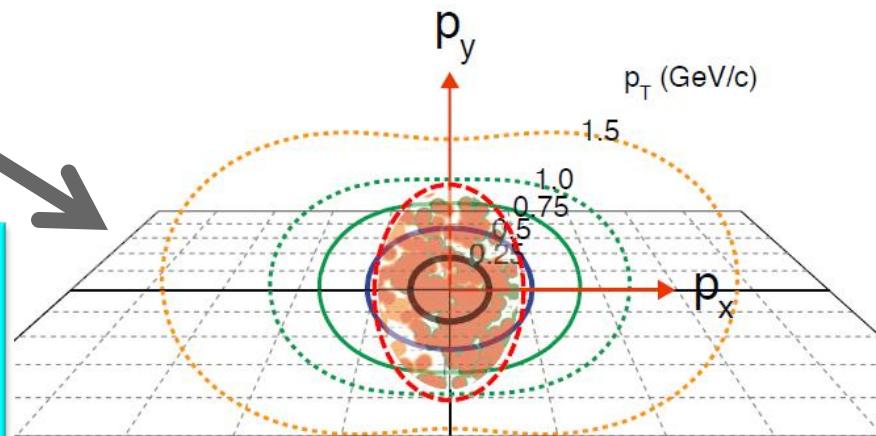
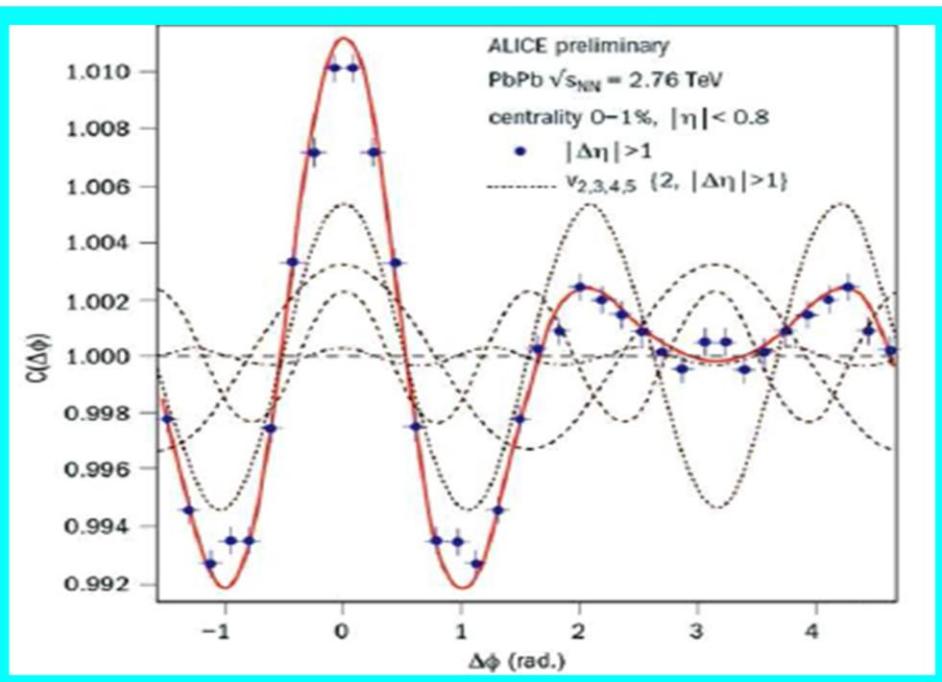


# QGP with fluctuating density

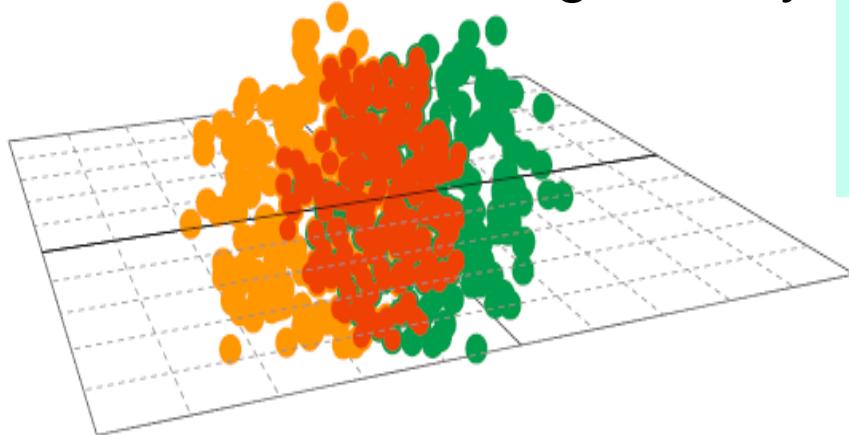


Azimuthal distribution in p-space

→ measured flow:  $v_n$

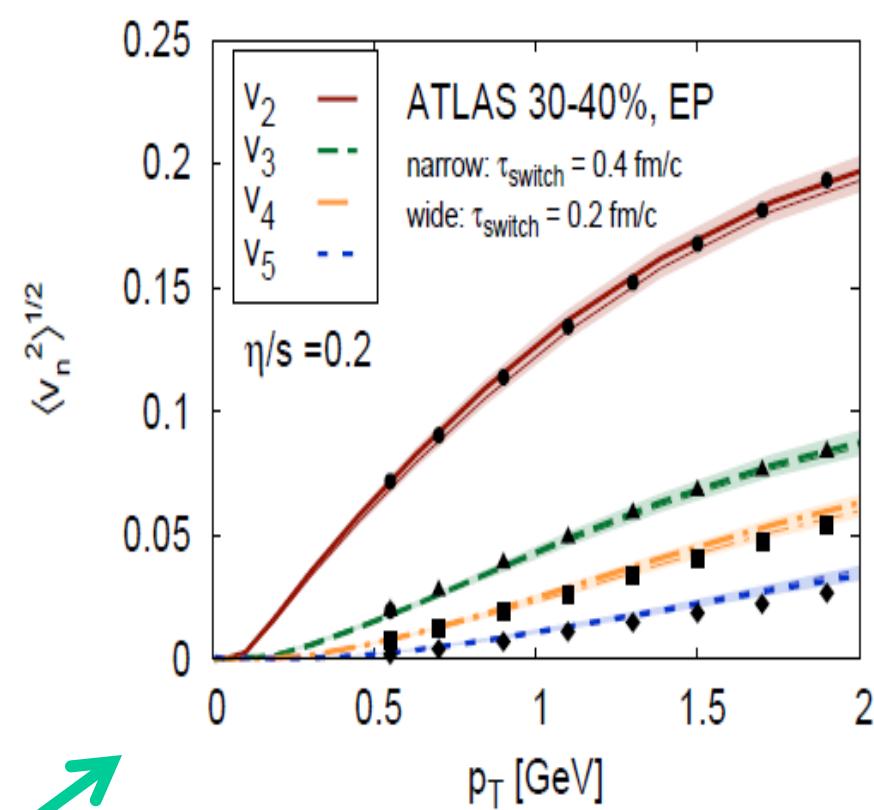
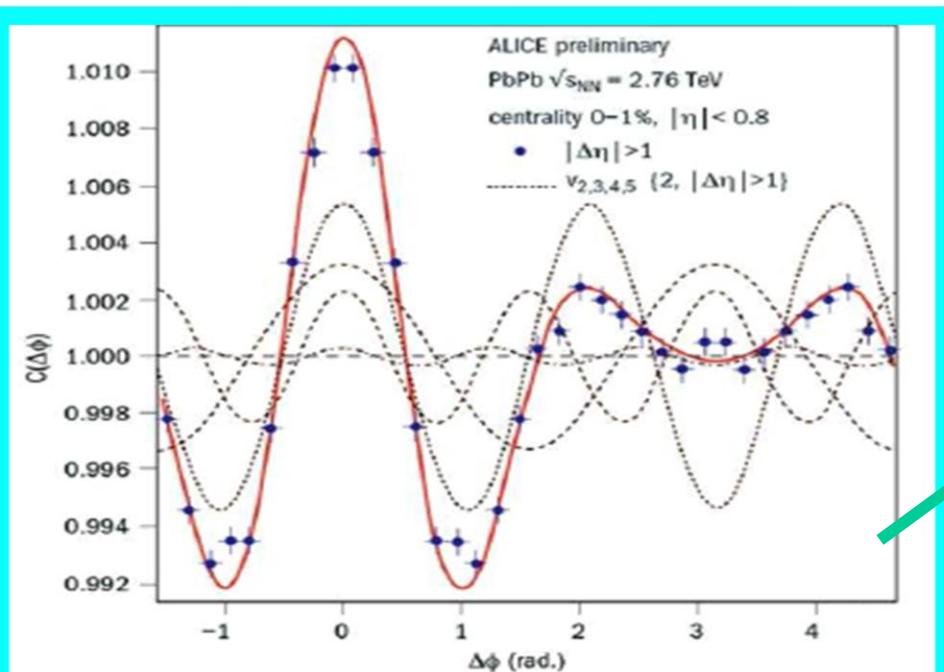


# QGP with fluctuating density



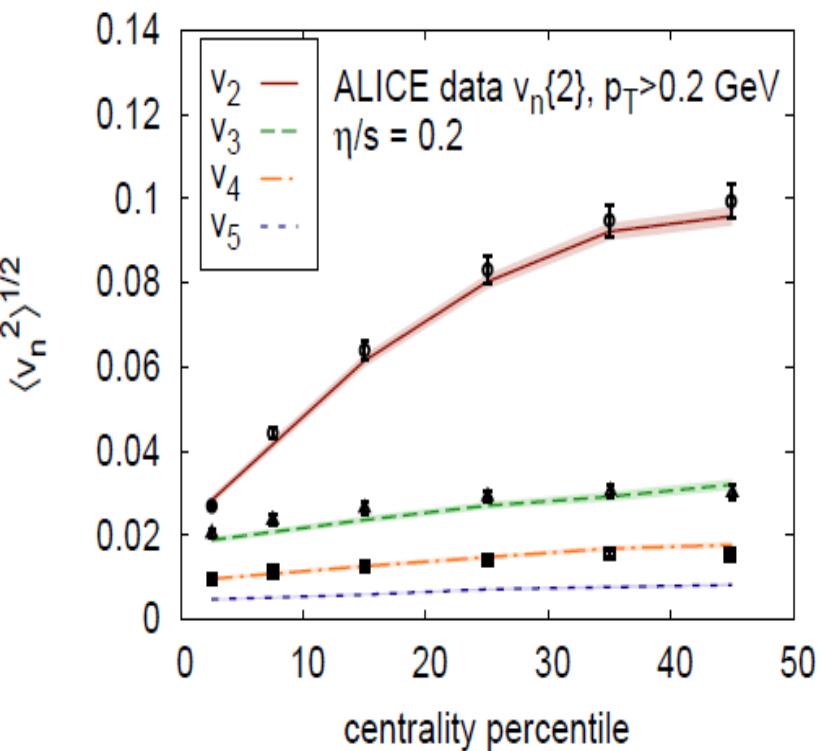
## Elliptic Flow & higher order flow harmonics

→ measured flow:  $v_n$



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

# The Success of Hydrodynamics in Pb+Pb collisions



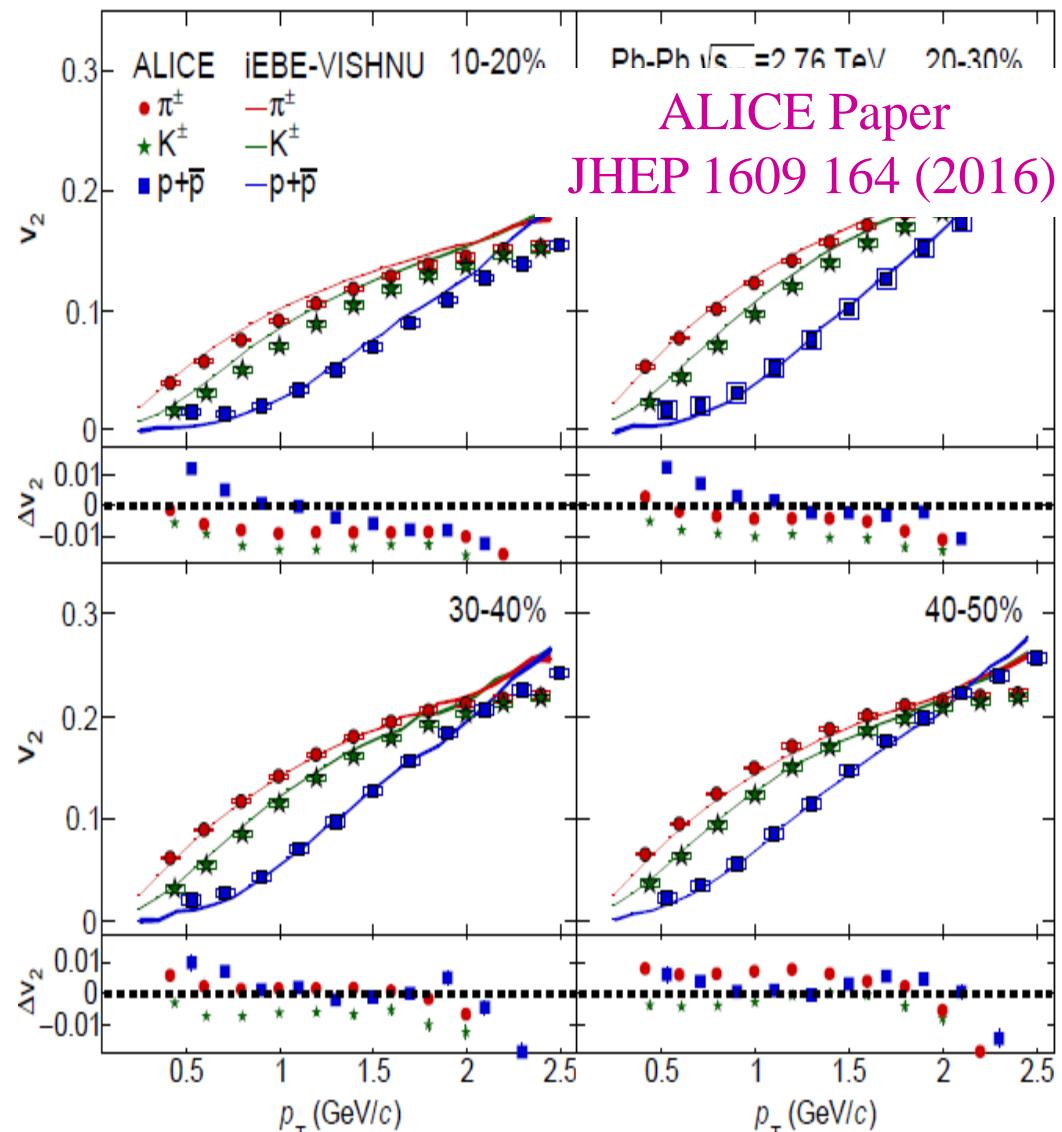
-Hydro + IP-Glasma

Gale, et. Al, PRL2013

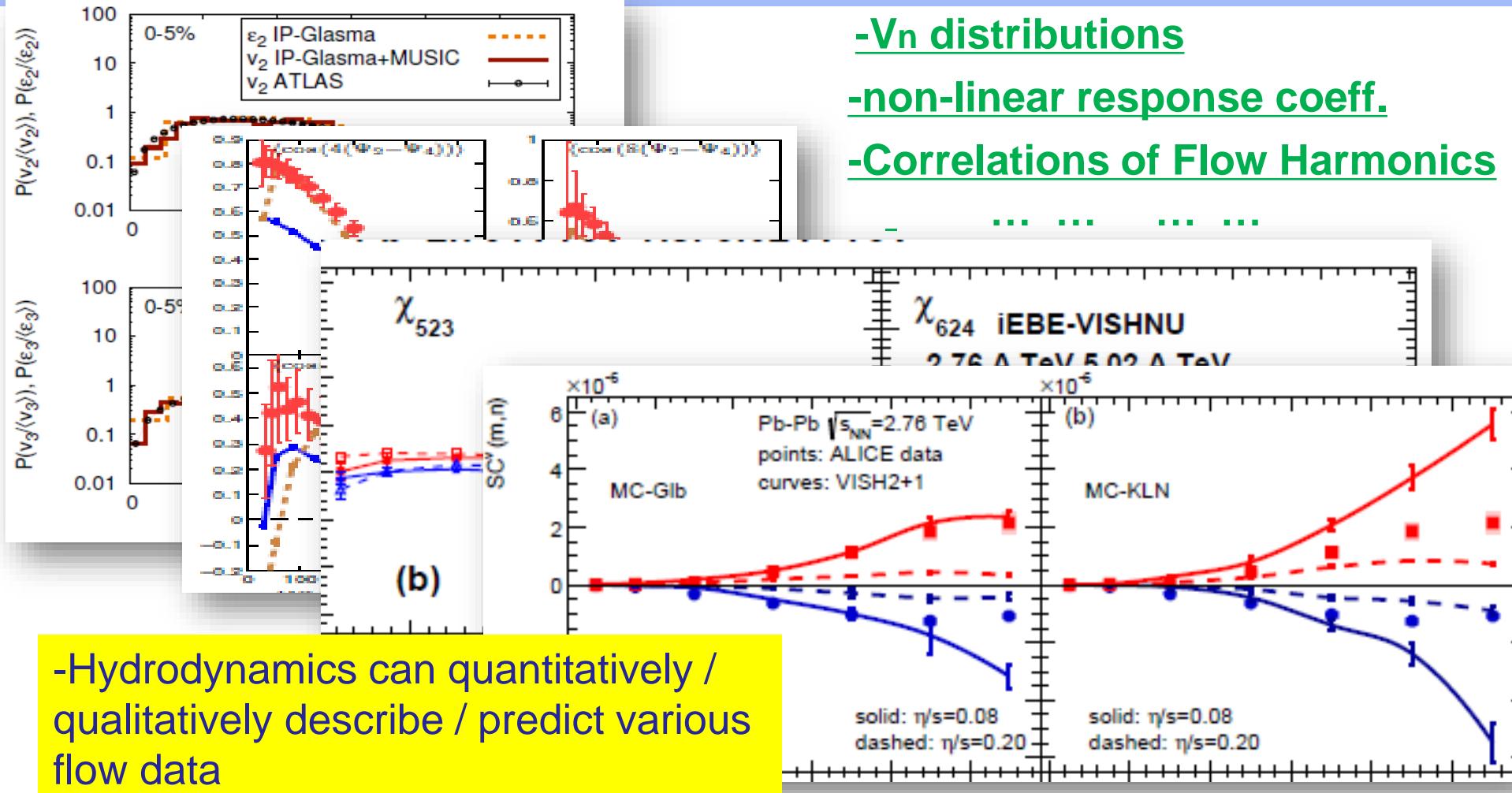
-iEBE-VISHNU + AMPT

Xu, Li, H. S\*, PRC 2016

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



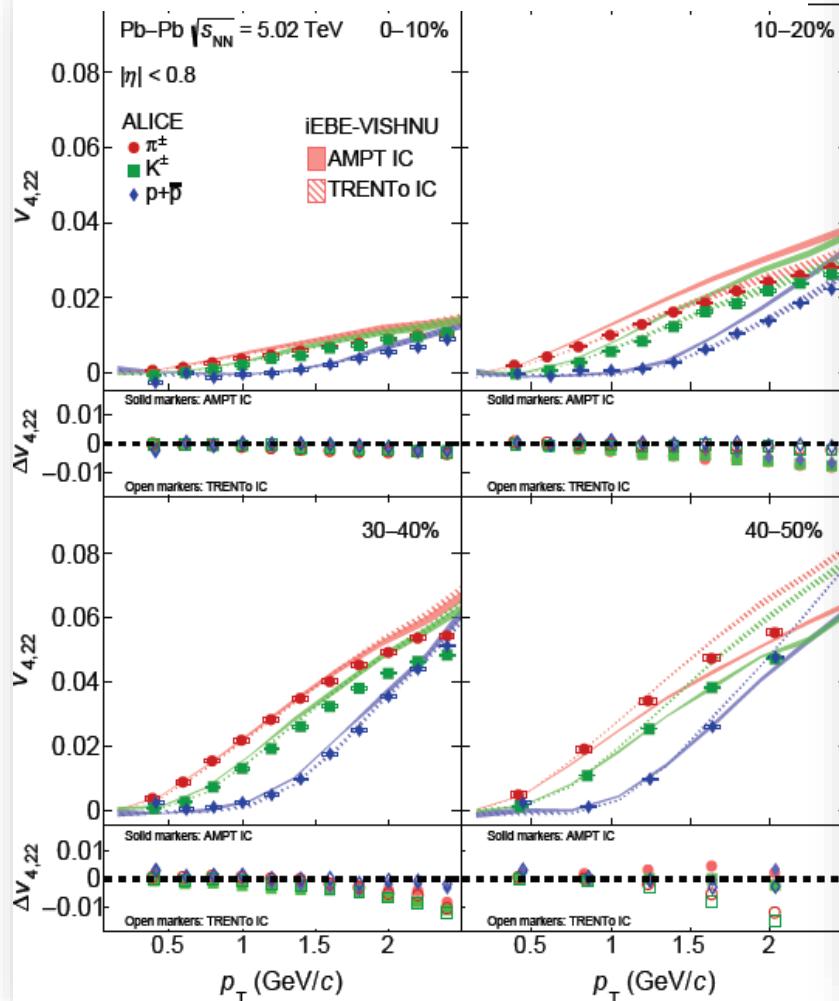
# Various Flow Predictions from Hydrodynamics



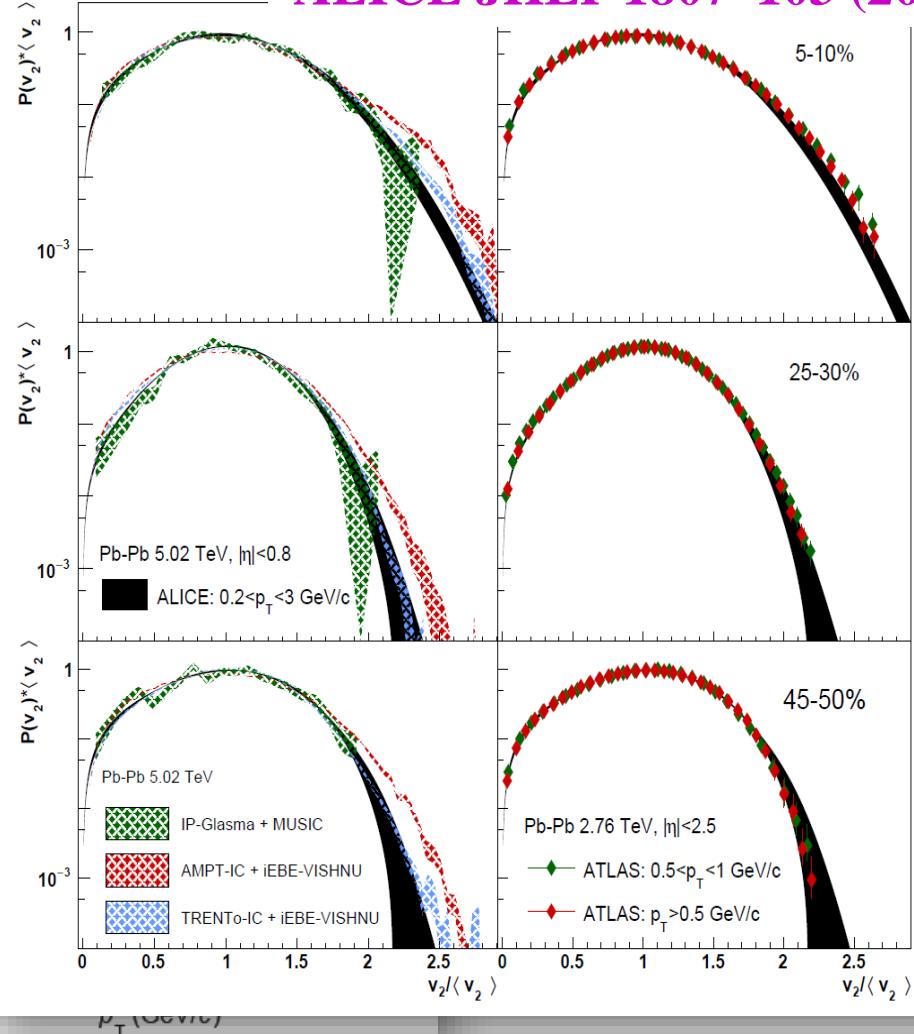
H. Xu, Z. Li and H. S\*, Phys. Rev. C93, no. 6, 064905 (2016); W. Zhao, H. Xu and H. S\*, Eur. Phys. J. C 77, no. 9, 645 (2017); X. Zhu, Y. Zhou, H. Xu and H. S\*, Phys. Rev. C95, no. 4, 044902 (2017); W. Zhao, L. Zhu, H. Zheng, C. M. Ko and H. S\*, Phys. Rev. C 98, no. 5, 054905 (2018); Li, Zhao, Zhou,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

# Predictions from Hydro & Comparison with EXP data

**ALICE JHEP 1809 006 (2018)**



**ALICE JHEP 1807 103 (2018)**



**iEBE-VISHNU calculations:** W. Zhao, H. Xu and **H. S\***, EPJC 77, no. 9, 645 (2017)

**ALICE measurements:** JHEP 1807 103 (2018); JHEP 1809 006 (2018), etc

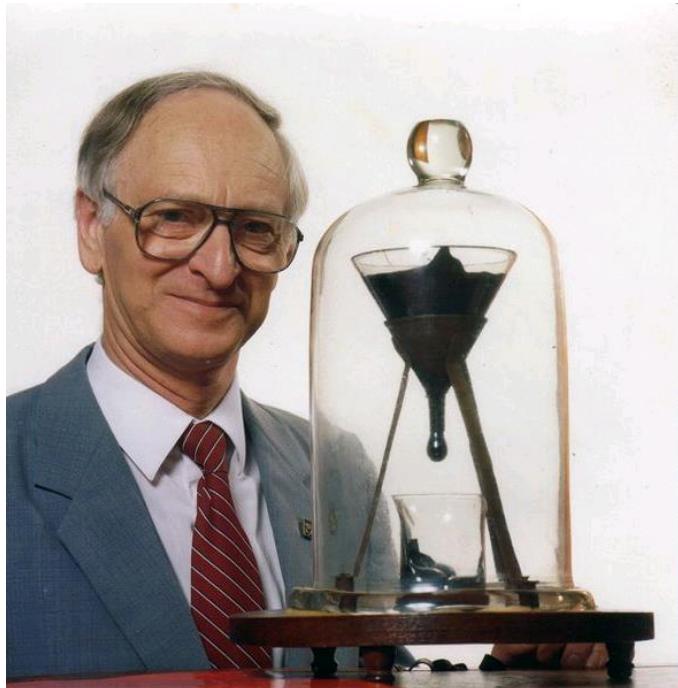
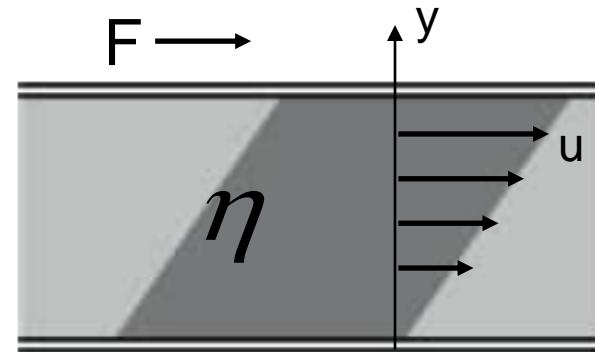
# The viscosity of the QGP



# Shear Viscosity

-classical definition:

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



## A super viscous liquid - Pitch

Pitch has viscosity approximately 230 billion times that of water.

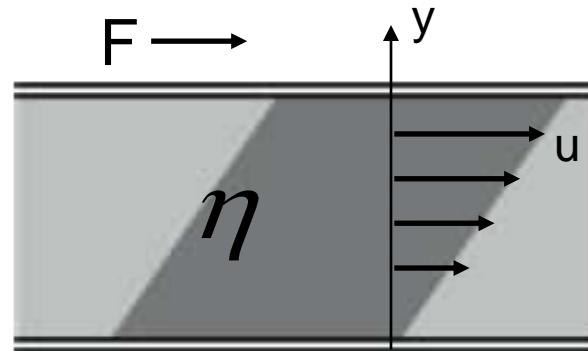
Longest running experiment (1927-present)  
8 drops so far, none ever seen fall!

[http://en.wikipedia.org/wiki/Pitch\\_drop\\_experiment](http://en.wikipedia.org/wiki/Pitch_drop_experiment)

# Lowest bound of specific shear viscosity

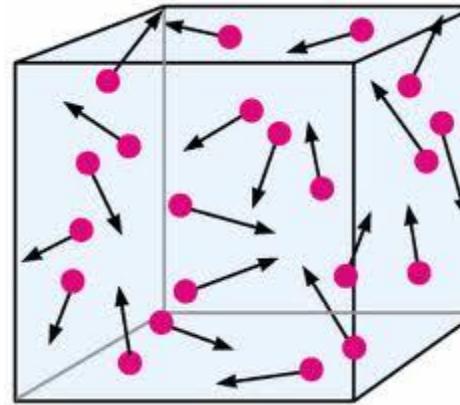
-classical definition:

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



-kinetic theory:

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



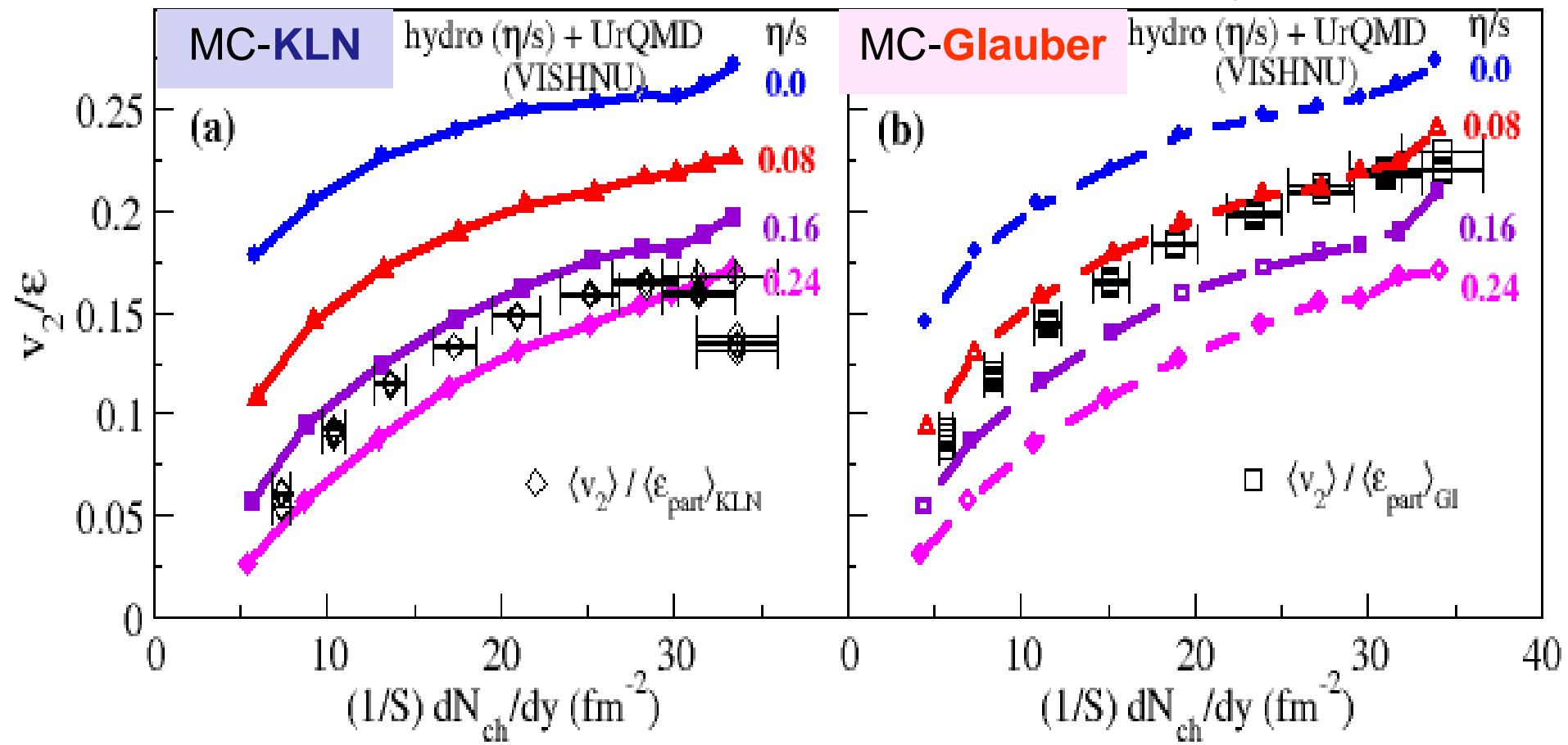
$$\frac{\eta}{s} \sim \frac{1}{k_B} \bar{v} m l_{mfp} \sim \frac{1}{k_B} \left( \frac{1}{2} m \bar{v}^2 \right) \left( \frac{l_{mfp}}{\bar{v}} \right) \sim \frac{e \tau}{k_B} \quad (s \sim k_B n)$$

uncertainty principle:  $\rightarrow$

$$\frac{\eta}{s} \geq \frac{h}{k_B}$$

# Extracting QGP viscosity with hydrodynamical model

H. Song,et.al, PRL2011



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

# Extract QGP properties from bulk observ.

-massive data evaluation

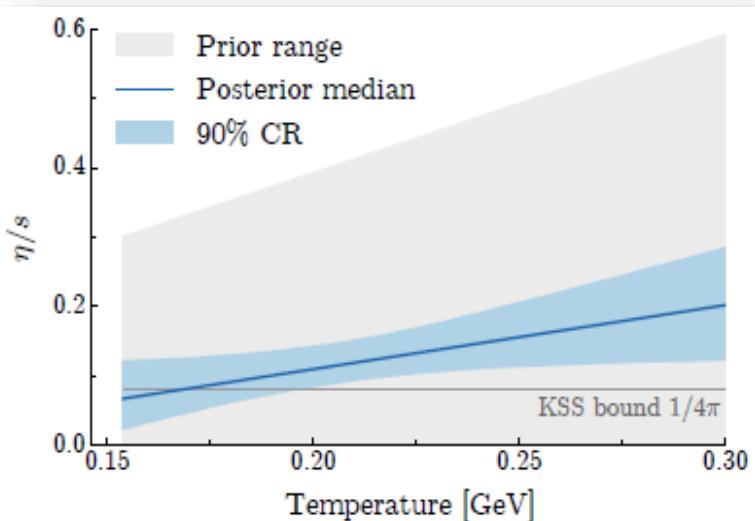
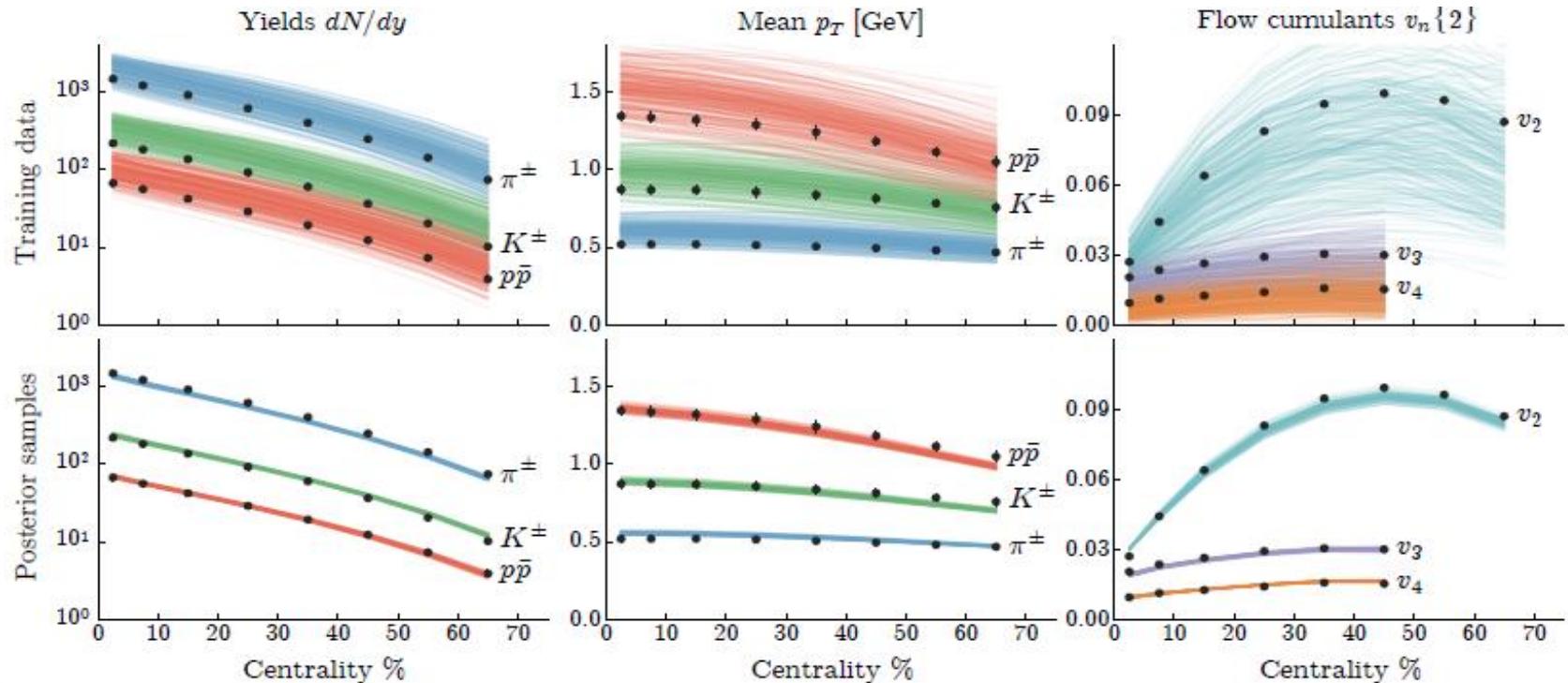
## Exp Observables

- particle yields
  - spectra
  - elliptic flow
  - triangular flow & higher order flow harmonics
  - event by event  $v_n$  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 extract the QGP viscosity

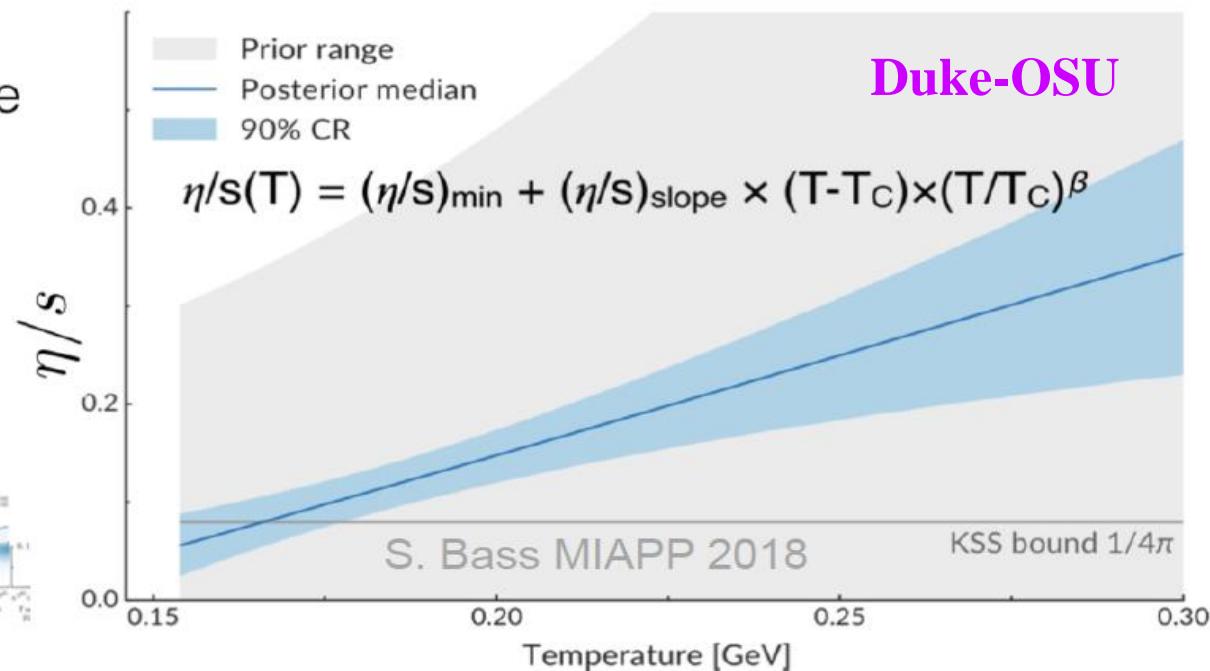
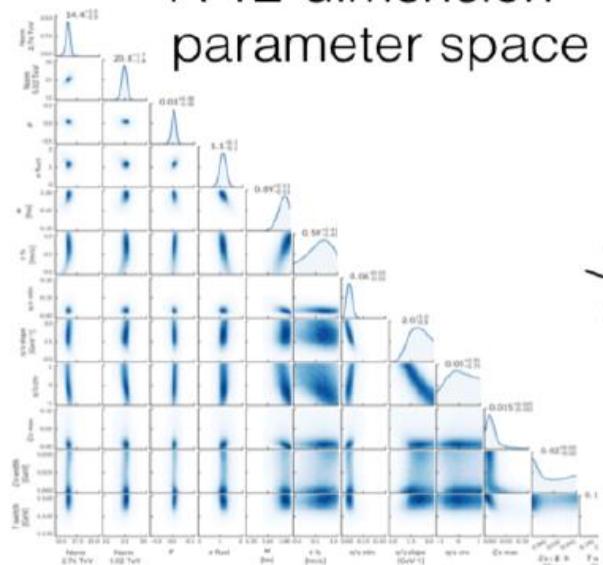


- An quantitatively extraction of the QGP viscosity with iEBE-VISHNU and the massive data evaluation
- $\eta/s(T)$  is very close to the KSS bound of  $1/4\pi$

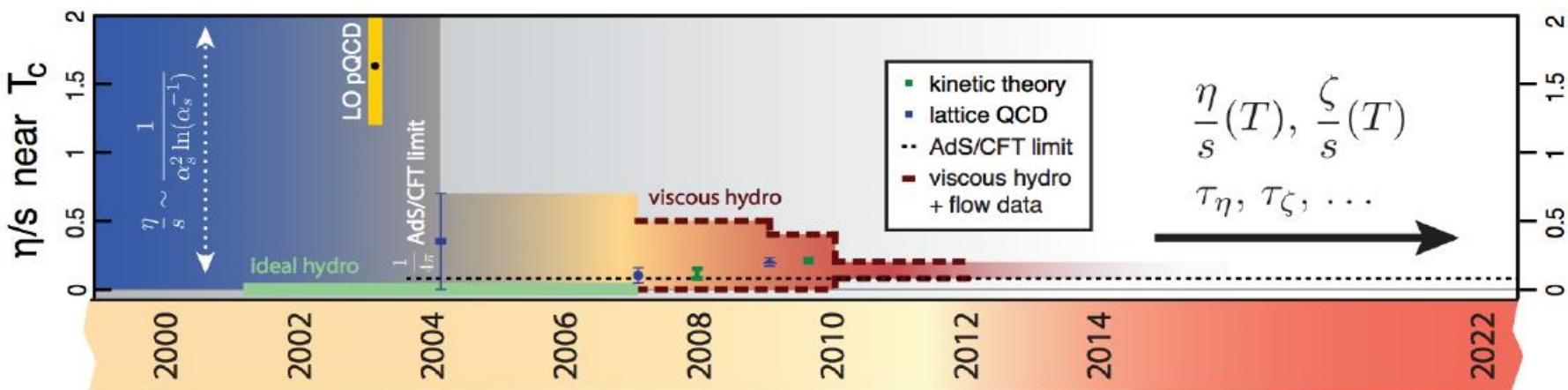
J. Bernhard, S. Moreland, S.A. Bass,  
J. Liu, U. Heinz, PRC 2015

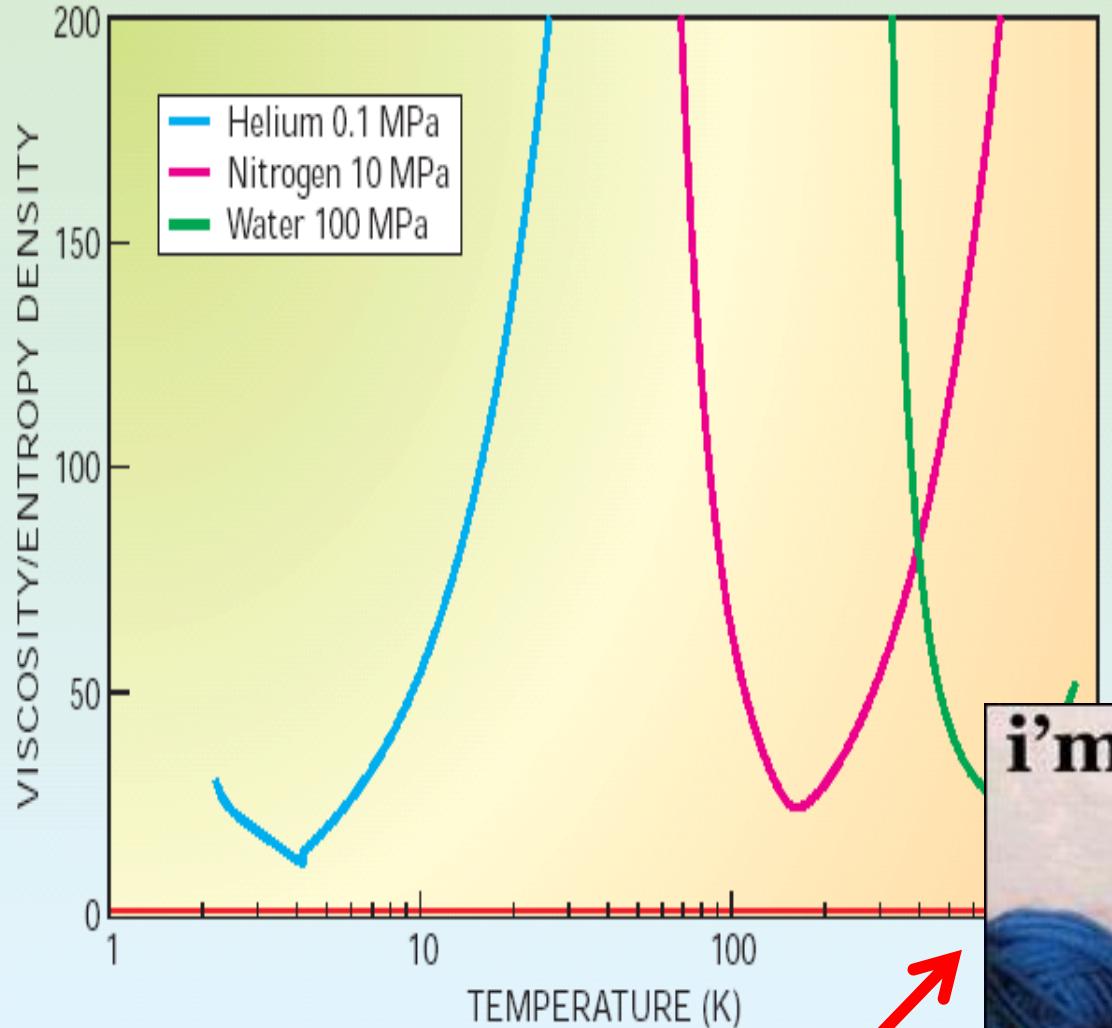
# Extracting QGP viscosity with massive data evaluation

A 12-dimension parameter space



## Extracted QGP viscosity with ever increasing precision





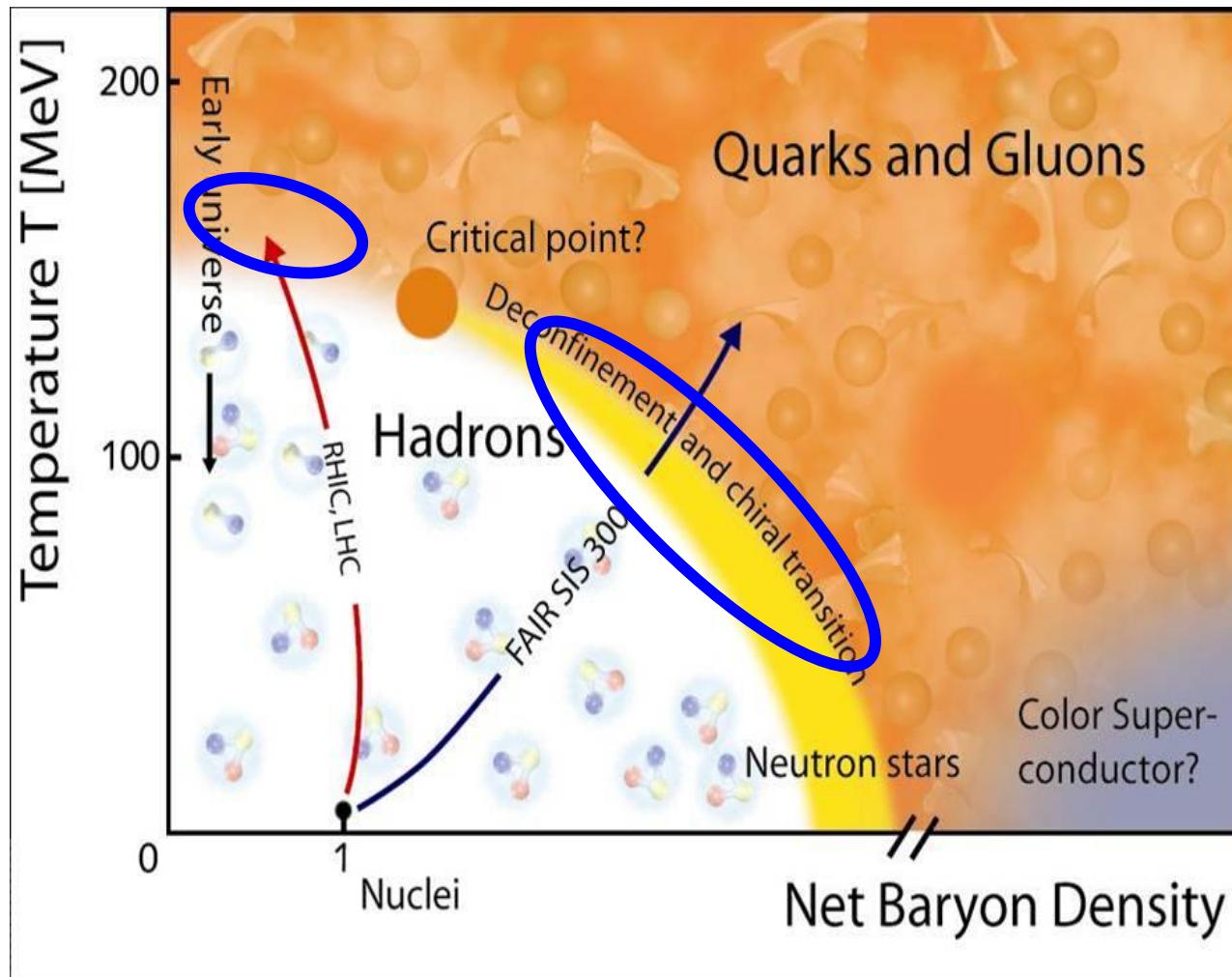
QGP specific shear viscosity  
Extracted from exp data



AdS/CFT  $\rightarrow$

$$\frac{\eta}{s} \geq \frac{h}{k_B}$$

# Dynamical models at various collision energy & system sizes



# Recent development of hybrid model for RHIC BES

## Dynamical initial conditions

$$\partial_\mu T^{\mu\nu} = J_{\text{source}}^\nu$$

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

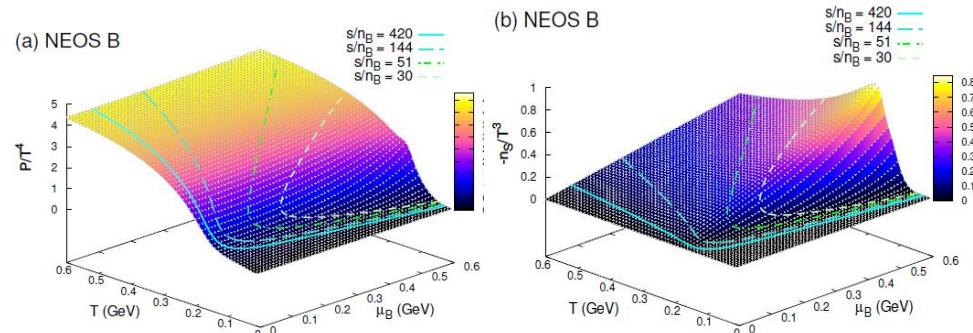
C. Shen and B. Schenke, Phys. Rev. C97 (2018) 024907

## Net baryon diffusion

$$\begin{aligned} \Delta^{\mu\nu} D q_\nu &= -\frac{1}{\tau_q} \left( q^\mu - \kappa_B \nabla^\mu \frac{\mu_B}{T} \right) - \frac{\delta_{qq}}{\tau_q} q^\mu \theta - \frac{\lambda_{qq}}{\tau_q} q_\nu \sigma^{\mu\nu} \\ &\quad + \frac{l_{q\pi}}{\tau_q} \Delta^{\mu\nu} \partial_\lambda \pi^\lambda{}_\nu - \frac{\lambda_{q\pi}}{\tau_q} \pi^{\mu\nu} \nabla_\nu \frac{\mu_B}{T}, \end{aligned} \quad (13)$$

$$\begin{aligned} \Delta_{\alpha\beta}^{\mu\nu} D \pi^{\alpha\beta} &= -\frac{1}{\tau_\pi} (\pi^{\mu\nu} - 2\eta \sigma^{\mu\nu}) \\ &\quad - \frac{\delta_{\pi\pi}}{\tau_\pi} \pi^{\mu\nu} \theta - \frac{\tau_{\pi\pi}}{\tau_\pi} \pi^\lambda \langle \sigma^\nu \rangle_\lambda + \frac{\phi_7}{\tau_\pi} \pi^{\langle\mu}{}_\alpha \pi^{\nu\rangle\alpha} \\ &\quad + \frac{l_{\pi q}}{\tau_\pi} \nabla^{\langle\mu} q^{\nu\rangle} + \frac{\lambda_{\pi q}}{\tau_\pi} q^{\langle\mu} \nabla^{\nu\rangle} \frac{\mu_B}{T}. \end{aligned} \quad (14)$$

## EoS with finite $T$ & $\mu$

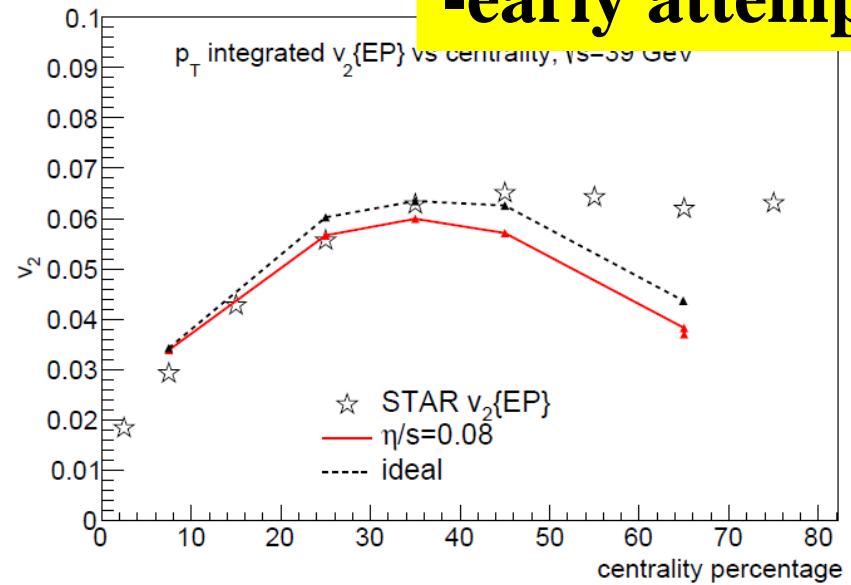
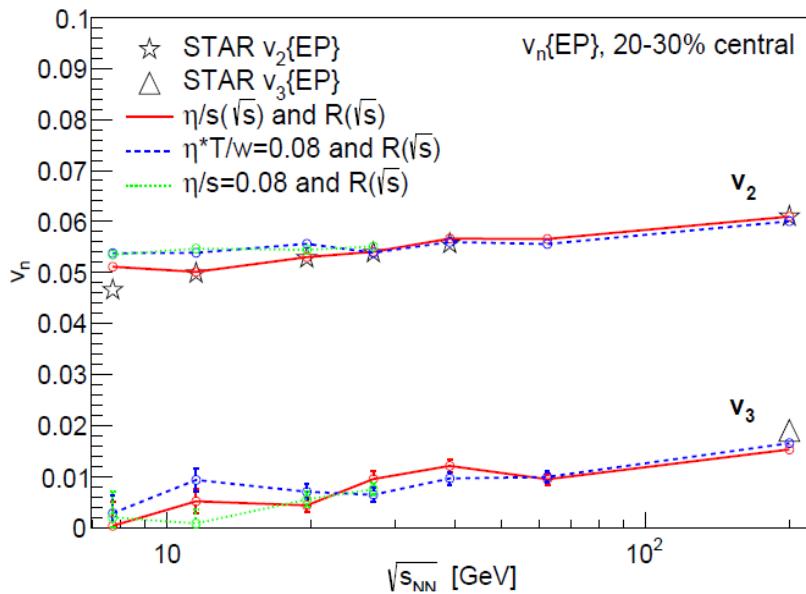


A. Monnai, B. Schenke and C. Shen, arXiv:1902.05095 [nucl-th].

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)

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

-early attempt



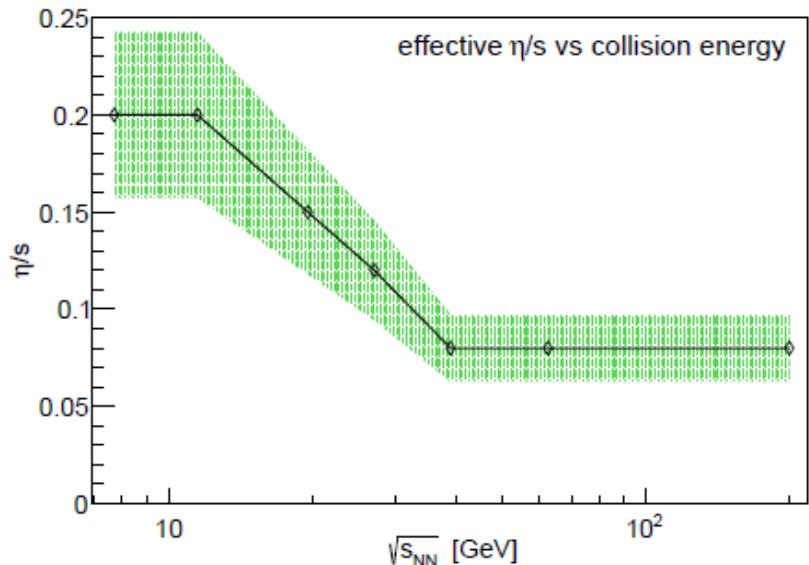
## Data

- RHIC BES Au+Au 7.7-200 A GeV

## Model

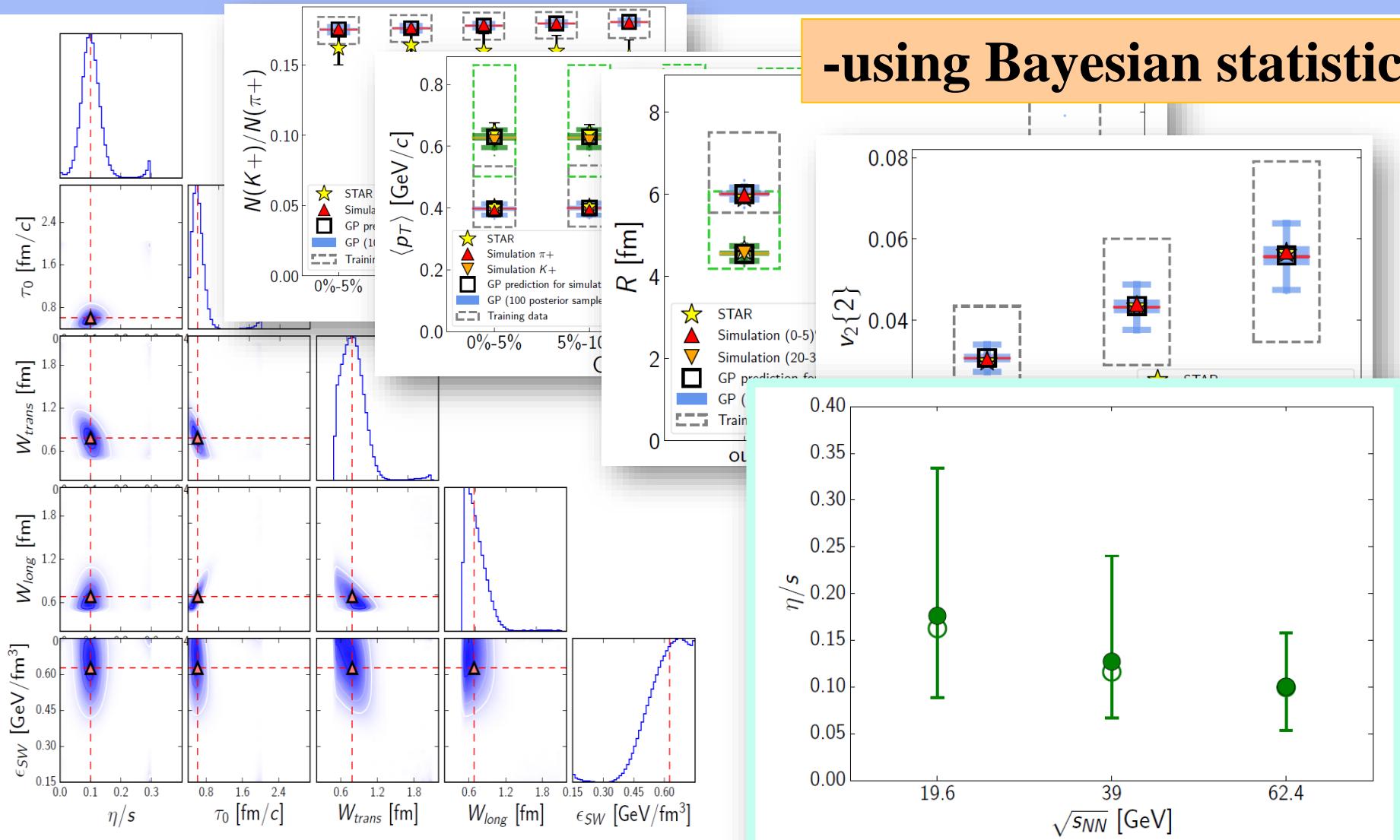
- 3+1d viscous hydro + UrQMD
- pre-equilibrium stage UrQMD
- EoS (Chiral Model with T,  $\mu$ )

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)

-using Bayesian statistics



**Future:**  
 $\eta/s(T,\mu)$   $\zeta/s(T,\mu)$

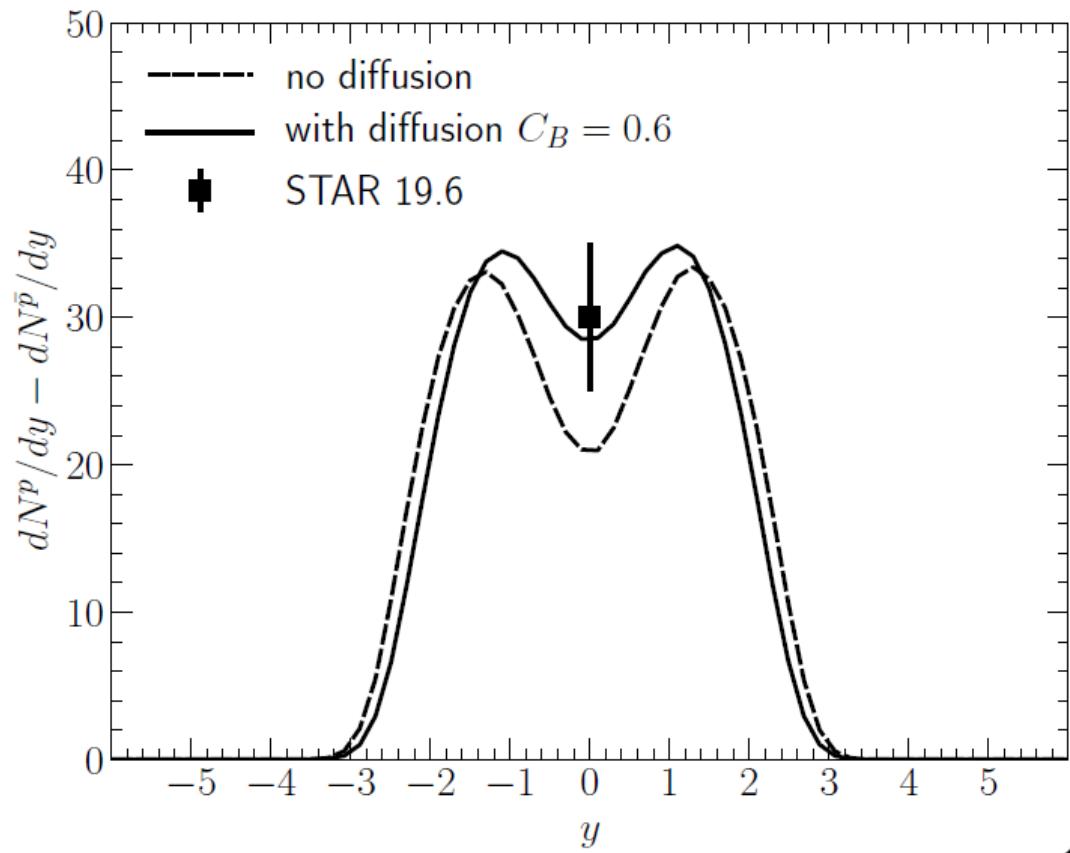
J. Auvinen, J. E. Bernhard, S. A. Bass and I. Karpenko, Phys. Rev. C97, no. 4, 044905 (2018)

# Effects of heat conductivity

## Net baryon diffusion

$$\Delta^{\mu\nu} D q_\nu = -\frac{1}{\tau_q} \left( q^\mu - \kappa_B \nabla^\mu \frac{\mu_B}{T} \right) - \frac{\delta_q}{\tau_q} + \frac{l_{q\pi}}{\tau_q} \Delta^{\mu\nu} \partial_\lambda \pi^\lambda{}_\nu - \frac{\lambda_{q\pi}}{\tau_q} \pi^{\mu\nu} \nabla$$

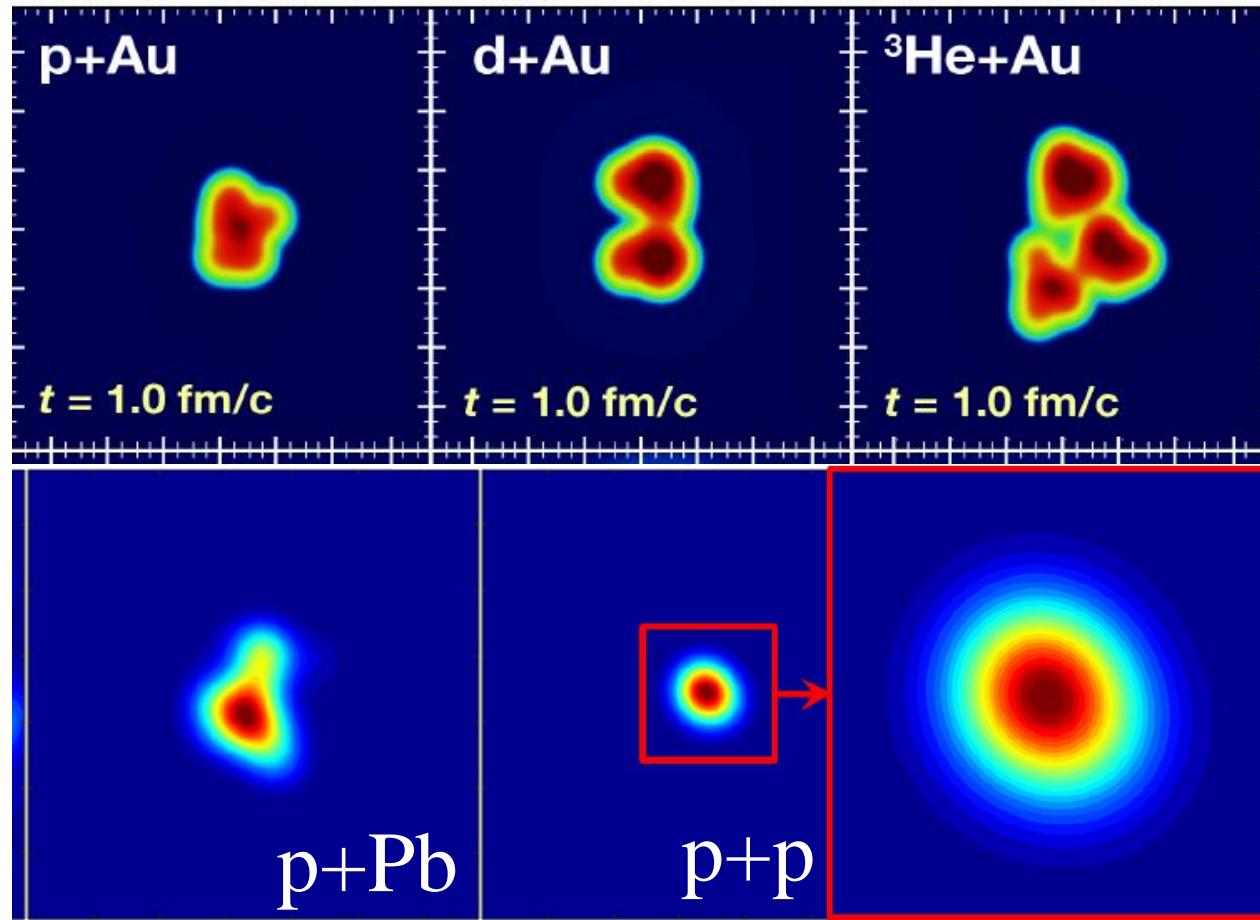
$$\Delta_{\alpha\beta}^{\mu\nu} D \pi^{\alpha\beta} = -\frac{1}{\tau_\pi} (\pi^{\mu\nu} - 2\eta\sigma^{\mu\nu}) - \frac{\delta_{\pi\pi}}{\tau_\pi} \pi^{\mu\nu} \theta - \frac{\tau_{\pi\pi}}{\tau_\pi} + \frac{l_{\pi q}}{\tau_\pi} \nabla^{\langle\mu} q^{\nu\rangle} + \frac{\lambda_{\pi q}}{\tau_\pi}$$



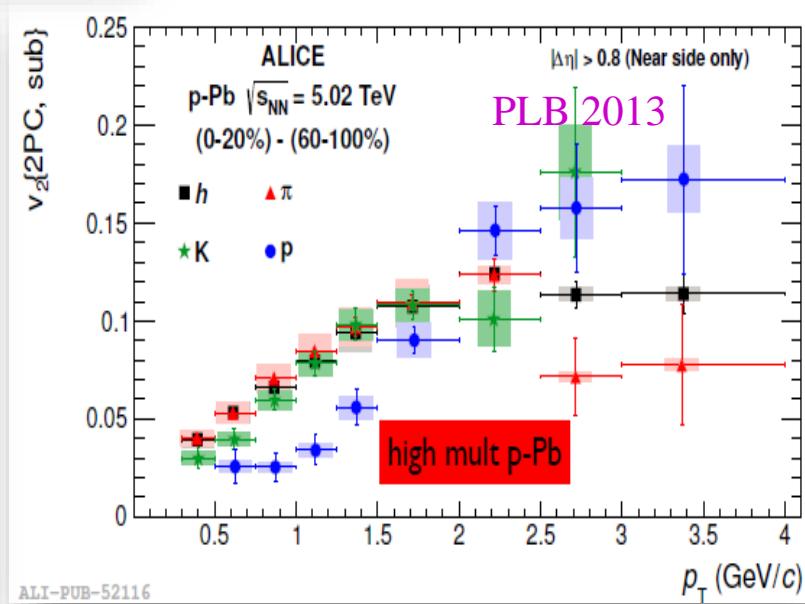
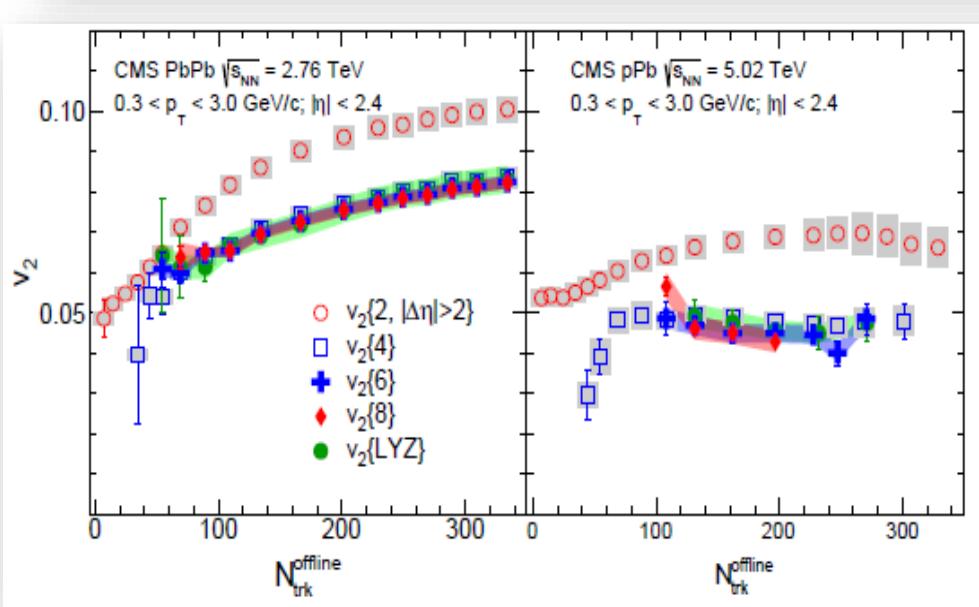
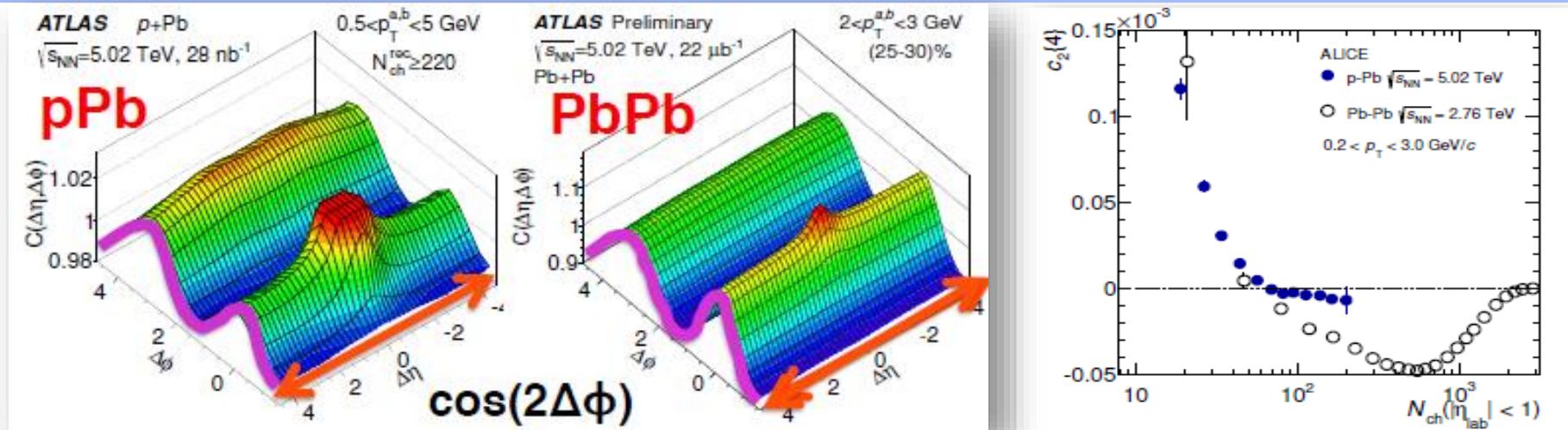
G. Denicol, C. Gale, S. Jeon, A. Monnai, B. Schenke and C. Shen, Phys. Rev. C98, 034916 (2018) ; M. Li and C. Shen, Phys. Rev. C98, 064908 (2018)

- Net baryon diffusion transports more baryon numbers to the mid-rapidity region
- Need a systematical study of various flow data in the near future
- Extracting heat conductivity in the future

# Collectively & QGP signatures in small systems

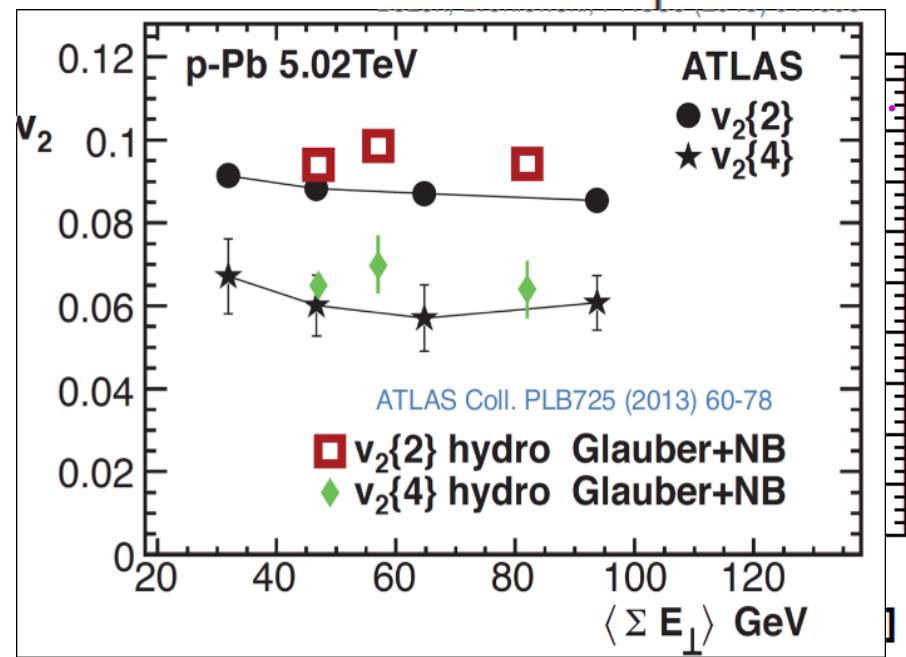
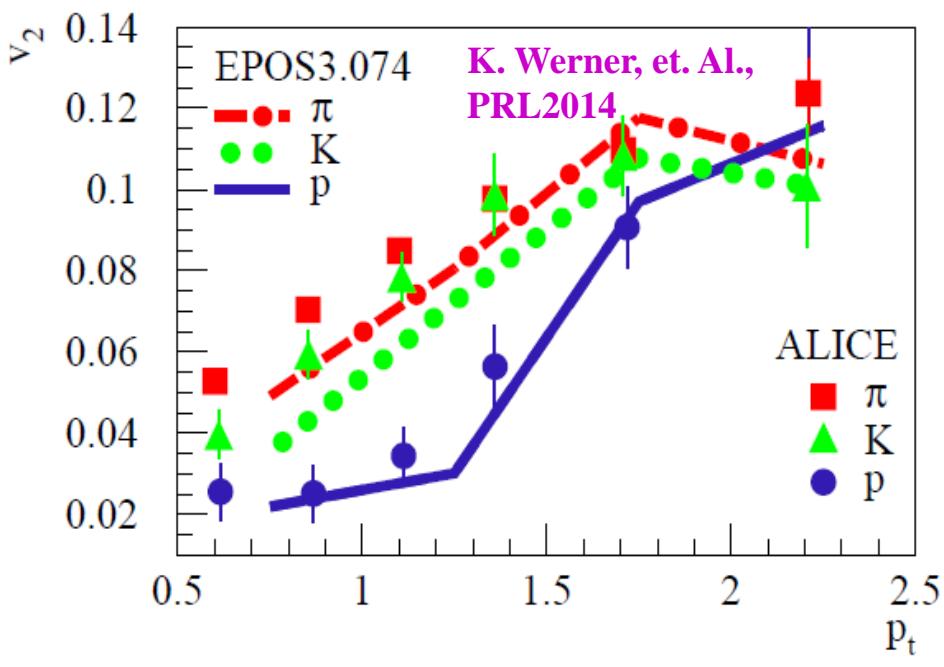
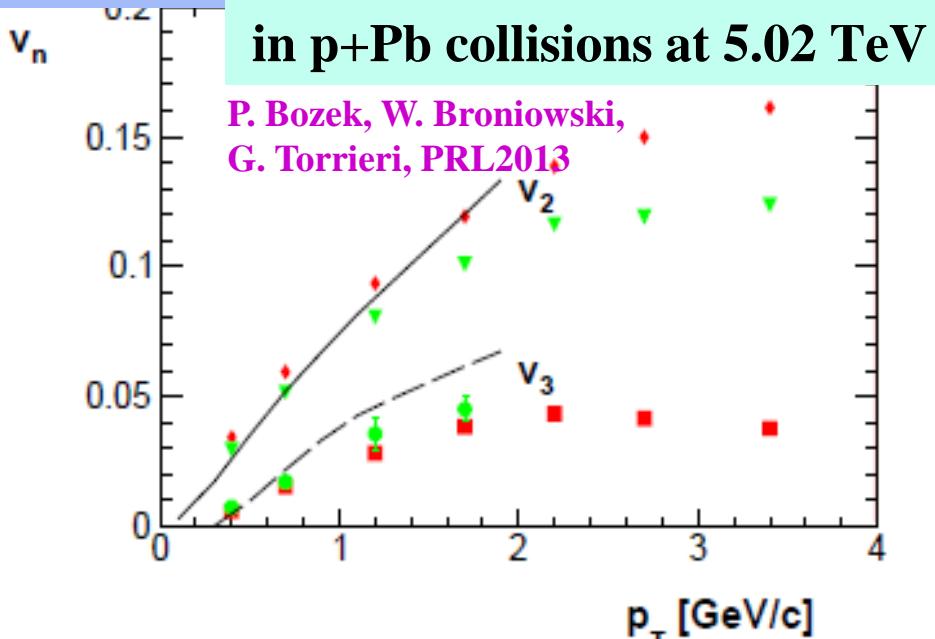
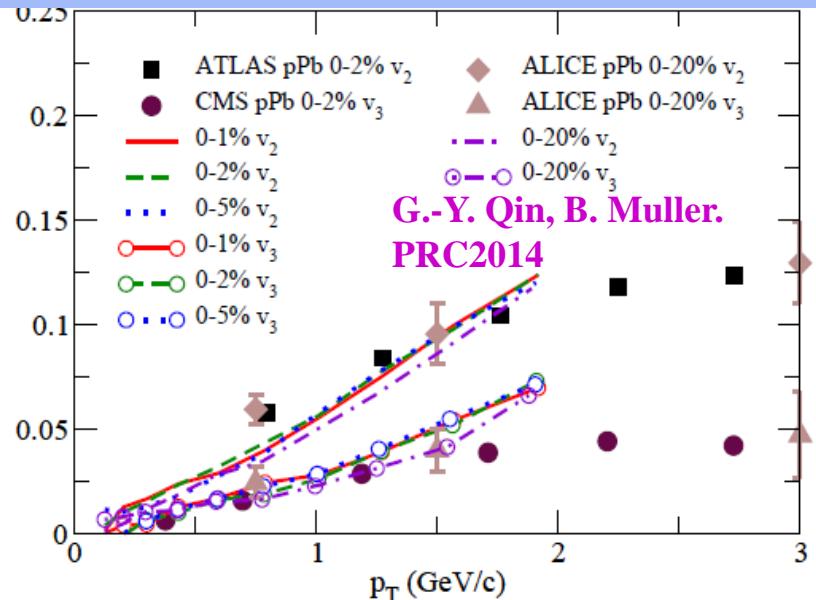


# Correlations & Flow in p-Pb collisions

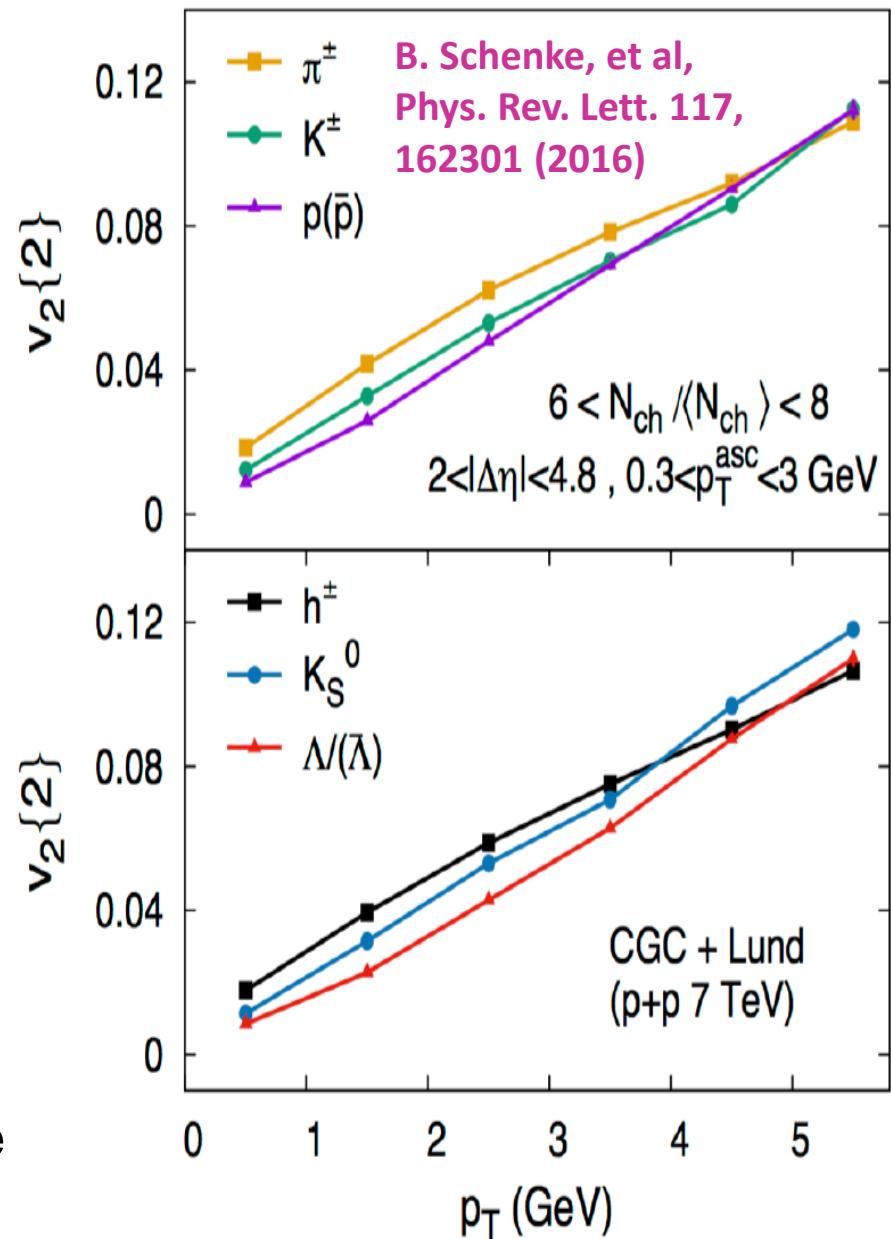
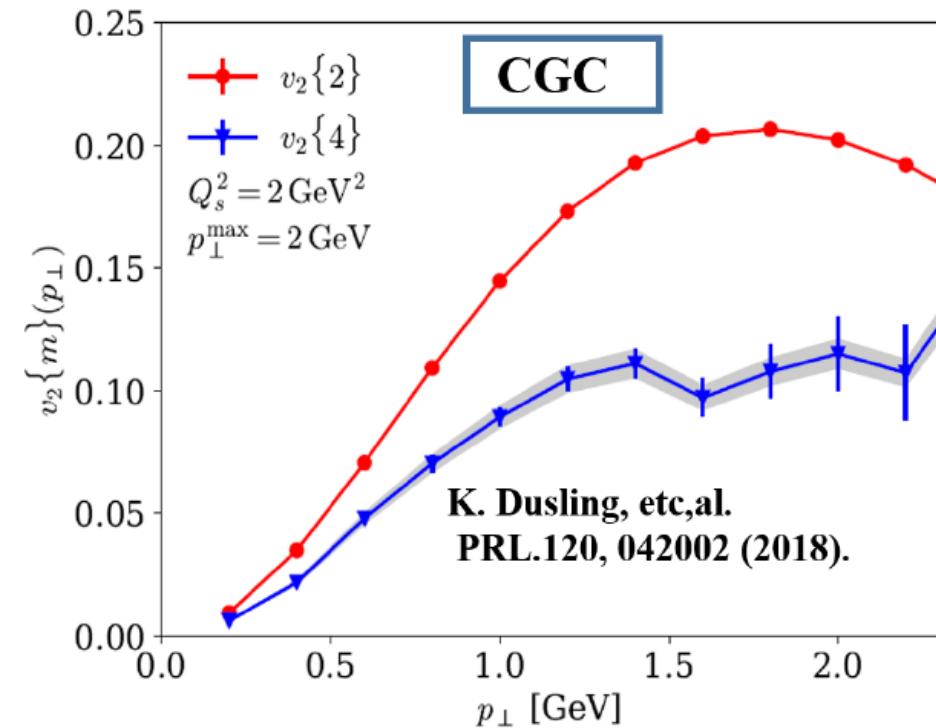


-Many flow-like signals have been observed in high multiplicity p-Pb collisions

# Flow in p-Pb -- Hydrodynamics Simulations

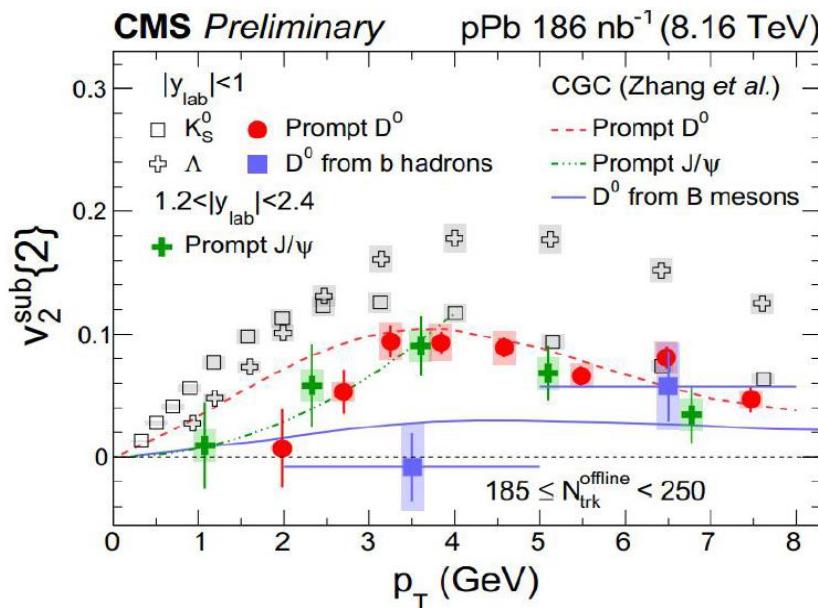
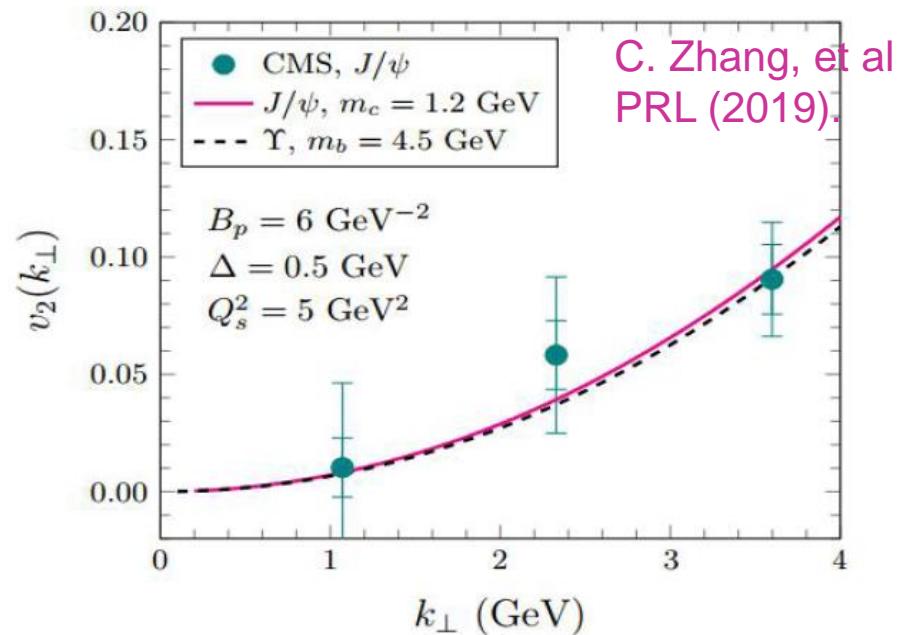
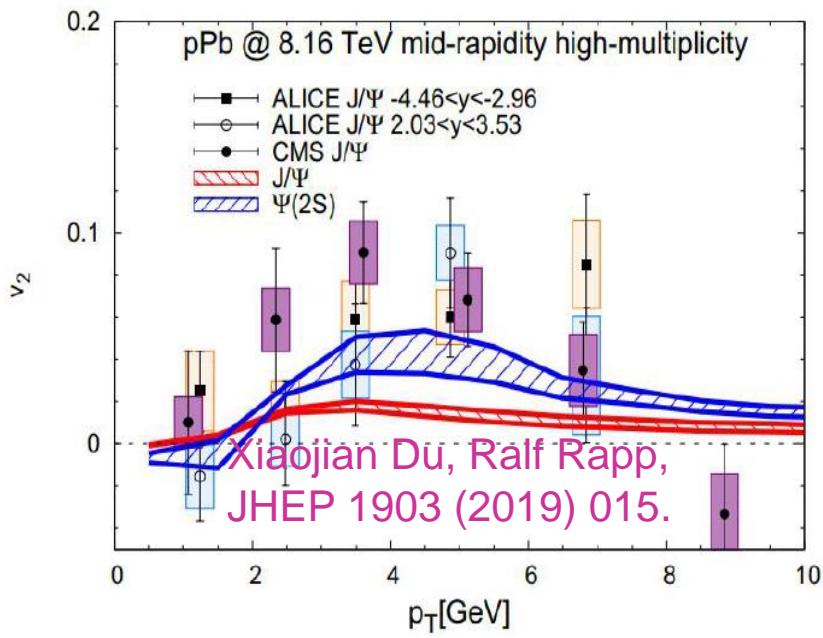


# Flow-like signals: initial state effects



- Qualitative features of  $v_2\{2\}$  and  $v_2\{4\}$  have been reproduced with the initial state model with localized domains of color charge
- Mass splitting can also be explained within CGC + Lund string fragmentation where the string gives the common boost

# Flow-like signals: Heavy quarkonia & open heavy flavor



- The observed  $v_2$  of  $J/\psi$  cannot be explained by final-state effects alone,
- Heavy quarkonia & open heavy flavor can have a significant  $v_2$  in  $p\text{Pb}$  due to azimuthal angular correlations from the initial state effects (CGC).

# Initial state or Final state effects?

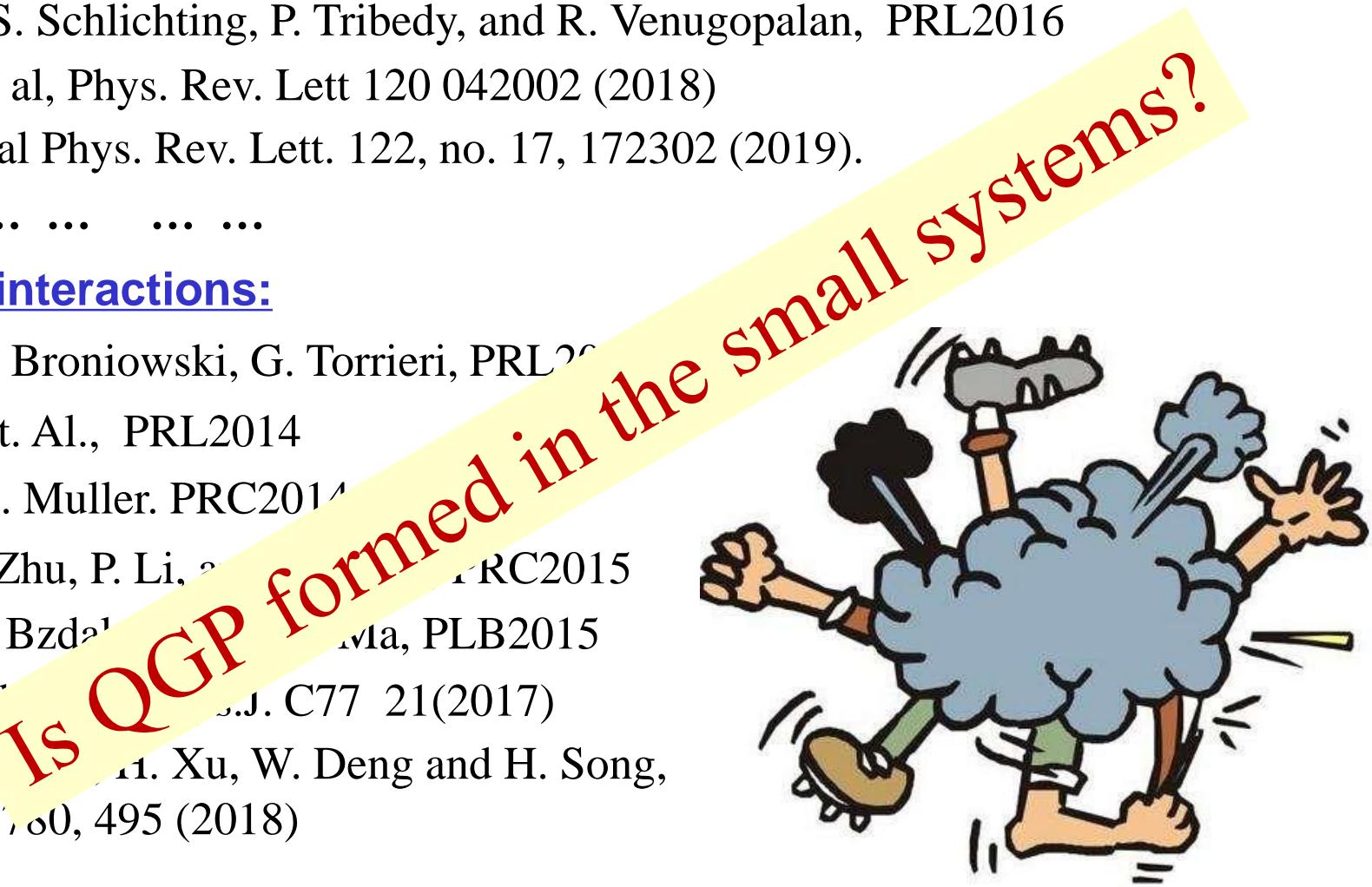
## Initial state effects:

– Various Models interpolations

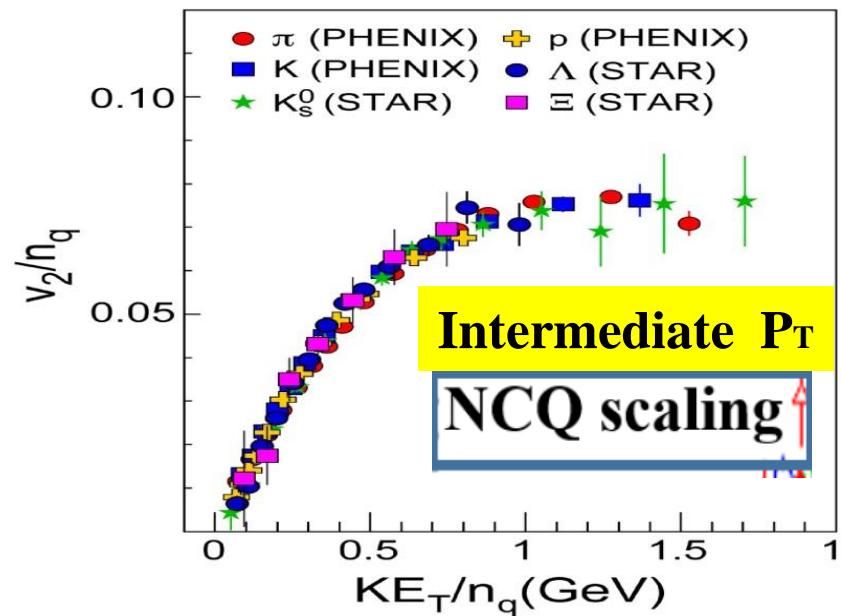
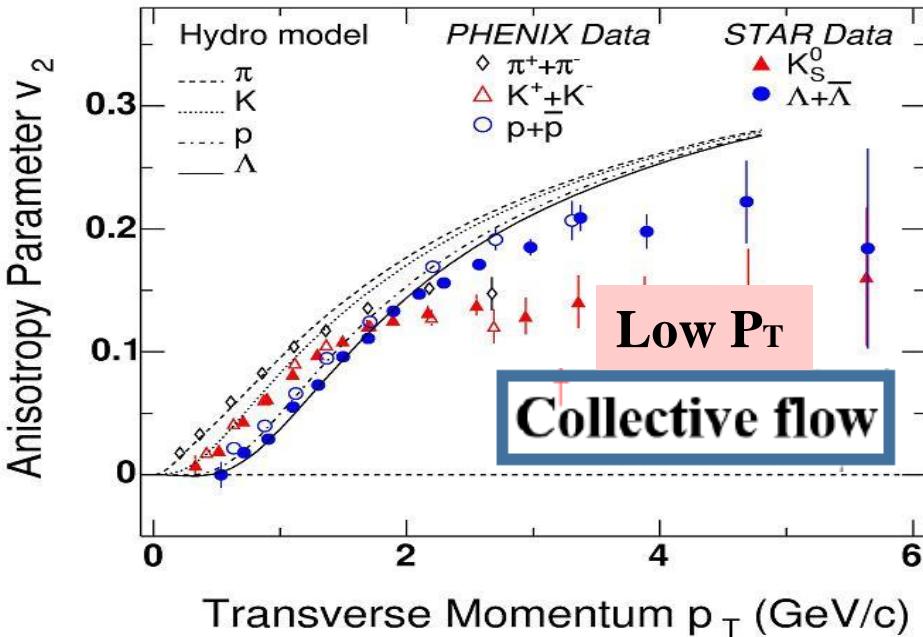
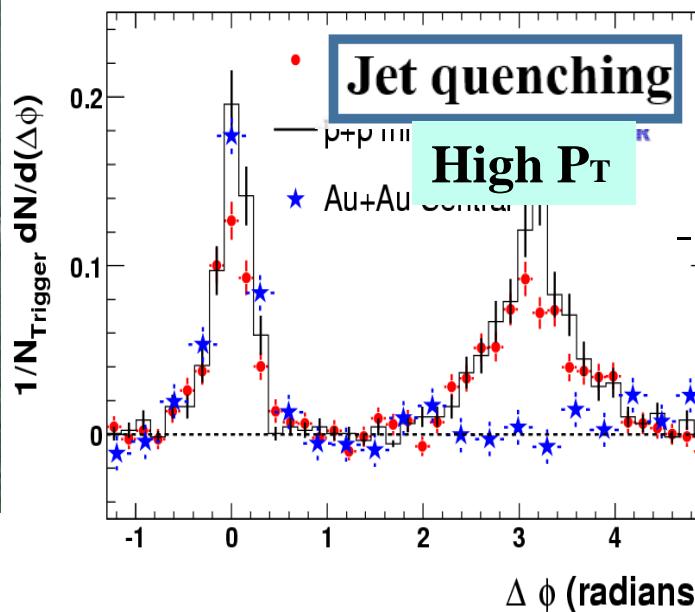
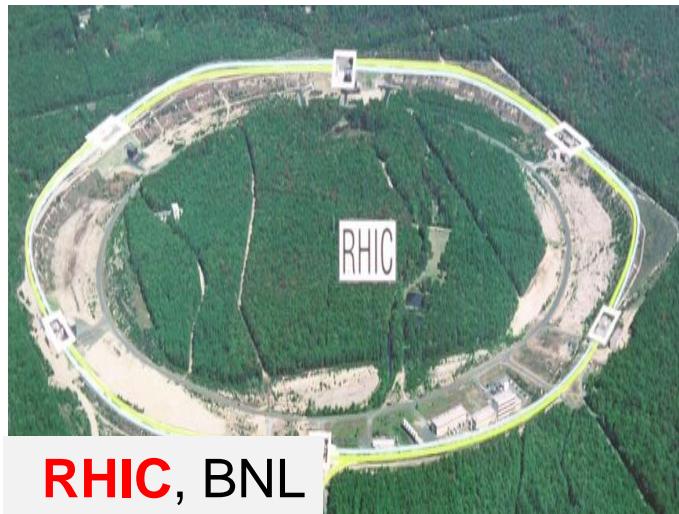
- K. Dusling and R. Venugopalan, PRL 2012, PRD2013, NPA 2014
  - A. Dumitru and A. V. Giannini, NPA 2015, A. Dumitru and V. Skokov PRD2015
  - B. Schenke, S. Schlichting, P. Tribedy, and R. Venugopalan, PRL2016
  - K. Dusling et al, Phys. Rev. Lett 120 042002 (2018)
  - C. Zhang, et al Phys. Rev. Lett.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

## Final state interactions:

- P. Bozek, W. Broniowski, G. Torrieri, PRL<sup>27</sup>
  - K. Werner, et. Al., PRL2014
  - G.-Y. Qin, B. Muller. PRC2014
  - Y. Zhou, X. Zhu, P. Li, <sup>2</sup> P. Bozek, PRC2015
  - P. Bozek, A. Bzdak, J. C. R. Ma, PLB2015
  - P. Romatschke, J. J. C. C77 21(2017)
  - W. Zhao, Y. Liu, H. Xu, W. Deng and H. Song, Phys. Lett. B 780, 495 (2018)
- ... ... ... ...

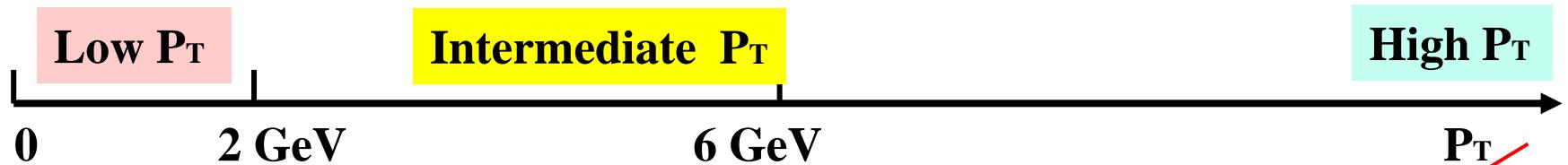


# Reminder: QGP signals in large systems



**Au+Au / Pb+Pb**  
**QGP was discovered**  
**@RHIC & LHC**  
**-strong elliptic flow**  
**-jet quenching**  
**-NCQ scaling of elliptic flow**

# QGP signals in p-Pb collisions?



## Collective Flow:

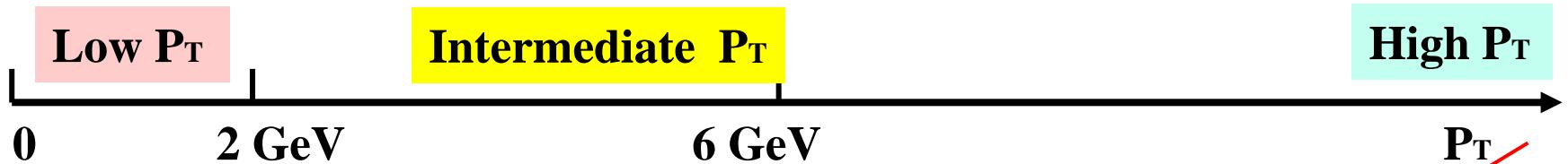
Hydrodynamics  
final states interaction  
Initial state effects  
**(strong debate)**

.

## Hard Probes:

no longer leave  
obvious hints due  
to the limited size.

# NCQ scaling of v2 in p-Pb collisions



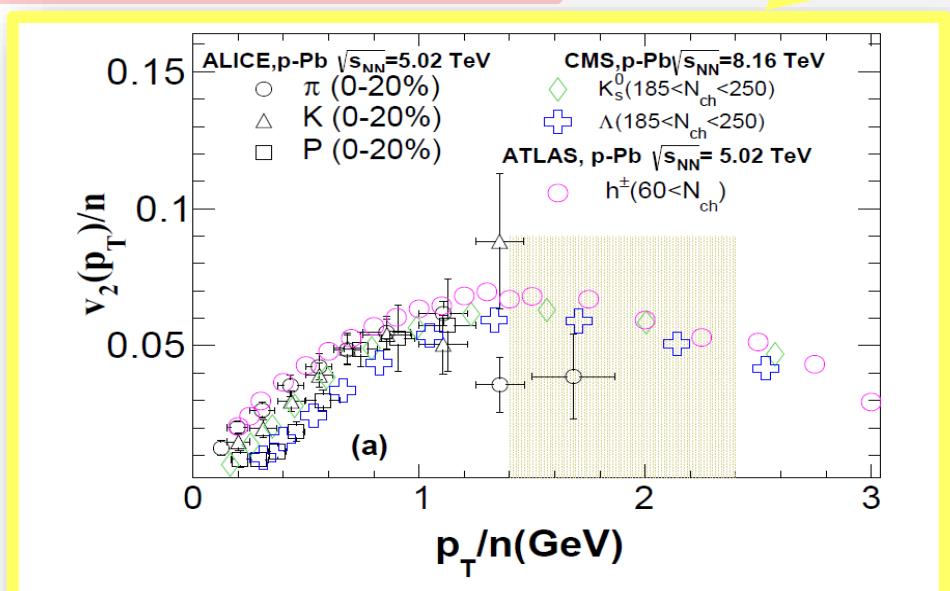
**Collective Flow:**  
Hydrodynamics  
final states interaction  
Initial state effects  
**(strong debate)**

## NCQ Scaling of V2:

- Recent Exp measurements-
- need systematic theoretical investigation

## Hard Probes:

no longer leave  
obvious hints due  
to the limited size.



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

## Coalescence model

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

Wenbin

$$\frac{dN_M}{d^3\mathbf{P}_M} = g_M \int d^3\mathbf{x}_1 d^3\mathbf{p}_1 d^3\mathbf{x}_2 d^3\mathbf{p}_2 f_q(\mathbf{x}_1, \mathbf{p}_1) f_{\bar{q}}(\mathbf{x}_2, \mathbf{p}_2) \times W_M(\mathbf{y}, \mathbf{k}) \delta^{(3)}(\mathbf{P}_M - \mathbf{p}_1 - \mathbf{p}_2)$$

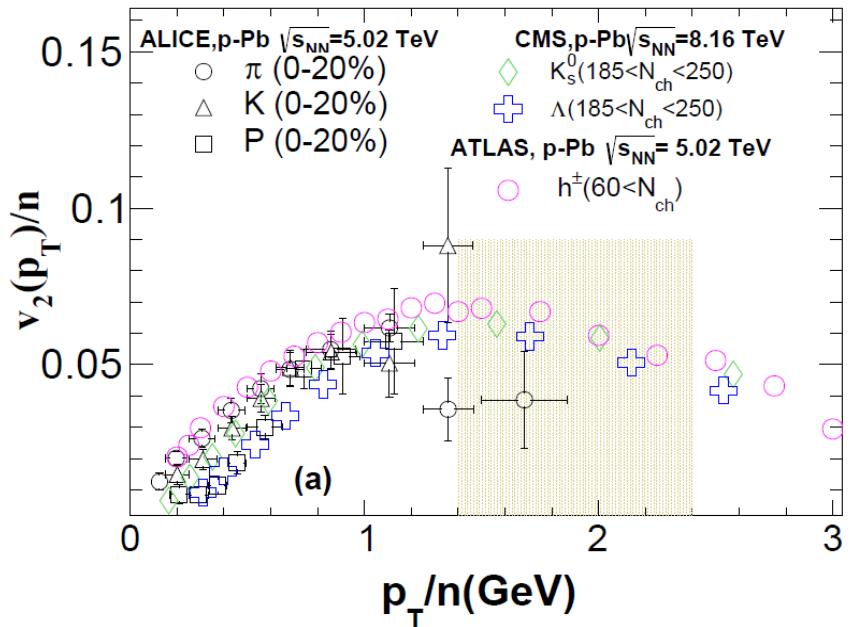
$$\frac{dN_B}{d^3\mathbf{P}_B} = g_B \int d^3\mathbf{x}_1 d^3\mathbf{p}_1 d^3\mathbf{x}_2 d^3\mathbf{p}_2 d^3\mathbf{x}_3 d^3\mathbf{p}_3 f_{q_1}(\mathbf{x}_1, \mathbf{p}_1) \\ \times f_{q_2}(\mathbf{x}_2, \mathbf{p}_2) f_{q_3}(\mathbf{x}_3, \mathbf{p}_3) W_B(\mathbf{y}_1, \mathbf{k}_1; \mathbf{y}_2, \mathbf{k}_2) \times \delta^{(3)}(\mathbf{P}_B - \mathbf{p}_1 - \mathbf{p}_2 - \mathbf{p}_3)$$

## Thermal & hard Partons:

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

## Coalescence 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:  $P_T < 2P_1$ ; baryon:  $P_T < 3P_1$ .

## Coalescence hadrons (Coal Model):

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

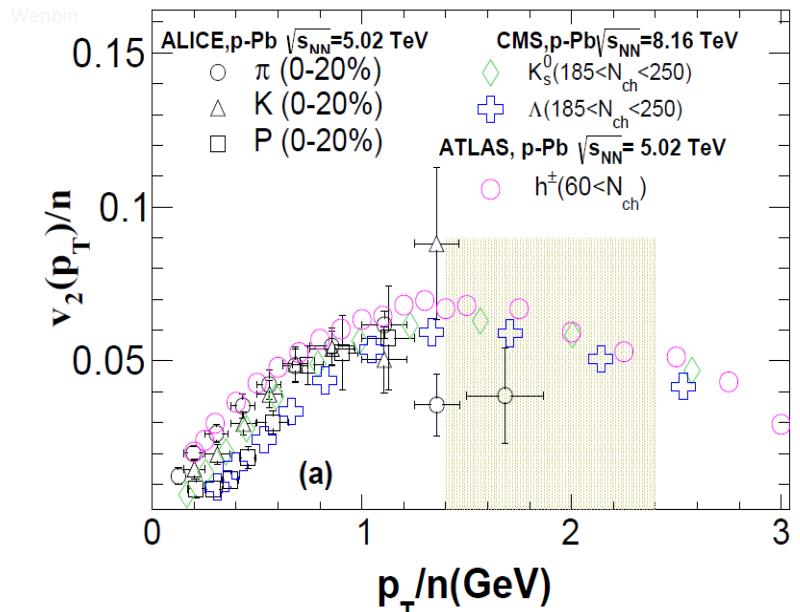
## Fragmentation hadrons (LBT):

- 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).



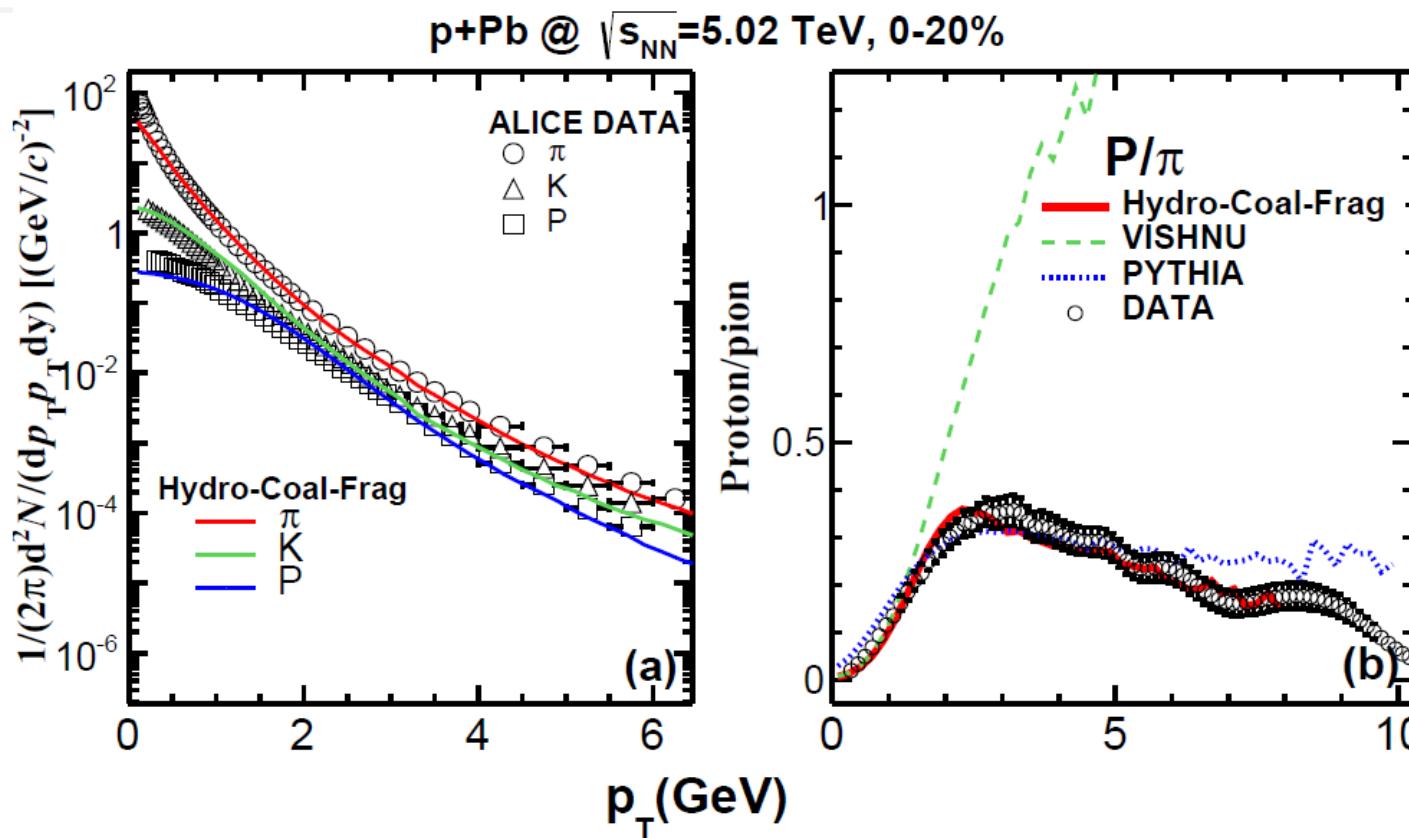
## Main Parameters:

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

*- Hard partons from LBT  
with  $P_T > P_2$ .*

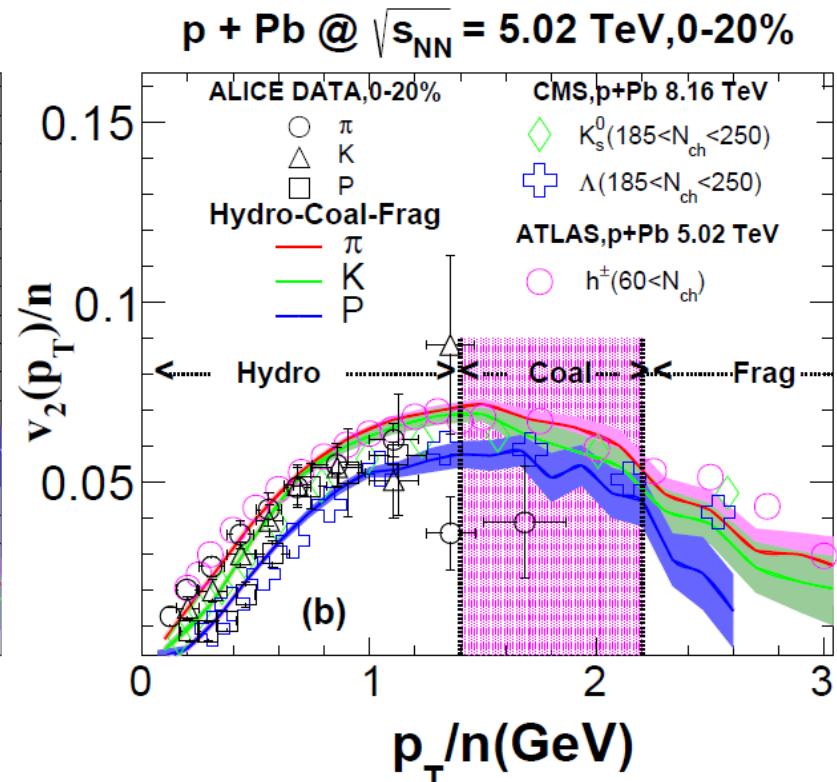
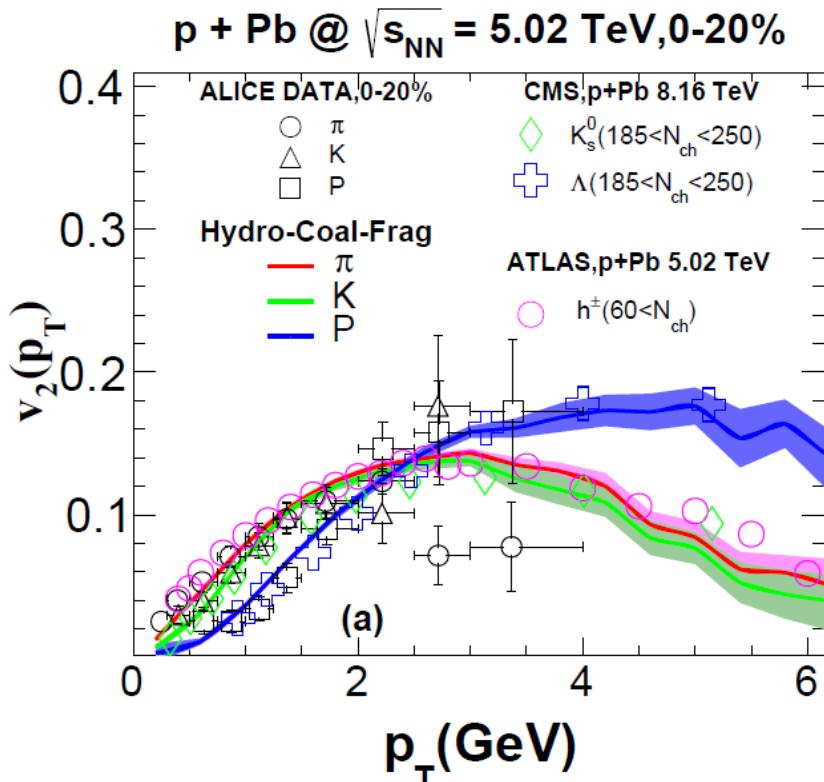
Fixed by the pT spectra  
 $p_{T1} = 1.6 \text{ GeV}$  and  $p_{T2} = 2.6 \text{ GeV}$

# Spectra of pions, kaons and protons



Our combined model, Hydro-Coal-Frag, gives a nice description of spectra of pion, kaon and proton as well as the  $P/\pi$  over  $p_T$  from 0 to 6 GeV.

# $v_2(p_T)$ and NCQ scaling

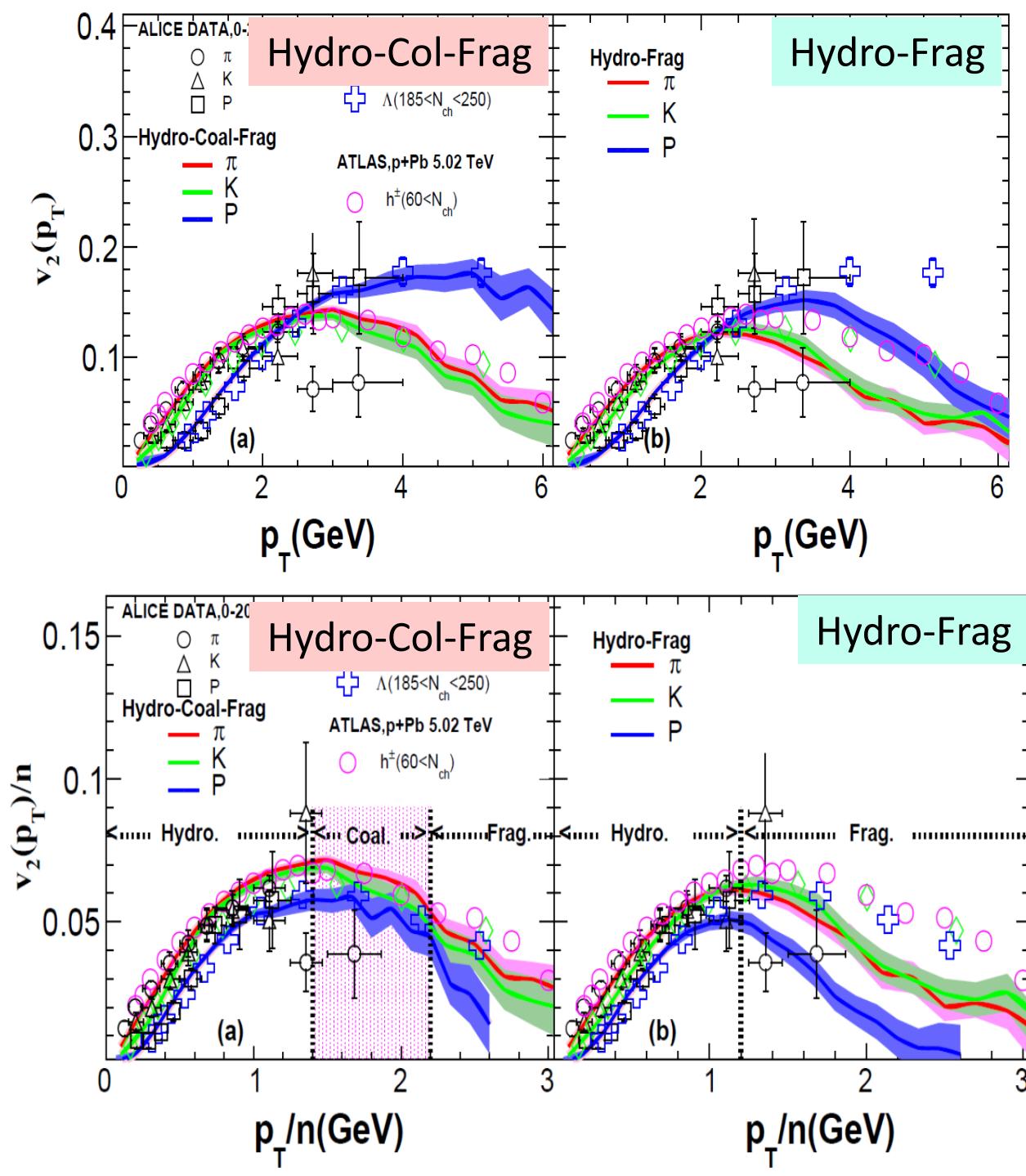


-Hydro-Coal-Frag model gives a nice description of  $v_2(p_T)$  of pion, kaon and proton over  $p_T$  from 0 to 6 GeV.

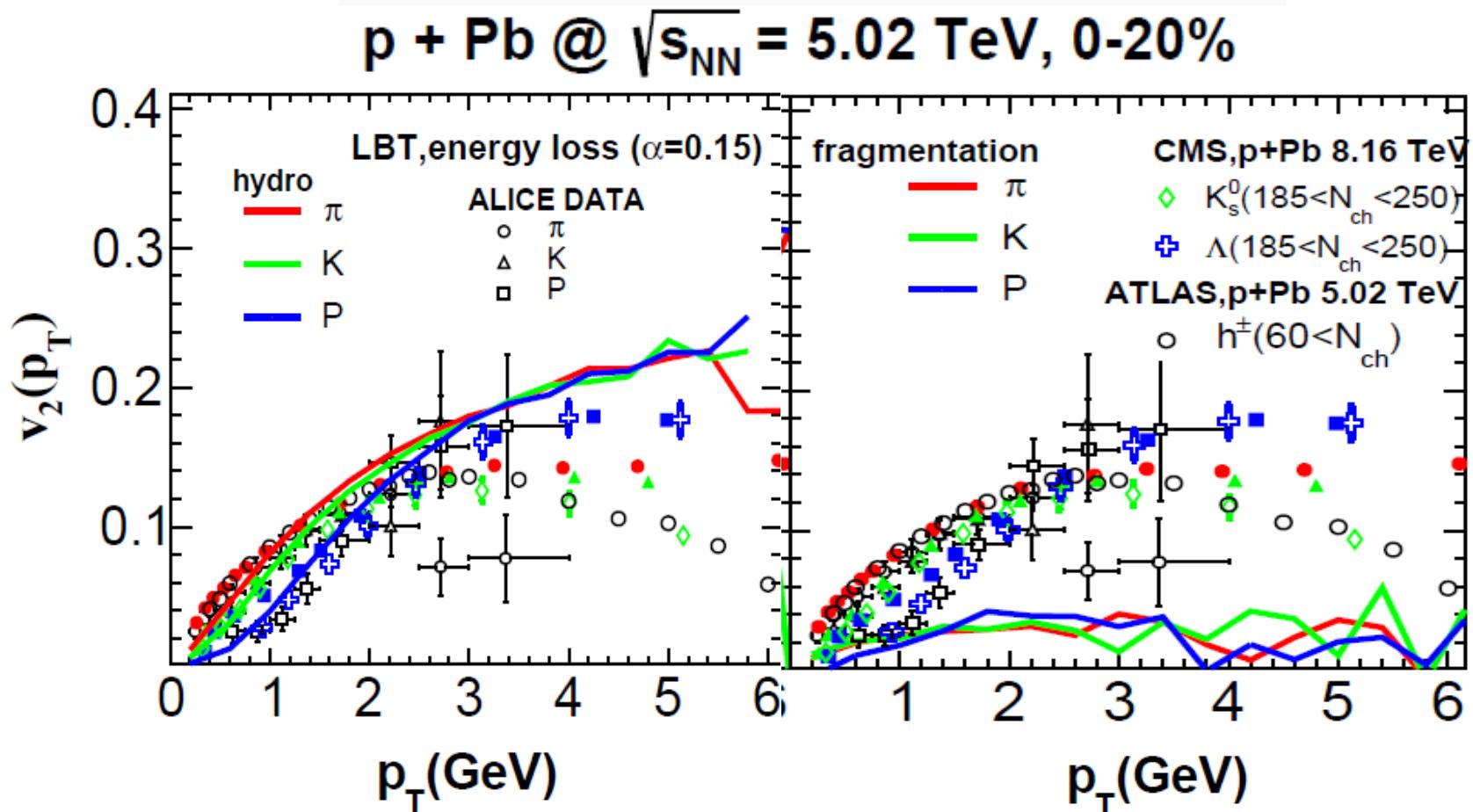
-At intermediate  $p_T$ , Hydro-Coal-Frag model can obtain an approximate NCQ scaling as shown by the data.

## The importance of quark coalescence in p-Pb collisions

Without coalescence, Hydro-Frag largely underestimates the  $v_2(p_T)$  at intermediate  $p_T$ , violating the NCQ Scaling of  $v_2$



# $v_2(p_T)$ from hydro or fragmentation alone

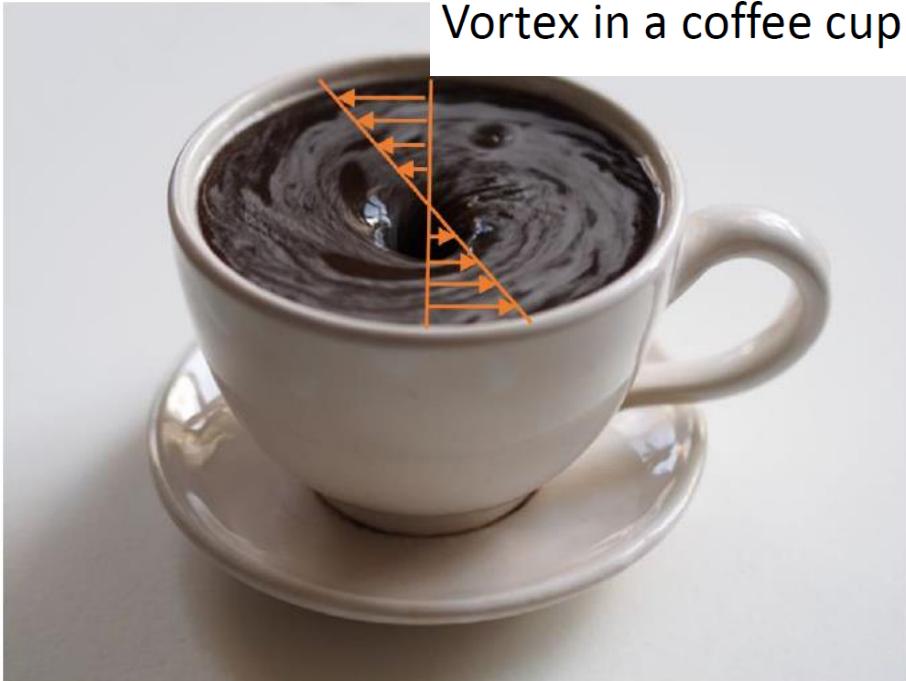


Hydro or Fragmentation alone can not describe  $v_2(p_T)$  in high multiplicity p-Pb collisions

# Vorticity and spin polarization

# What is vorticity

Non-Relativistic Case:

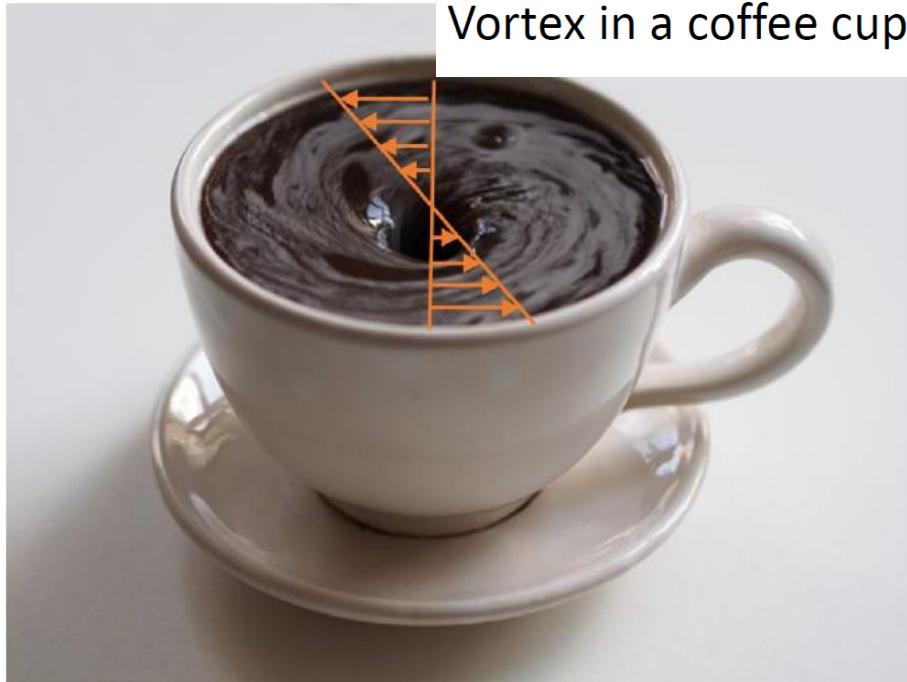


Fluid vorticity

$$\boldsymbol{\omega} = \frac{1}{2} \nabla \times \boldsymbol{v}$$

(Local angular velocity)

# Vorticity & spin polarization

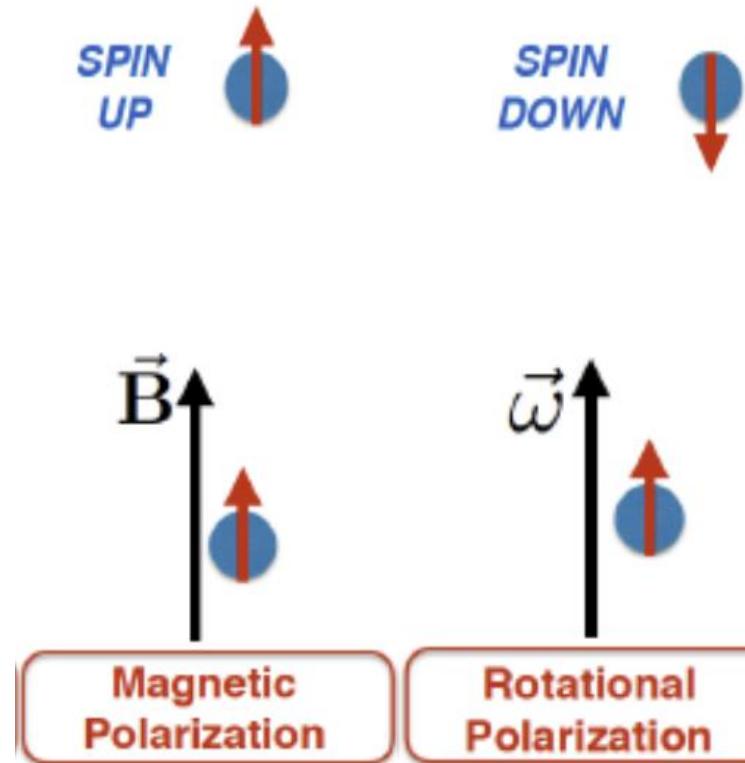


Fluid vorticity

$$\boldsymbol{\omega} = \frac{1}{2} \nabla \times \boldsymbol{v}$$

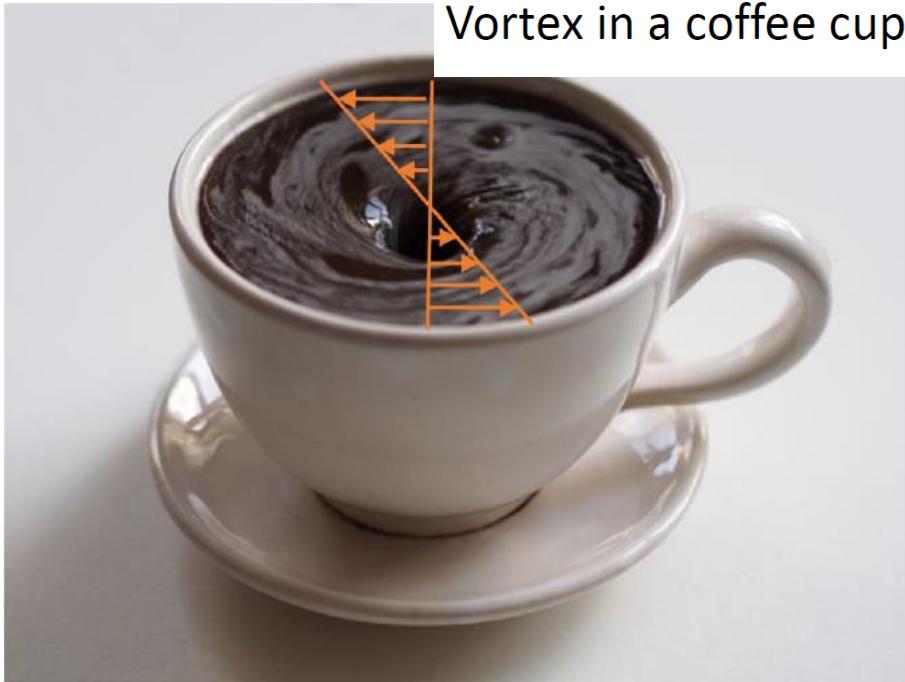
(Local angular velocity)

Non-Relativistic Case:



$$H = -\mu_B \cdot \mathbf{B} - \mathbf{S} \cdot \boldsymbol{\omega}$$

# Vorticity & spin polarization

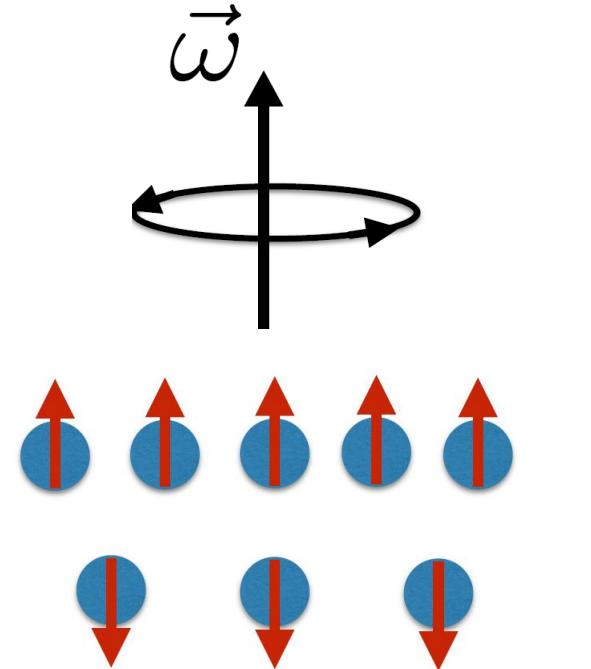


Fluid vorticity

$$\boldsymbol{\omega} = \frac{1}{2} \nabla \times \boldsymbol{v}$$

(Local angular velocity)

Non-Relativistic Case:



$$H = H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S}$$

$$\frac{dN}{dp} \sim e^{-(H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S})/T}$$

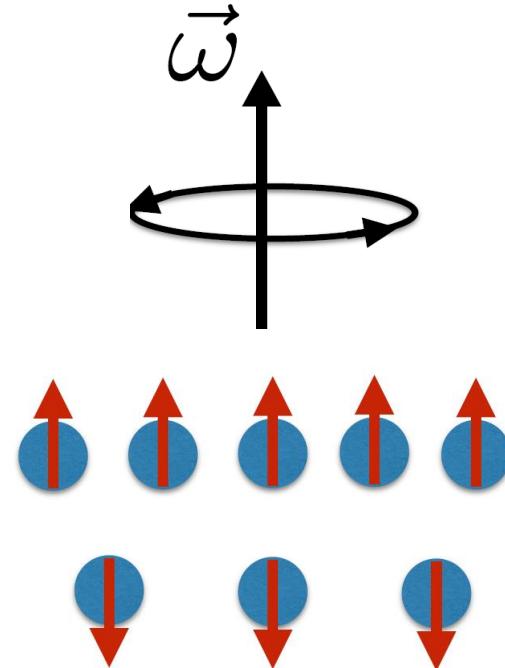
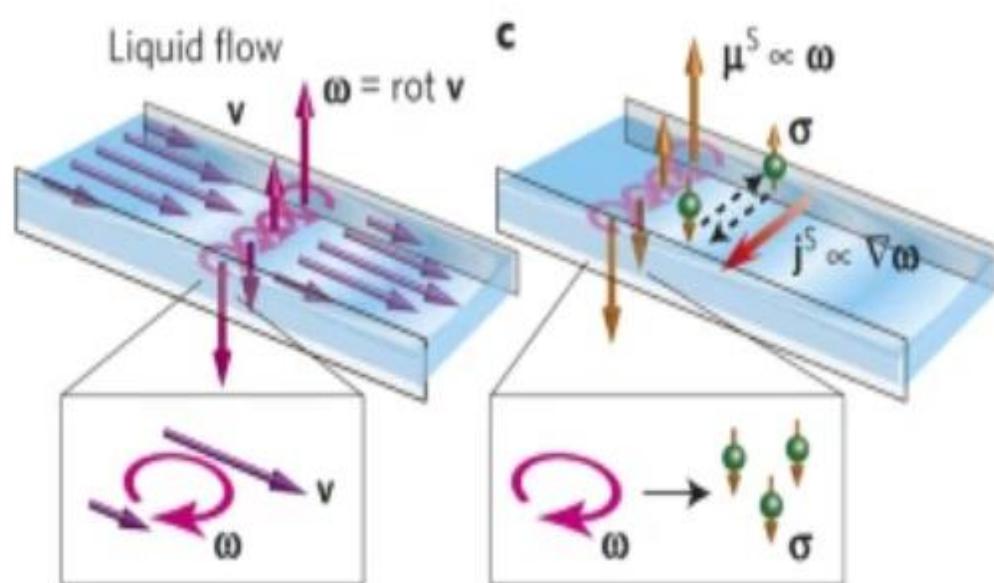
# Rotational Polarization in Condense Matter

## Spin hydrodynamic generation

Non-Relativistic Case:

R. Takahashi [✉](#), M. Matsuo, M. Ono, K. Harii, H. Chudo, S. Okayasu, J. Ieda, S. Takahashi, S. Maekawa & E. Saitoh [✉](#)

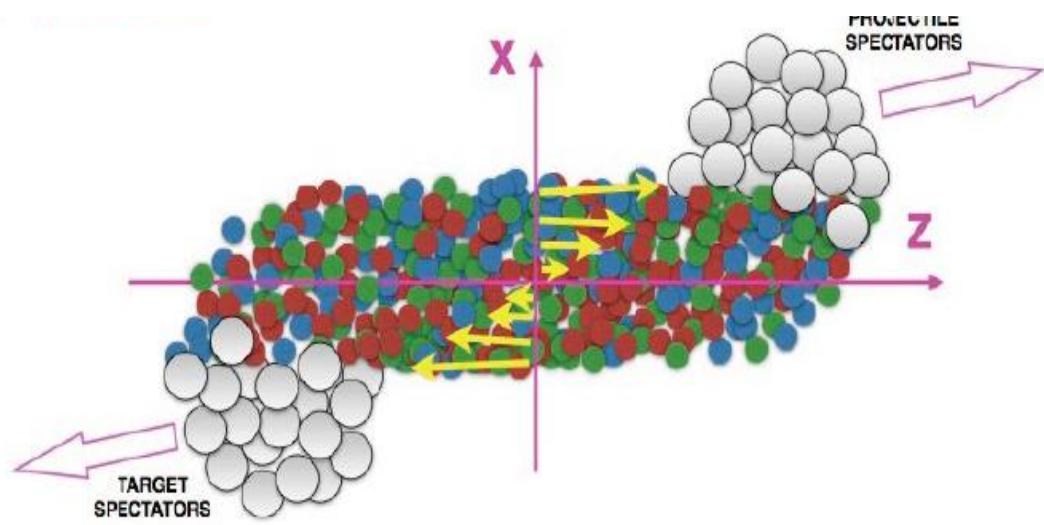
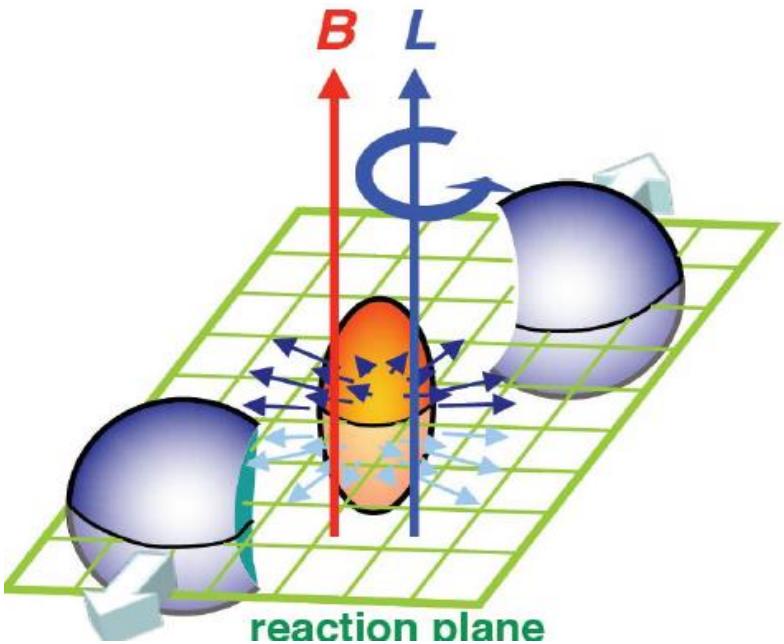
Nature Physics 12, 52–56(2016) | [Cite this article](#)



$$H = H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S}$$

$$\frac{dN}{dp} \sim e^{-(H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S})/T}$$

# Vorticity in relativistic heavy ion collisions



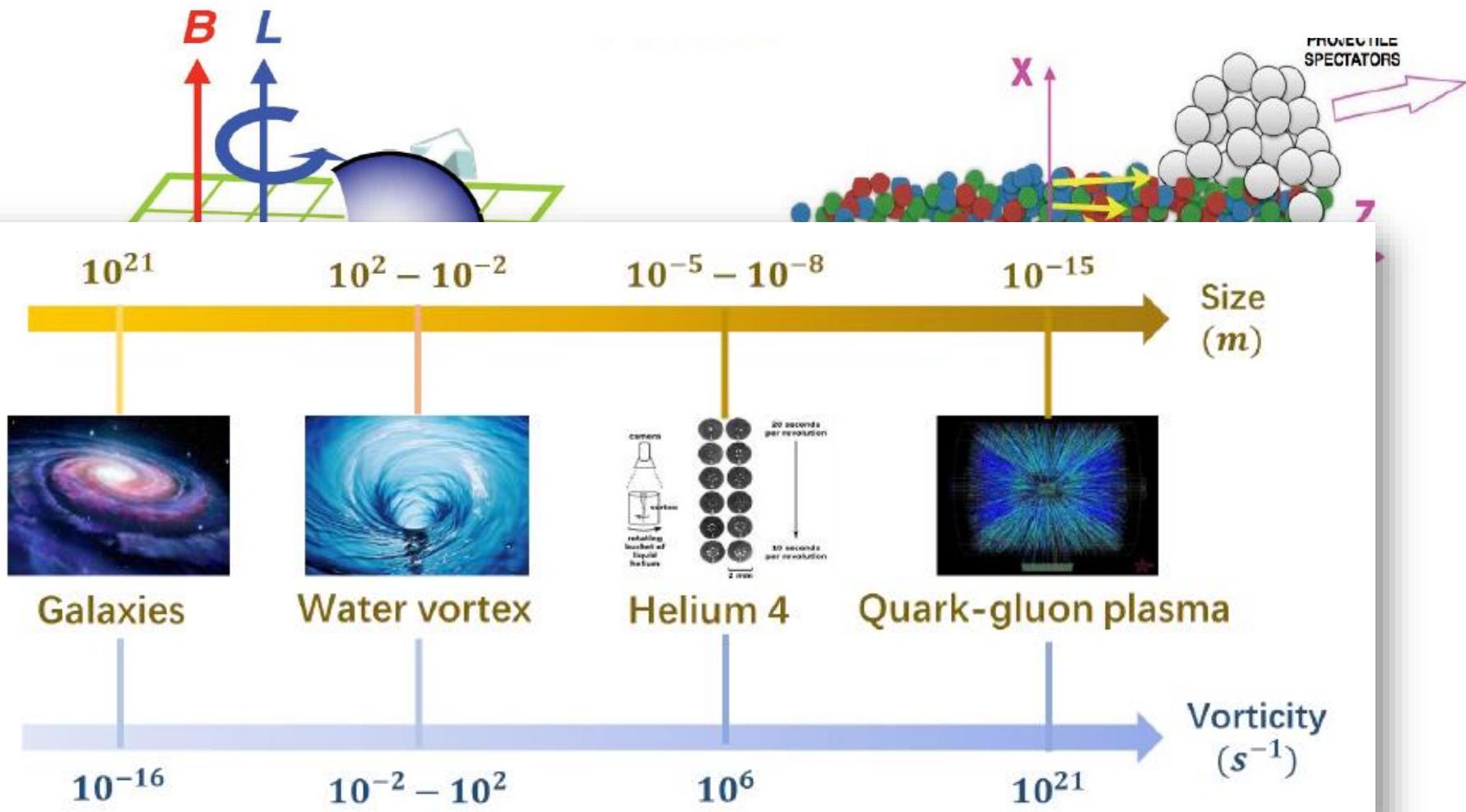
$$J_0 \sim \frac{Ab\sqrt{s}}{2} \sim 10^6 \hbar$$

very large global angular momentum

$$eB \sim \gamma \alpha_{\text{EM}} \frac{Z}{b^2} \sim 10^{18} \text{ G}$$

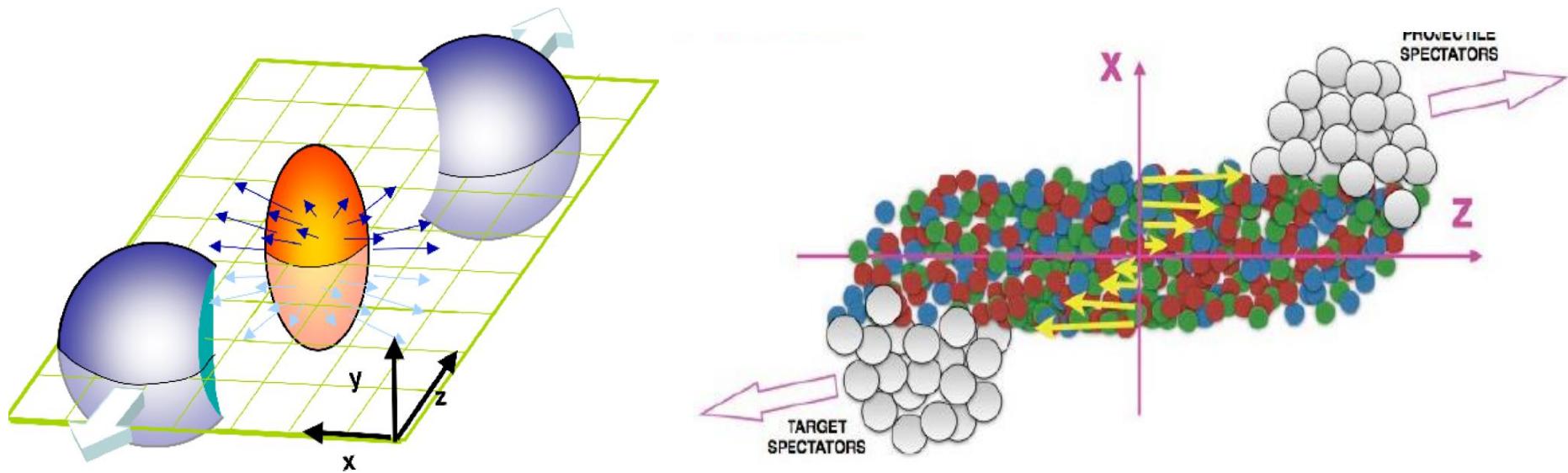
strong magnetic field

# Vorticity in relativistic heavy ion collisions



QGP: smallest but most vortical fluid

# Vorticity in relativistic heavy ion collisions



Non-Relativistic illustration:

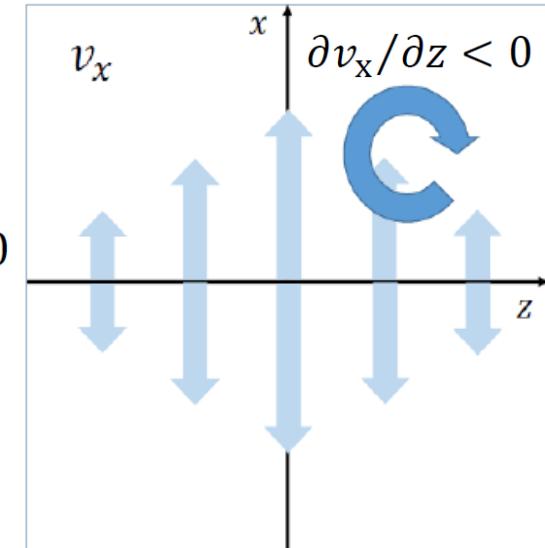
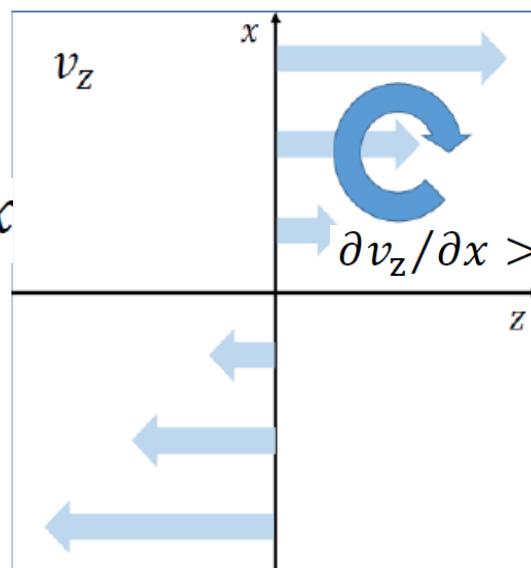
$$\boldsymbol{\omega} = \frac{1}{2} \nabla \times \boldsymbol{v}$$

$$\omega_y = \partial v_x / \partial z - \partial v_z / \partial x$$

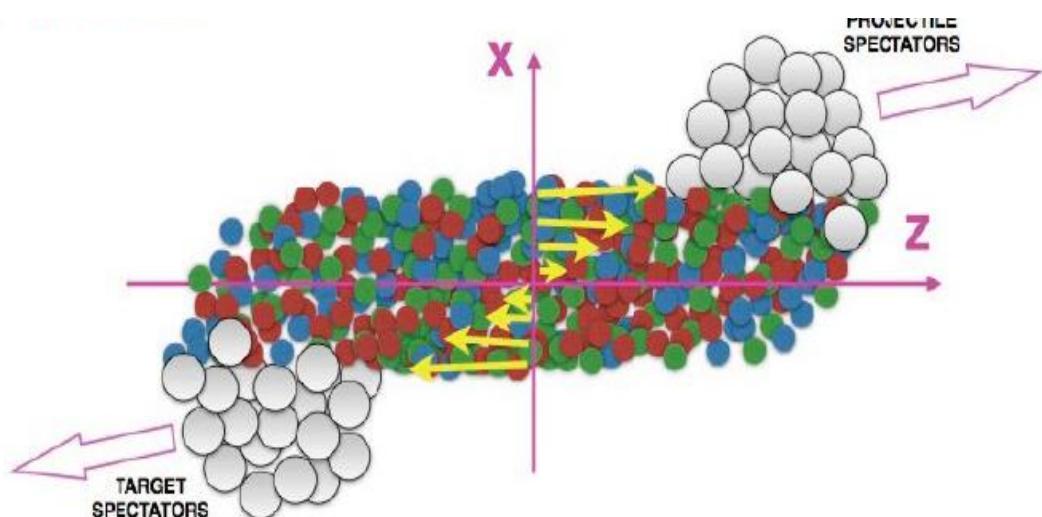
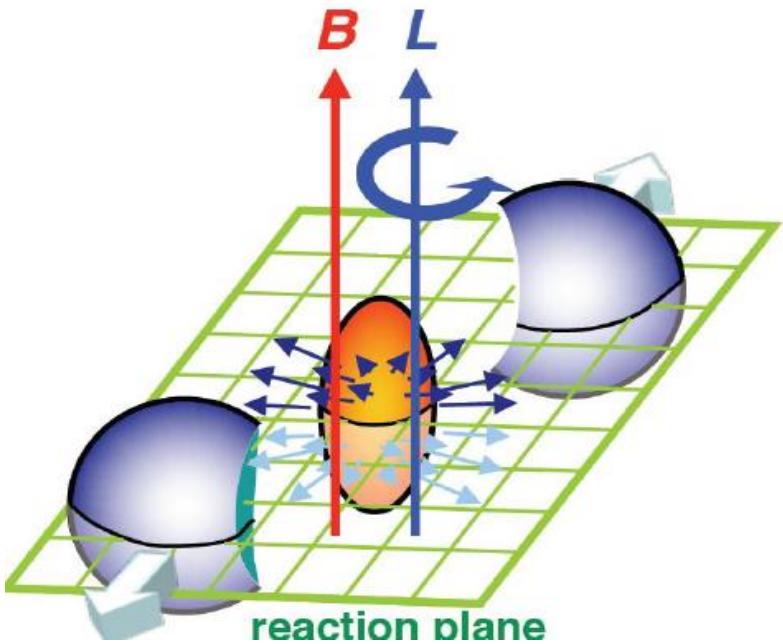
$$\omega_y < 0$$

$$\rightarrow P_y < 0$$

Global polarization



# Global angular momentum & global polarization



The earlier but very pioneering work:

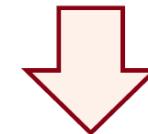
Global polarization of  $\Lambda$  and spin alignment  
of vector mesons from spin-orbital coupling

Z. T. Liang, X. N. Wang, Phys. Rev. Lett. 94  
(2005) 102301, Phys.Lett.B 629 (2005) 20-26

Motivate the spin polarization measurements  
in experiments!

Spin-orbital coupling

Global quark polarization



Final hadron polarization  
(recombination/fragmentation)

# Global polarization measurements in heavy ion collisions

'self-analyzing' of hyperon

Daughter baryon is preferentially emitted in the direction of hyperon's spin (opposite for anti-particle)

$$\frac{dN}{d\Omega^*} = \frac{1}{4\pi} (1 + \alpha_H \mathbf{P}_H \cdot \mathbf{p}_p^*)$$

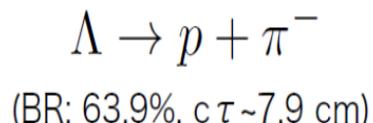
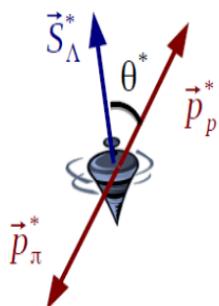
$\mathbf{P}_H$ :  $\Lambda$  polarization

$\mathbf{p}_p^*$ : proton momentum in the  $\Lambda$  rest frame

$\alpha_H$ :  $\Lambda$  decay parameter

$$\alpha_\Lambda = 0.642 \pm 0.013 \rightarrow \alpha_\Lambda = 0.732 \pm 0.014$$

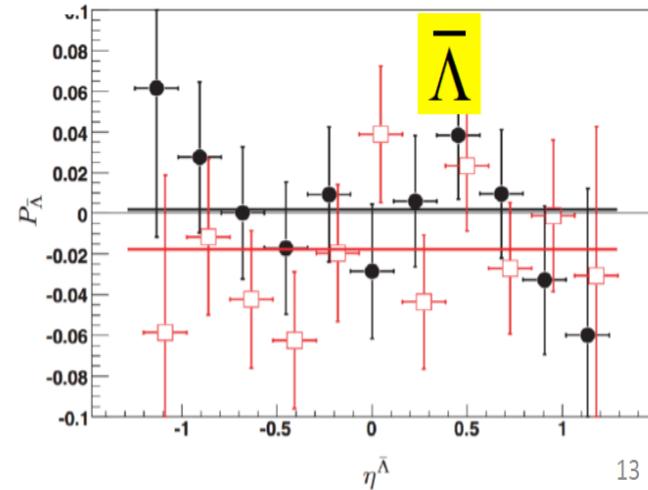
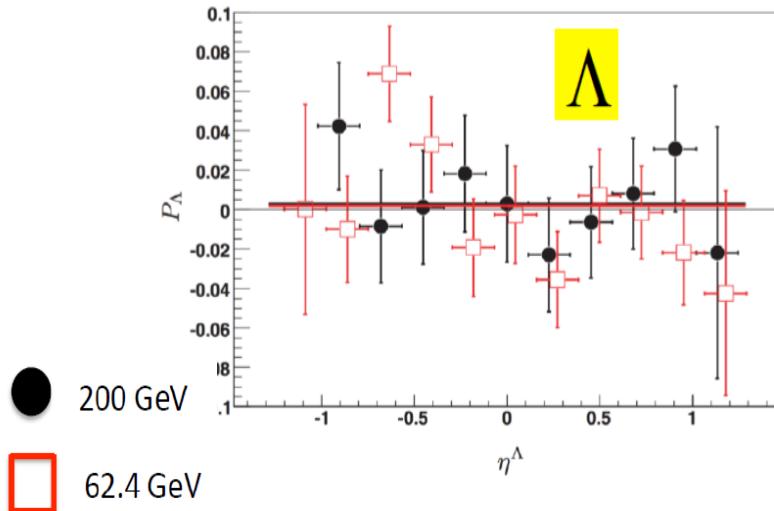
P.A. Zyla et al. (PDG), PTEP2020.083C01



S. Voloshin and T. Niida, PRC 94.021904 (2016)

No signal at high energy

Phys. Rev. C 76, 024915 (2007)



# Global polarization measurements in heavy ion collisions

'self-analyzing' of hyperon

Daughter baryon is preferentially emitted in the direction of hyperon's spin (opposite for anti-particle)

$$\frac{dN}{d\Omega^*} = \frac{1}{4\pi} (1 + \alpha_H \mathbf{P}_H \cdot \mathbf{p}_p^*)$$

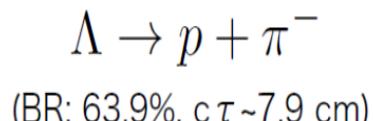
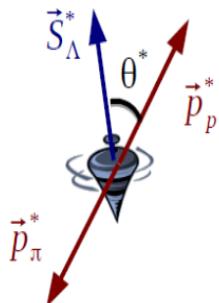
$P_H$ :  $\Lambda$  polarization

$\mathbf{p}_p^*$ : proton momentum in the  $\Lambda$  rest frame

$\alpha_H$ :  $\Lambda$  decay parameter

$$\alpha_\Lambda = 0.642 \pm 0.013 \rightarrow \alpha_{\bar{\Lambda}} = 0.732 \pm 0.014$$

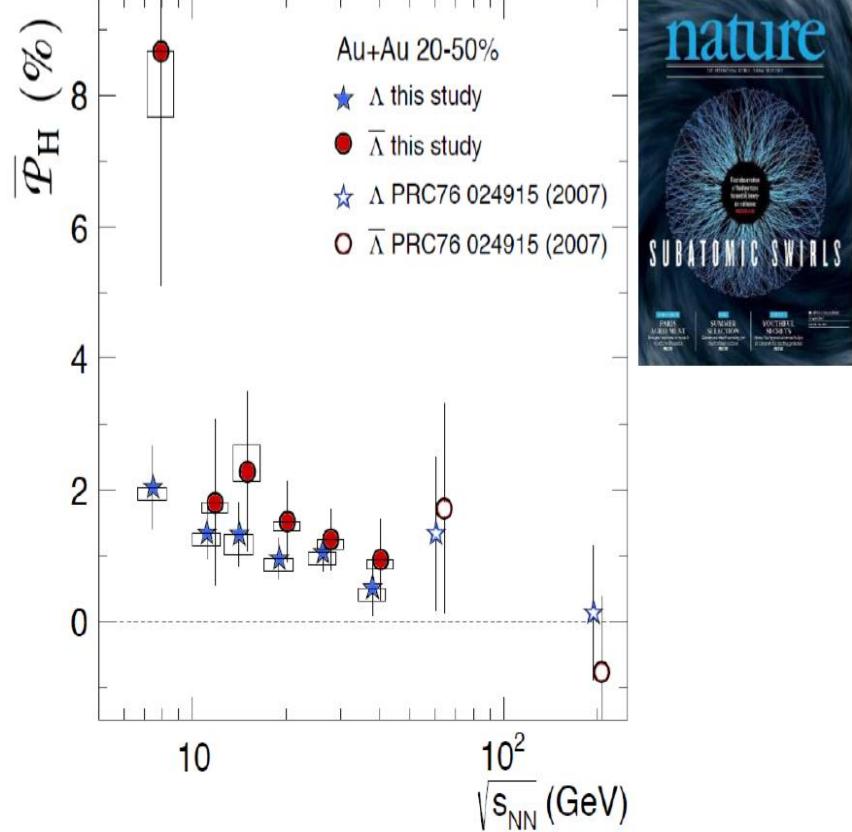
P.A. Zyla et al. (PDG), PTEP2020.083C01



S. Voloshin and T. Niida, PRC 94.021904 (2016)

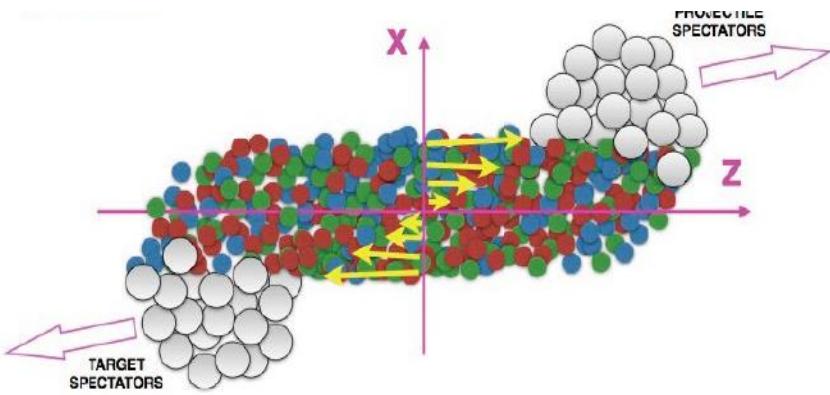
Most vortical fluid!

STAR Collaboration, Nature 548, 62 (2017)



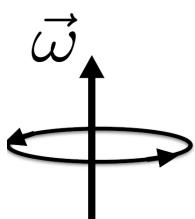
$$\omega = (P_\Lambda + P_{\bar{\Lambda}})k_B T / \hbar \sim 10^{22} \text{ s}^{-1}$$

# Theoretical frameworks: thermal vorticity & polarization

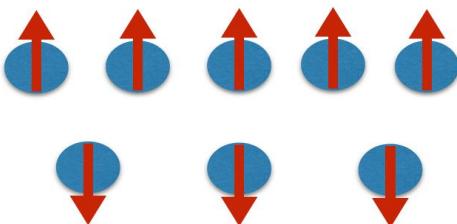


Non-Relativistic case:

$$\omega = \frac{1}{2} \nabla \times \boldsymbol{v}$$



Landau & Lifshitz,  
Statistical Physics



$$H = H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S} \quad \frac{dN}{dp} \sim e^{-(H_0 - \boldsymbol{\omega} \cdot \boldsymbol{S})/T}$$

$$\langle \vec{\omega}_{\text{QGP}} \rangle \parallel \vec{L}_{\text{QGP}} \rightarrow \langle \vec{S}_{\vec{\omega}; \text{hadrons}} \rangle \parallel \vec{L}_{\text{QGP}}$$

Relativistic case:

F. Becattini, et al. Annal Phys. 338 32 (2013)

Thermal vorticity:

$$\varpi_{\mu\nu} = -\frac{1}{2} (\partial_\mu \beta_\nu - \partial_\nu \beta_\mu) \quad \beta_\mu = u_\mu/T$$

Spin polarization:

$$S^\mu(x, p) = -\frac{1}{2m} \frac{S(S+1)}{3} [1 - f(x, p)] \epsilon^{\mu\nu\rho\sigma} p_\sigma \varpi_{\nu\rho}$$

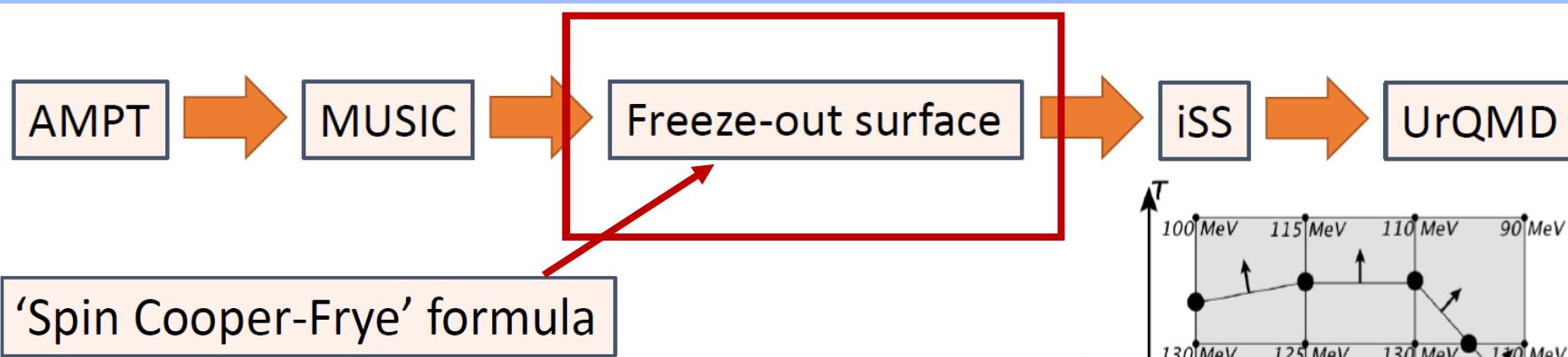
global equil.  $\rightarrow$  local equil.

Spin polarization in hydro:

$$S^\mu(p) = \frac{\int d\Sigma_\lambda p^\lambda f(x, p) \langle S(x, p) \rangle}{\int d\Sigma_\lambda p^\lambda f(x, p)}$$

Integration on freeze-out surface

# From thermal vorticity to polarization within hydrodynamics



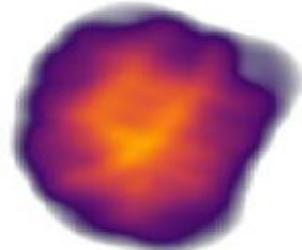
Polarization from hydrodynamics

$$S^\mu(p) = \frac{\int d\Sigma_\lambda p^\lambda f(x, p) \langle S(x, p) \rangle}{\int d\Sigma_\lambda p^\lambda f(x, p)}$$

$$S^\mu(x, p) = -\frac{1}{2m} \frac{S(S+1)}{3} [1 - f(x, p)] \epsilon^{\mu\nu\rho\sigma} p_\sigma \varpi_{\nu\rho}$$

Boost to particle rest frame

$$S^* = S - \frac{\mathbf{p} \cdot \mathbf{S}}{E(E+m)} \mathbf{p}$$

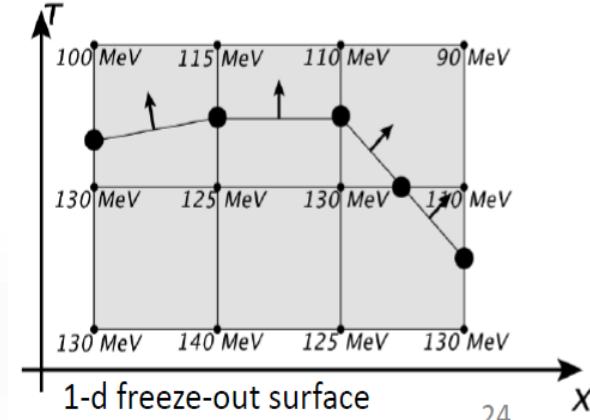


velocity fields:

$u_\mu(x)$  → Collective flow

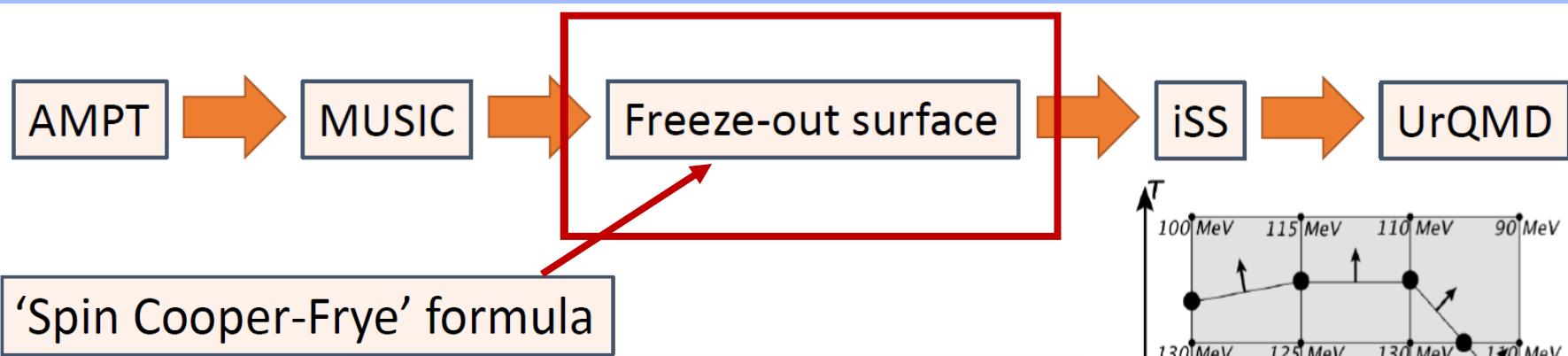
velocity gradients  
(vorticity)

$\partial_\mu u_\nu(x)$  → Spin polarization



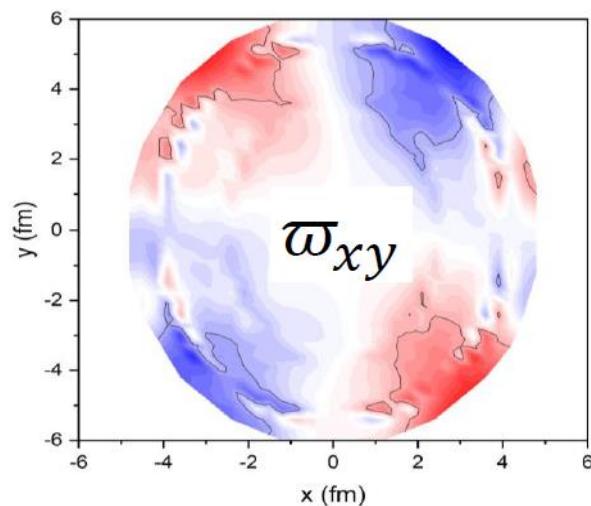
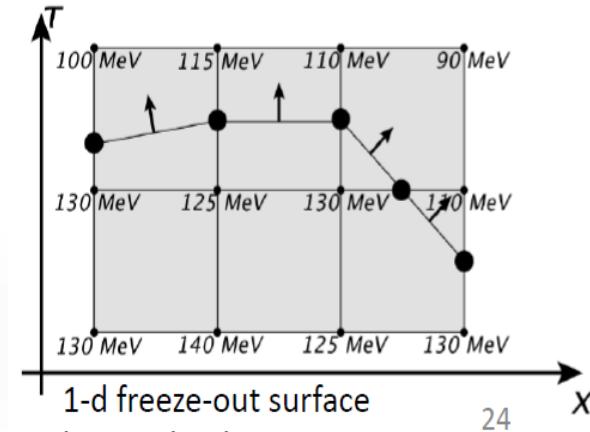
24

# From thermal vorticity to polarization within hydrodynamics

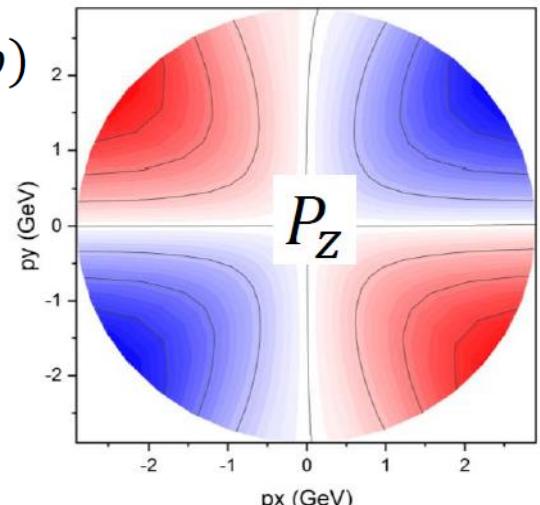
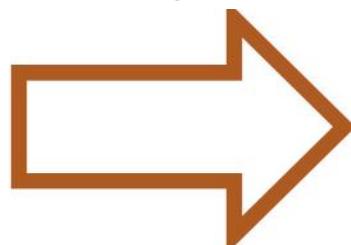


Polarization from hydrodynamics

$$S^\mu(p) = \frac{\int d\Sigma_\lambda p^\lambda f(x, p) \langle S(x, p) \rangle}{\int d\Sigma_\lambda p^\lambda f(x, p)}$$

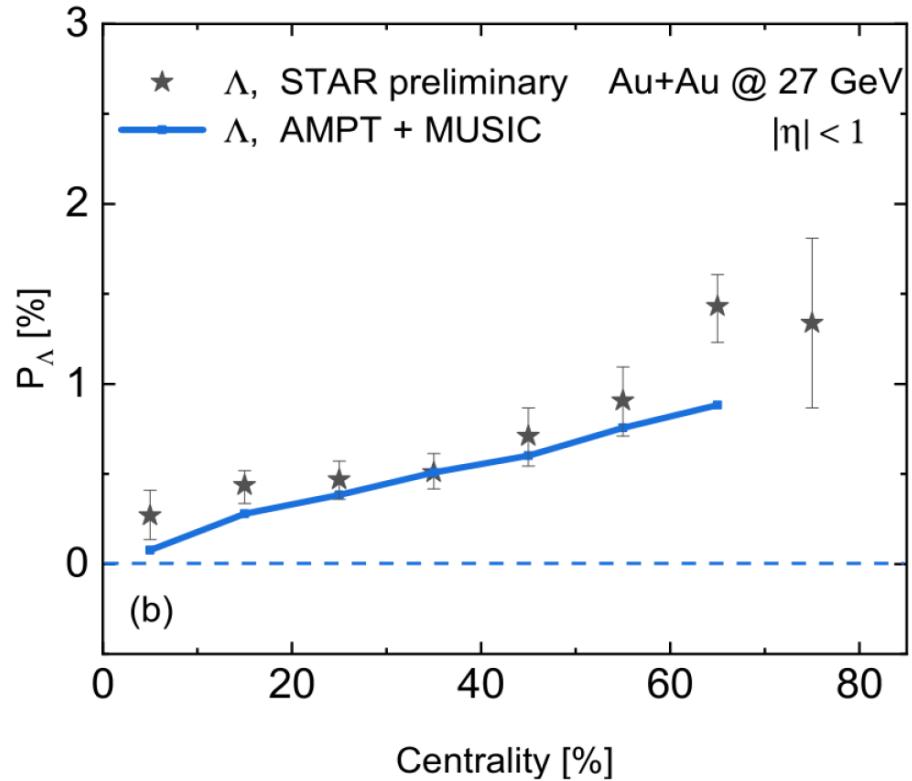
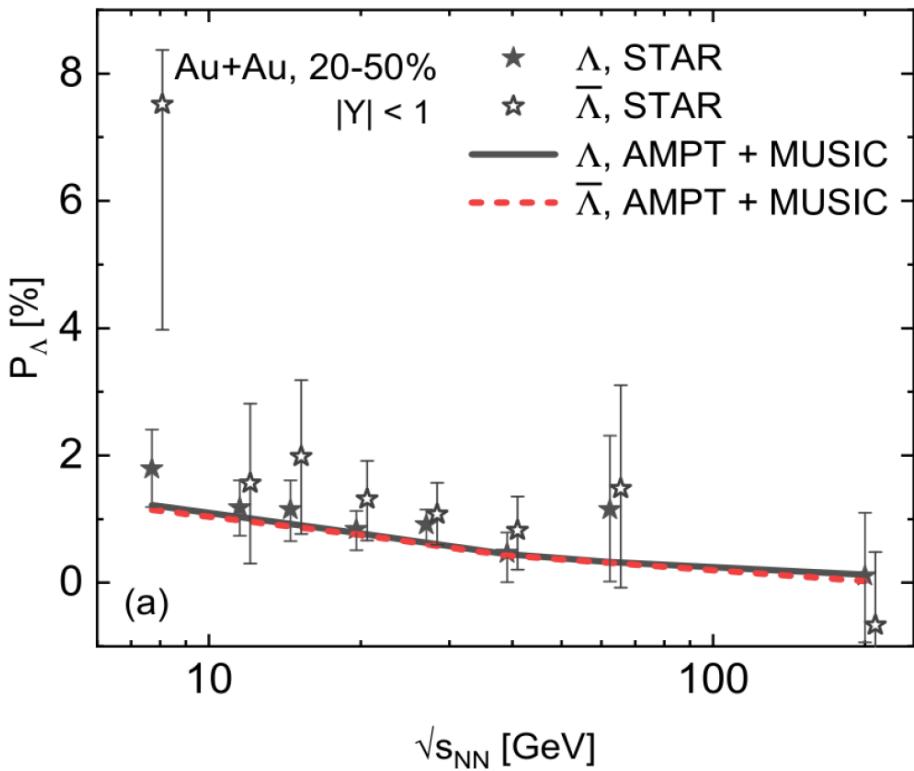


A mapping:  $\omega_{\mu\nu}(x) \rightarrow P^\mu(p)$



# Global $\Lambda$ Polarization from Hydro

B. Fu, K. Xu, X-G, Huang, H. Song, Phys.Rev.C103 2, 024903 (2021)

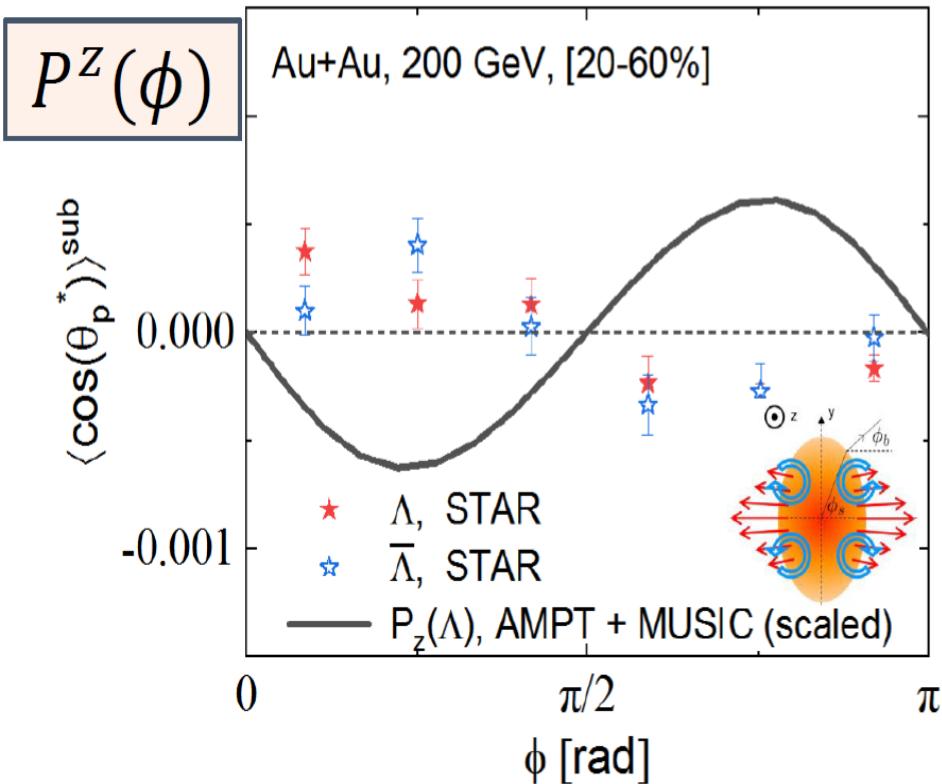
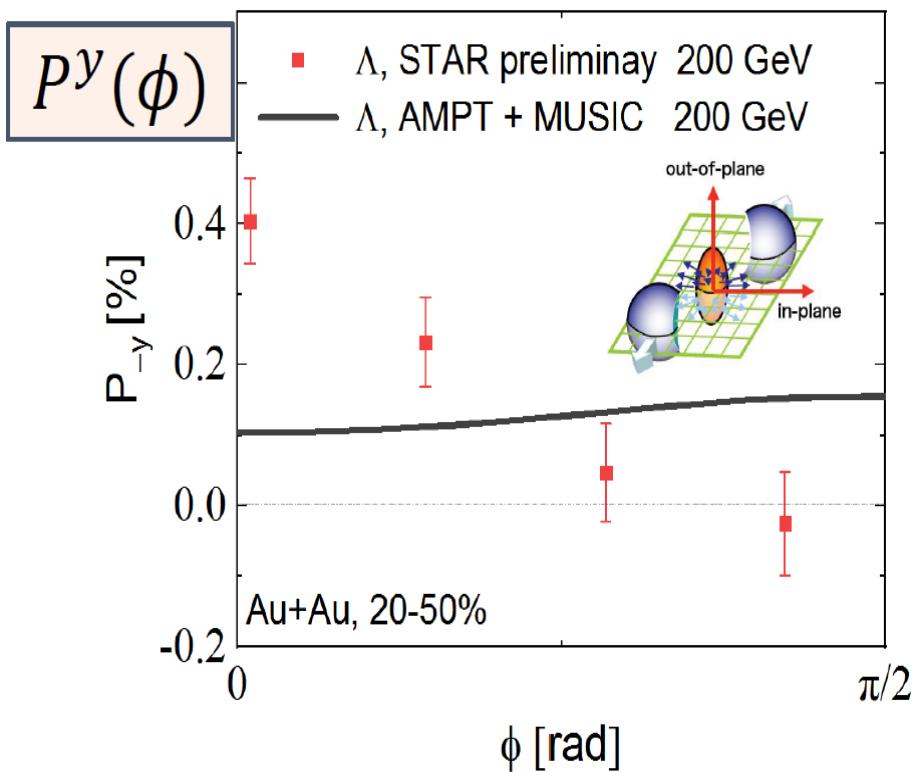


$$P^\mu = \langle P^\mu(p) \rangle = \frac{\int \frac{d^3 p}{E} \int d\Sigma_\nu p^\nu f(x, p) P^\mu(x, p)}{\int \frac{d^3 p}{E} \int d\Sigma_\nu p^\nu f(x, p)}$$

- Decrease with the collision energy; increase with centrality;
- Roughly describe the data within error bars

# Local $\Lambda$ Polarization from Hydro

B. Fu, K. Xu, X-G, Huang, H. Song, Phys.Rev.C103 2, 024903 (2021)



Different trend/sign in  $P_y(\phi)$  and  $P_z(\phi)$  results

-Local  $\Lambda$  Polarization Puzzle !

See also:

Karpenko, Becattini, EPJC 77 (2017) 4, 213

D. Wei, et al., PRC 99 (2019) 014905

X. Xia, et al., PRC 98 (2018) 024905

Becattini, Karpenko, PRL 120 (2018) 012302

# Efforts to resolve the ‘sign puzzle’

- Feed-down effects (Xia, Li, Huang, Huang, PRC 2019, Becattini, Cao, Speranza, EPJC 2019) [no obvious influence]
- Other spin chemical potential (Wu, Pang, Huang, Wang, PRR 2019) [extra assumption]
- Polarization from projected thermal vorticity (Florkowski, Kumar, Ryblewski, Mazeliauskas, PRC 2019) [extra assumption]
- Side-jump in CKT (Liu, Ko, Sun, PRL 2019) [massless limit]
- Spin as a dynamical d.o.f: [under developing]
  - spin hydrodynamics (Florkowski, et al., PRC2017, Hattori, et al., PLB 2019, Shi, et al, PRC 2021, ...)
  - spin kinetic theory (Gao and Liang, PRD 2019, Weickgenannt ,et al PRD 2019, Hattori, et al PRD 2019, Wang, et al, PRD 2019, Liu, et al, CPC 2020, Hattori, et al, PRD 2019, ...)
- Final hadronic interactions (Xie and Csernai, ECT talk 2020, Csernai, Kapusta, Welle, PRC 2019)
- ...

# Re-evaluate spin cooper fryer formular in hydrodynamics

spin cooper-fryer  
formula (traditional)

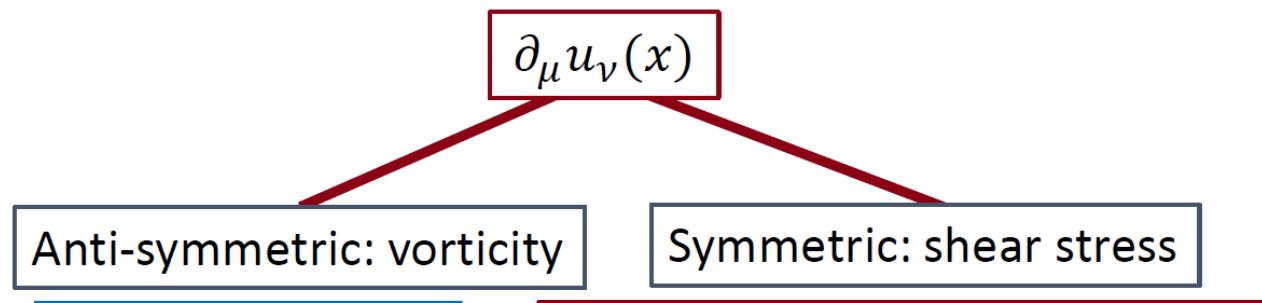
$$S^\mu(p) = \frac{\int d\Sigma_\lambda p^\lambda f(x, p) \langle S(x, p) \rangle}{\int d\Sigma_\lambda p^\lambda f(x, p)}$$

F. Becattini, et al. Annals  
Phys. 338 32 (2013)

$$S^\mu(x, p) = -\frac{1}{2m} \frac{S(S+1)}{3} [1 - f(x, p)] \epsilon^{\mu\nu\rho\sigma} p_\sigma \varpi_{\nu\rho}$$

$$\varpi_{\mu\nu} = -\frac{1}{2} (\partial_\mu \beta_\nu - \partial_\nu \beta_\mu) \quad \beta_\mu = u_\mu/T$$

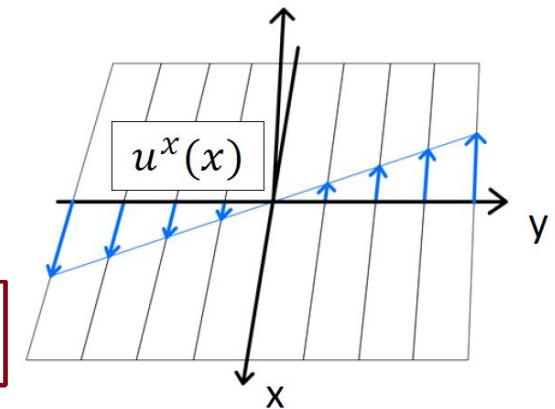
Hydrodynamic gradients



$$\omega^\mu = \frac{1}{2} \epsilon^{\mu\nu\alpha\beta} u_\nu \partial_\alpha^\perp u_\beta$$

$$\sigma^{\mu\nu} = \frac{1}{2} (\partial_\perp^\mu u^\nu + \partial_\perp^\nu u^\mu) - \frac{1}{3} \Delta^{\mu\nu} \partial_\perp \cdot u$$

traditional spin  
cooper-fryer formula



[Strain induced polarization]  
In crystal physics:

Crooker and Smith, PRL (2005) 94, 236601  
Kissikov, et al., Nature Comm. (2018) 9, 1058

# Shear Induced Polarization

B. Fu, S. Liu, L. -G. Pang, H. Song, Y. Yin, arXiv: 2103.10403

Axial Wigner fun

$$\mathcal{A}^\mu = \sum_\lambda (\lambda p^\mu$$

Expand  $\mathcal{A}^\mu$  to

To one-loop order (in charge neutral fluid)

$$\epsilon^{\mu\nu\alpha\lambda} p_\nu \partial_\alpha (\beta u)_\lambda$$

Thermal vorticity

$$\varpi_{\mu\nu} = \frac{1}{2} (\partial_\nu (\beta u_\mu) - \partial_\mu (\beta u_\nu))$$

$$\mathcal{A}^\mu = \frac{1}{2} \beta n_0 (1 - n_0) \left\{ \epsilon^{\mu\nu\alpha\lambda} p_\nu \partial_\alpha^\perp u_\lambda + 2 \epsilon^{\mu\nu\alpha\lambda} u_\nu p_\alpha [\beta^{-1} (\partial_\lambda \beta)] - 2 \frac{p_\perp^2}{\varepsilon_0} \epsilon^{\mu\nu\alpha\rho} u_\nu Q_\alpha^\lambda \sigma_{\rho\lambda} \right\}$$

Vorticity                      T gradient  
(spin Nernst effect)              Shear strength

$$\text{Total } P^\mu = [\text{Vorticity}] + [\text{T gradient}] + [\text{Shear}]$$



$$\text{Total } P^\mu = [\text{Thermal vorticity}] + [\text{Shear}]$$

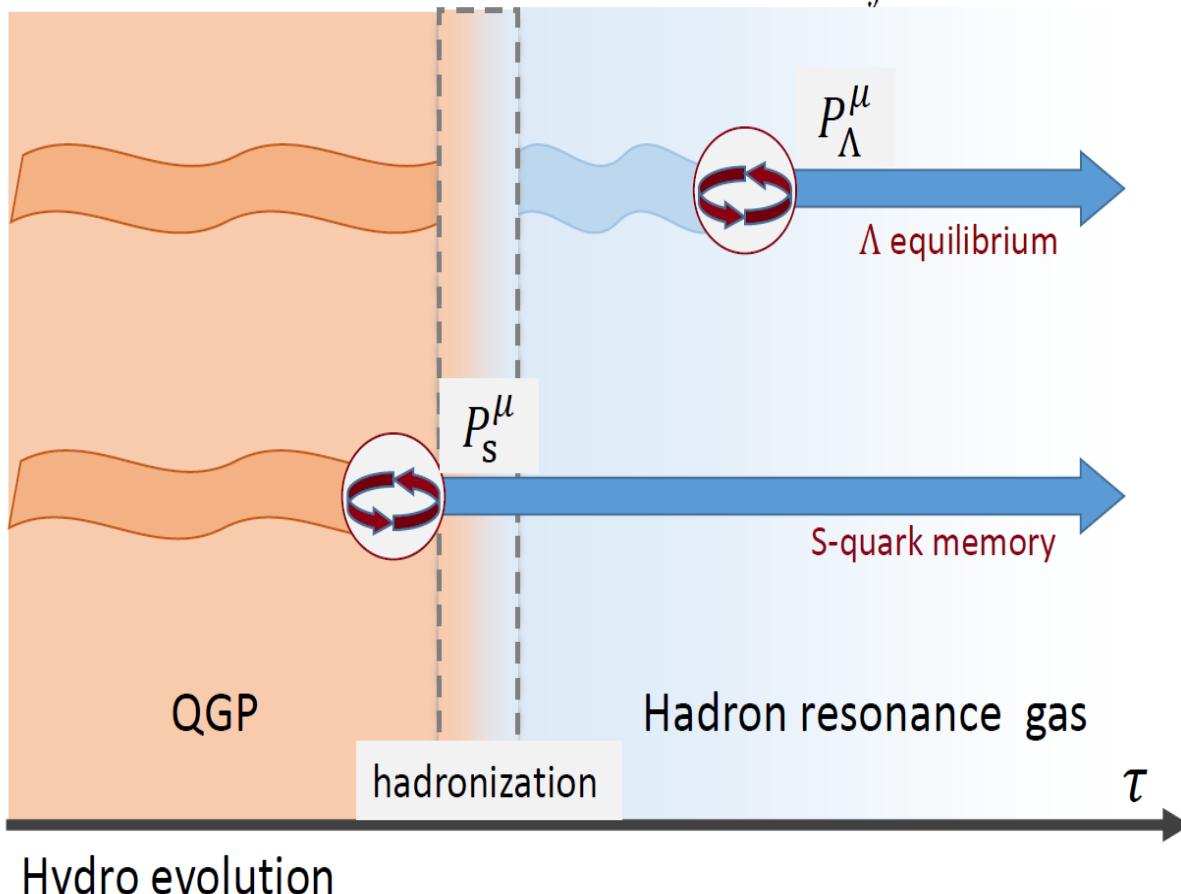
Similar result obtained independently by  
Becattini, Buzzegoli, Palermo, arXiv: 2103.10917

The only new effect

# ' $\Lambda$ equilibrium' vs. 'S-quark memory'

BF, S. Liu, L. -G. Pang, H. Song, Y. Yin,  
arXiv: 2103.10403

Spin Cooper-Frye:  $P^\mu(p) = \frac{\int d\Sigma^\alpha p_\alpha \mathcal{A}^\mu(x, \mathbf{p}; m)}{2m \int d\Sigma^\alpha p_\alpha n(\beta \varepsilon_0)}$



' $\Lambda$  equilibrium'

$$\tau_{\text{spin}, \Lambda} \rightarrow 0$$

Polarization of  $\Lambda$ -hyperon

$$P_\Lambda^\mu(p)$$

F. Becattini (2013)  
and later hydrodynamic(transport) calculations

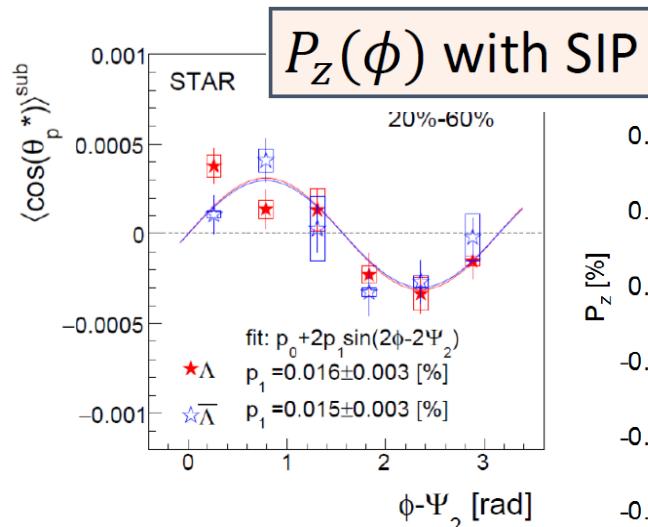
'S-quark memory'

$$\tau_{\text{spin}, \Lambda} \rightarrow \infty$$

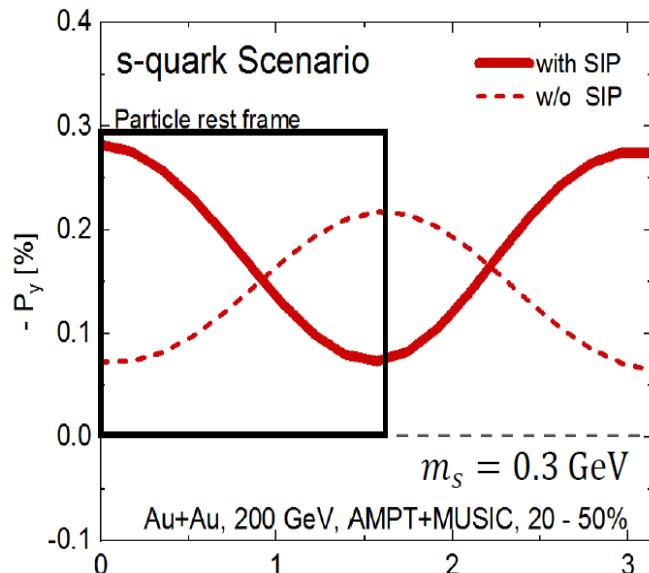
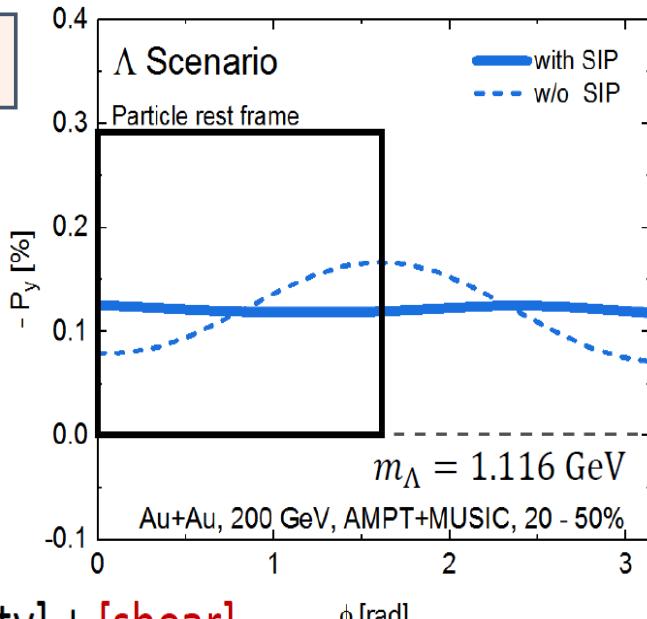
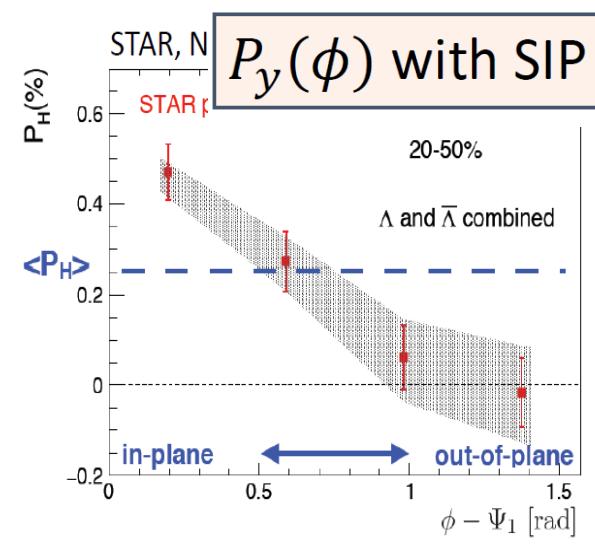
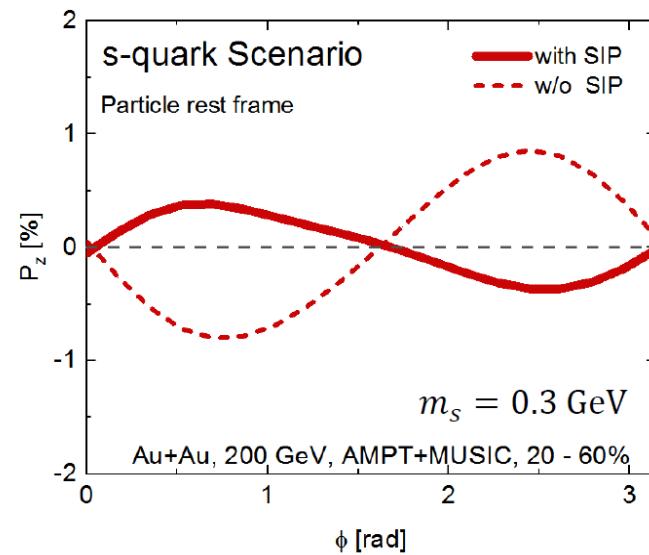
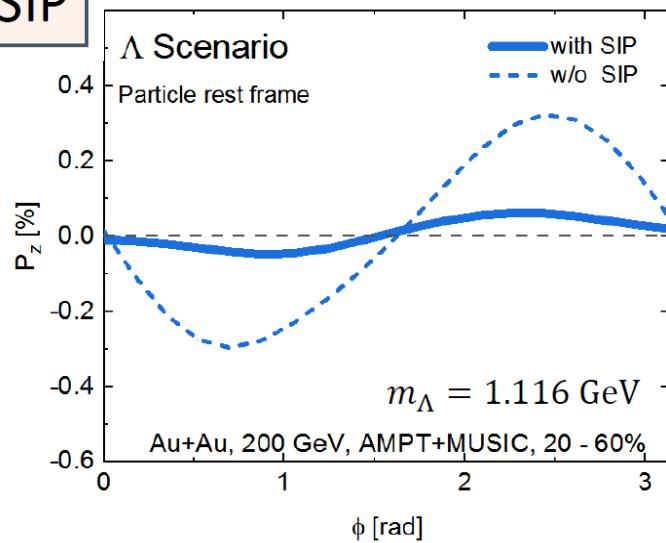
Polarization of S-quark

$$P_\Lambda^\mu(p) = P_s^\mu(p)$$

Z.-T. Liang, X.-N. Wang, PRL 94 (2005) 102301

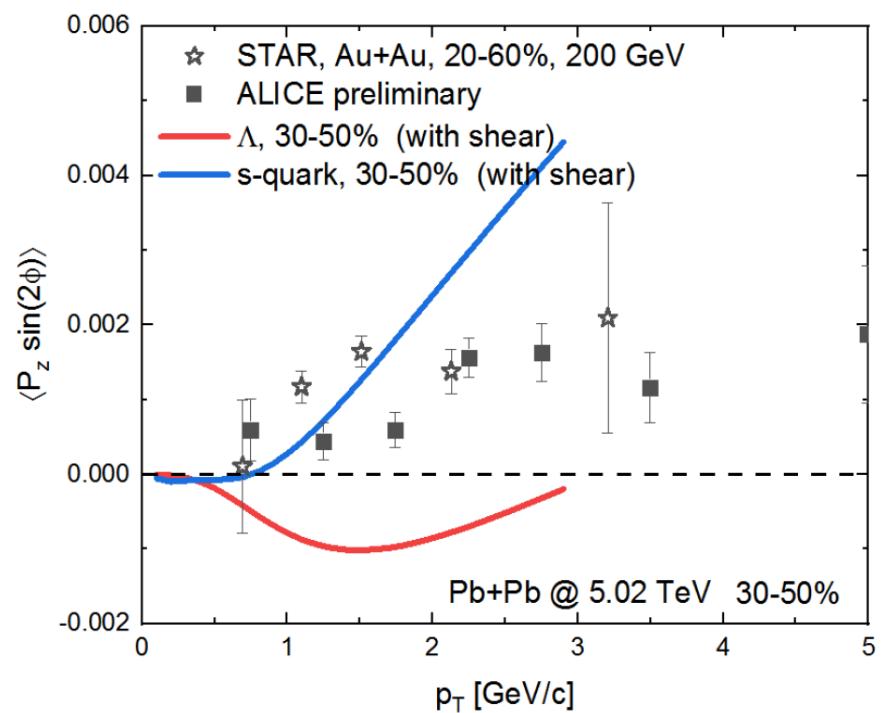
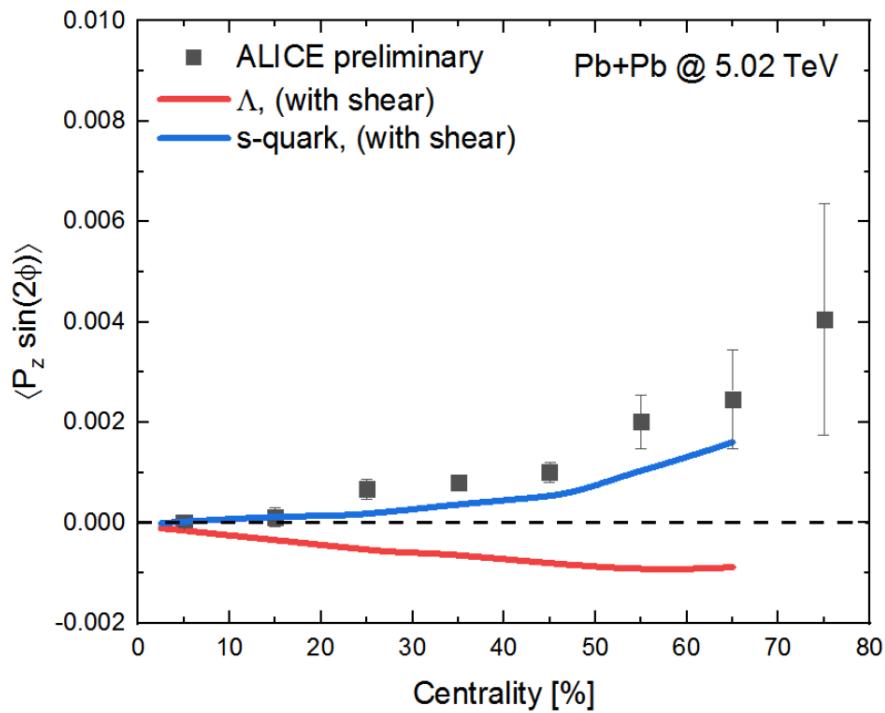


STAR, Phys.Rev.Lett. 123 (2019) 132301



Total  $P^\mu = [\text{thermal vorticity}] + [\text{shear}]$

# Local polarization at LHC energies





# Quark Gluon Plasma

Hottest Matter on Earth



Most Perfect Liquid

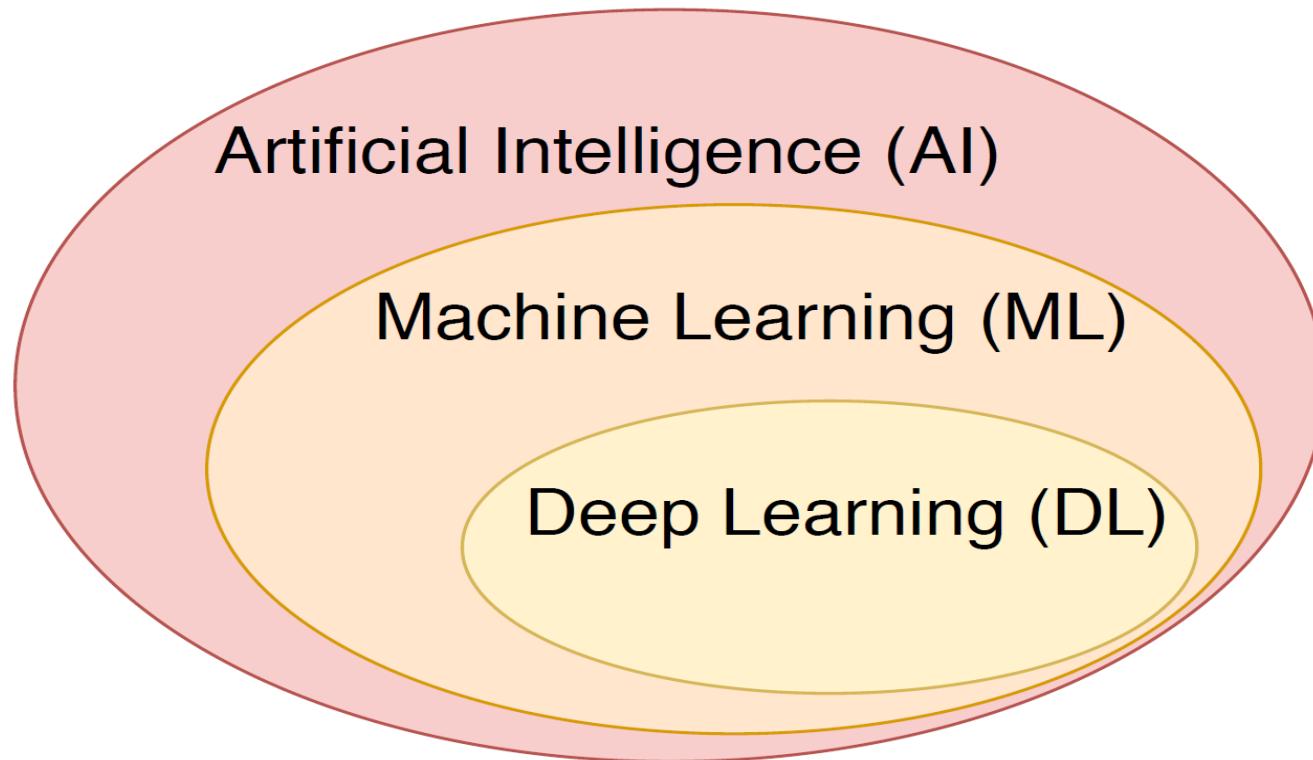


Most Vortical Fluid

# **Applications of Deep Learning in Relativistic Hydrodynamics**



# What is deep learning?



AI : the broadest term, applying to any technique that enables computers to mimic human intelligence.

ML: A subset of AI aiming at optimizing a performance criterion using example data or past experience, but without explicit instruction.

DL: A subset of ML aiming at understanding high-level representations of data using a deeper structure of multiple processing layers

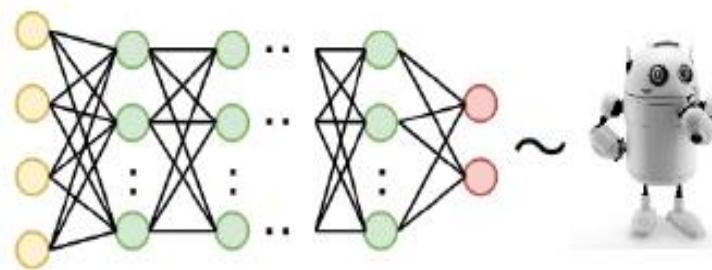
# An example of Deep Learning

-Identify cats and dogs

training  
"dog"



"cat"

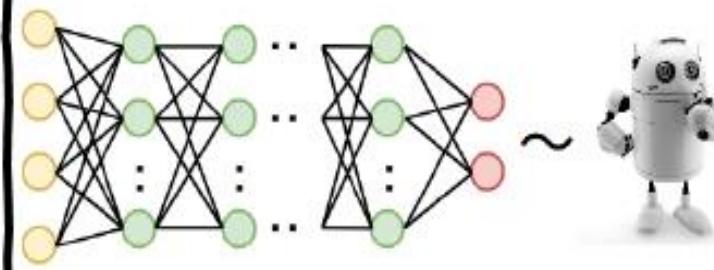


self-learning

testing



dog or cat?



well-trained

# Broad Applications of Deep Learning

## Computer vision

- Image identification
- Image style transition
- Image generation

... ... ... ...



## Language processing

- Machine translation
- Speech recognition
- Chinese poetry generation

... ... ... ...

秋夕湖上  
By a Lake at Autumn Sunset  
荻花风里桂花浮，  
The wind blows reeds with osmanthus flying,  
恨竹生云翠欲流。  
And the bamboos under clouds are so green as if to flow down.  
谁拂半湖新镜面，  
The misty rain ripples the smooth surface of lake,  
飞来烟雨暮天秋。



## Playing Games

- AlphaGo (by Google DeepMind)

... ... ... ...

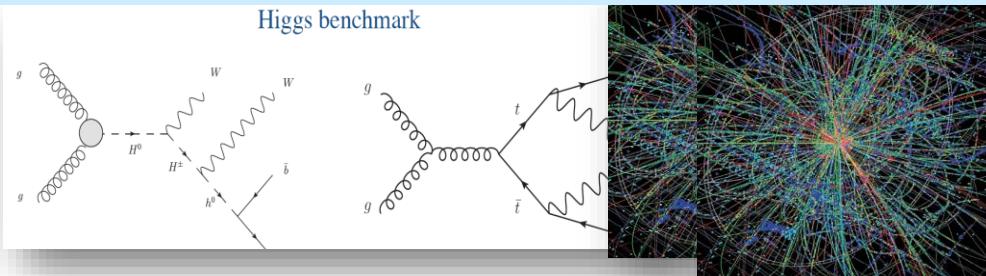
## Autonomous Driving

... ... ... ...

# 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
- ..., ...,
- ...

# Searching for Exotic Particles in High-Energy Physics



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

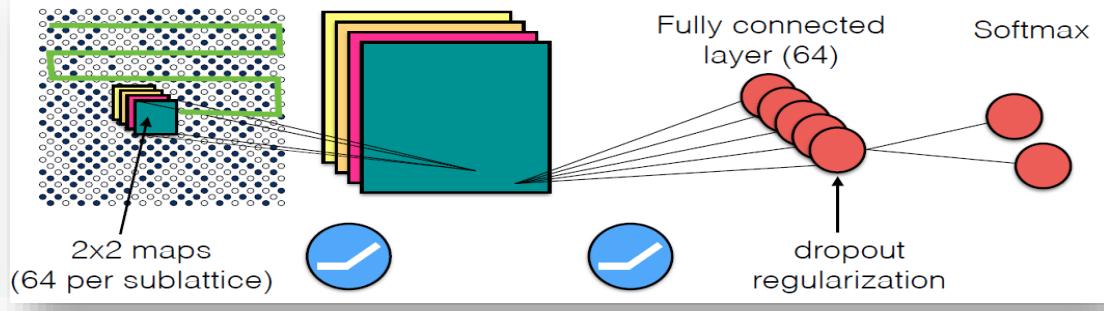
P.Baldi,P.Sadowski,& D.Whiteson Nature Commun.5, 4308 (2014)

## Classifying the Phase of Ising Model

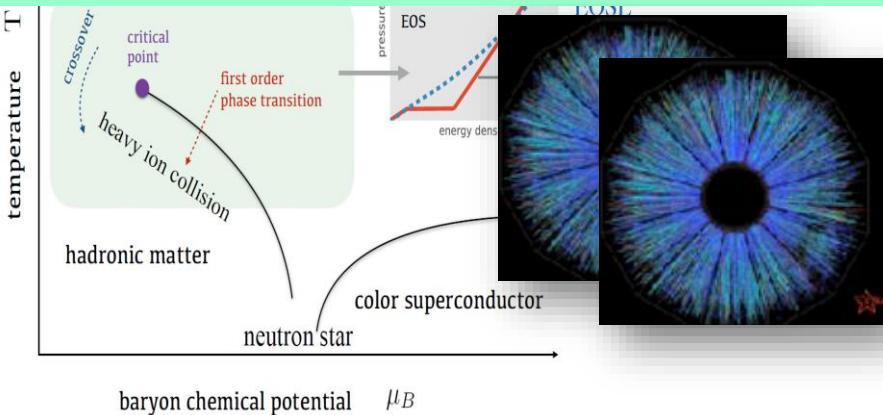
For the case of Ising gauge theory

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

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



## Identify QCD Phase Transition with Deep Learning



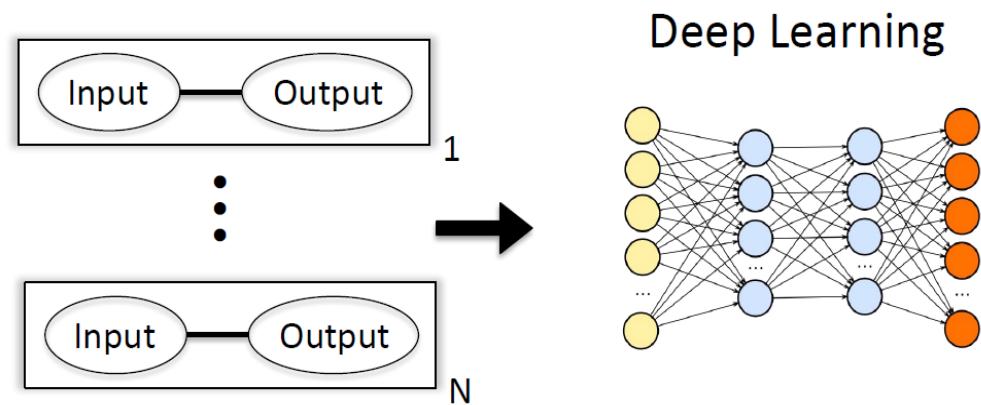
DNN efficiently decode the EOS information from the complex final particle info event by event

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

# 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.”*

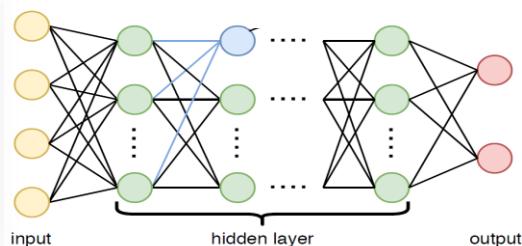
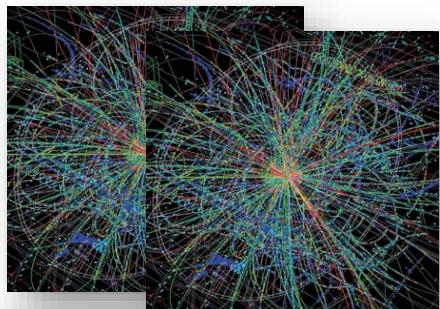


Can “**Black-box**” models learn patterns and models solely from data without relying on scientific knowledge?

# More Comments

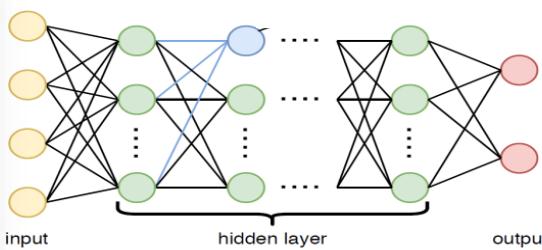
on several examples of supervised learning

## Image identification



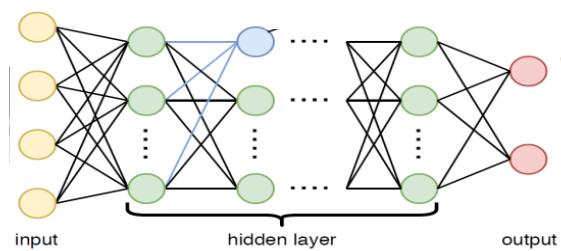
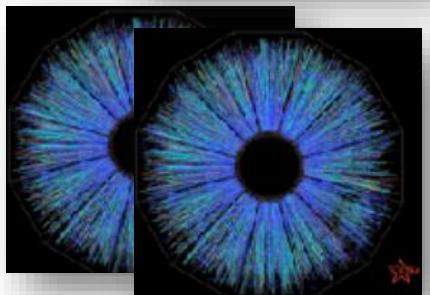
Higgs signal or background?

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



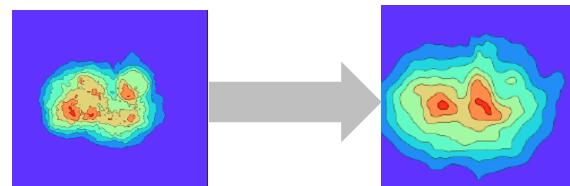
没毛病，比我還好看

提前看到2038年宝宝的样子

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



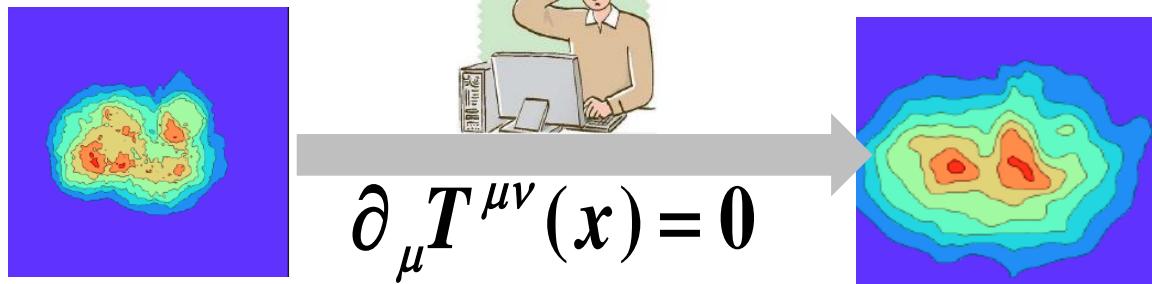
For the non-linear hydro system, can the **black-box** network could learn pattern transformations solely from data without relying on scientific knowledge?

( conservation laws)

# **Applications of deep learning to relativistic hydrodynamics**

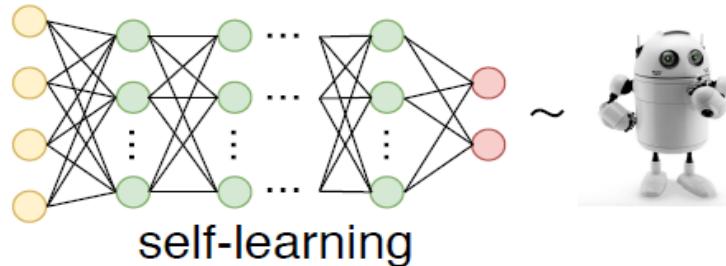
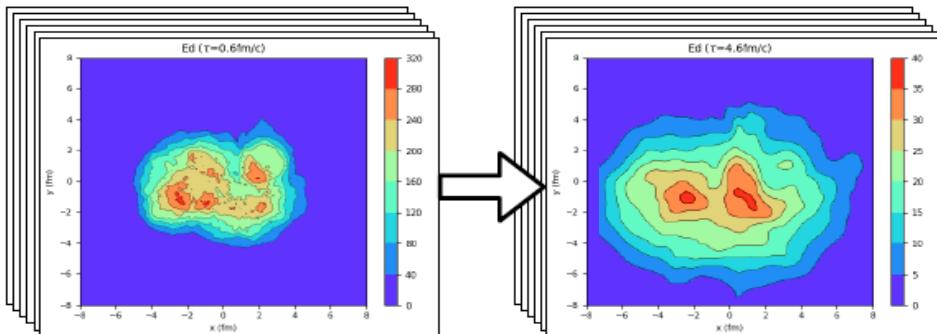
**H.Huang, B.Xiao, H.Xiong, Z.Wu, Y. Mu and H.Song Phys. Rev. Res. 3 2  
023256(2021)**

# Traditional hydrodynamics

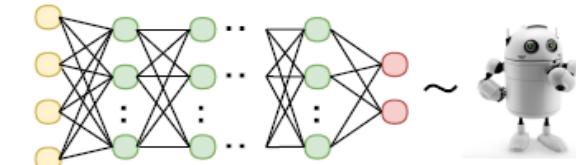
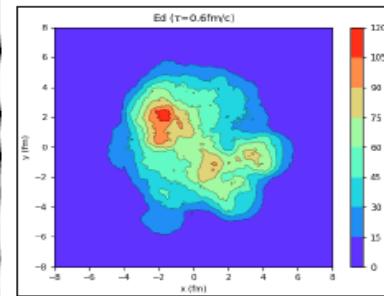


# Deep Learning

training



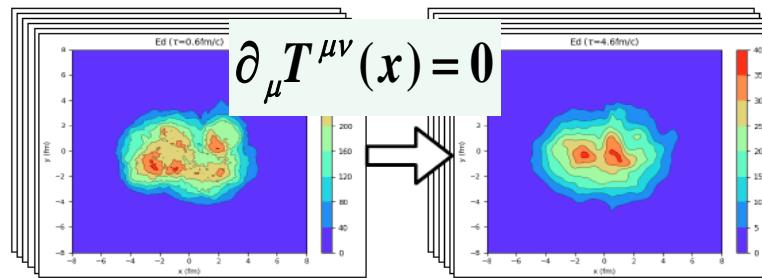
testing



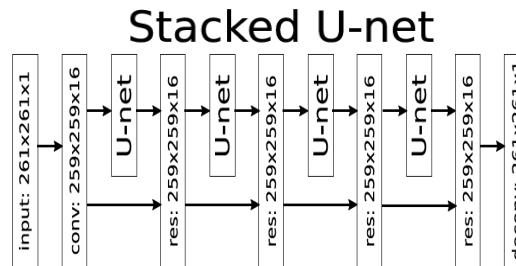
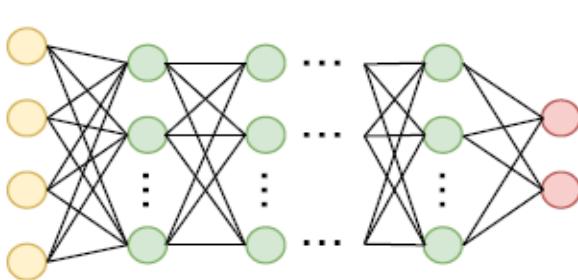
-Such deep learning systems do not need to be programmed with the hydro equation  $\partial_\mu T^{\mu\nu}(x) = 0$ . Instead, they learn on their own

# Deep Learning

Step1 ) Generate the training/testing data sets from hydro



Step2 ) Design & train the deep neural network

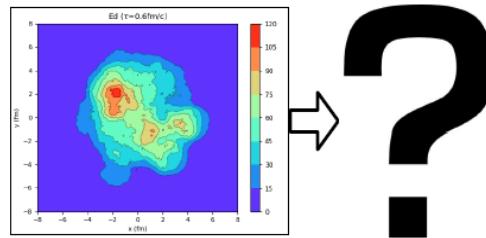


The Training Data Sets

hydro  
VISH2+1

MC-GI  
10000

Step3 ) Test the deep neural network



The Testing Data Sets

hydro  
VISH 2+1

MC-GI  
10000

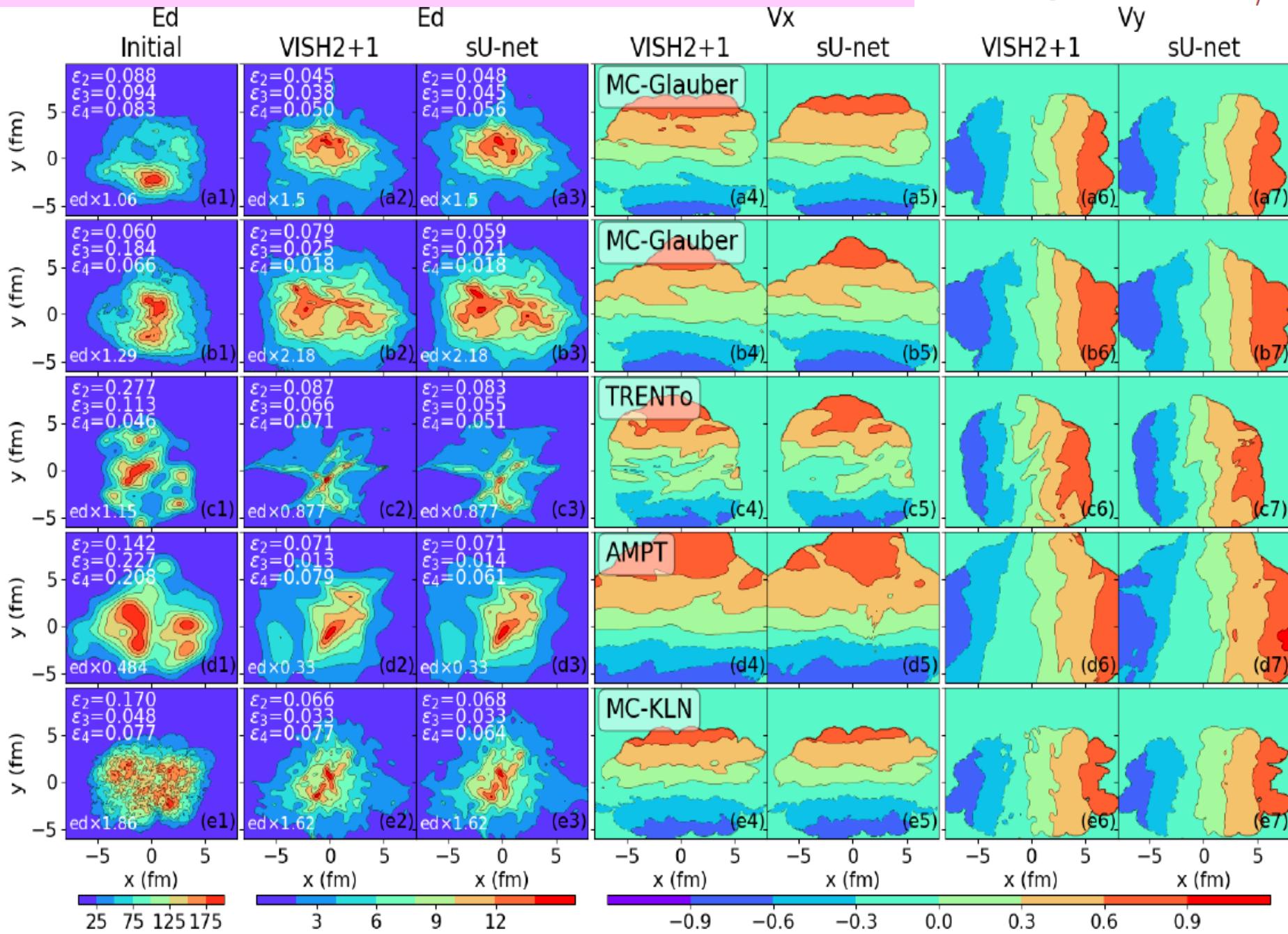
MC-KLN  
10000

AMPT  
10000

Trento  
10000

# sUnet prediction vs. hydro simulations

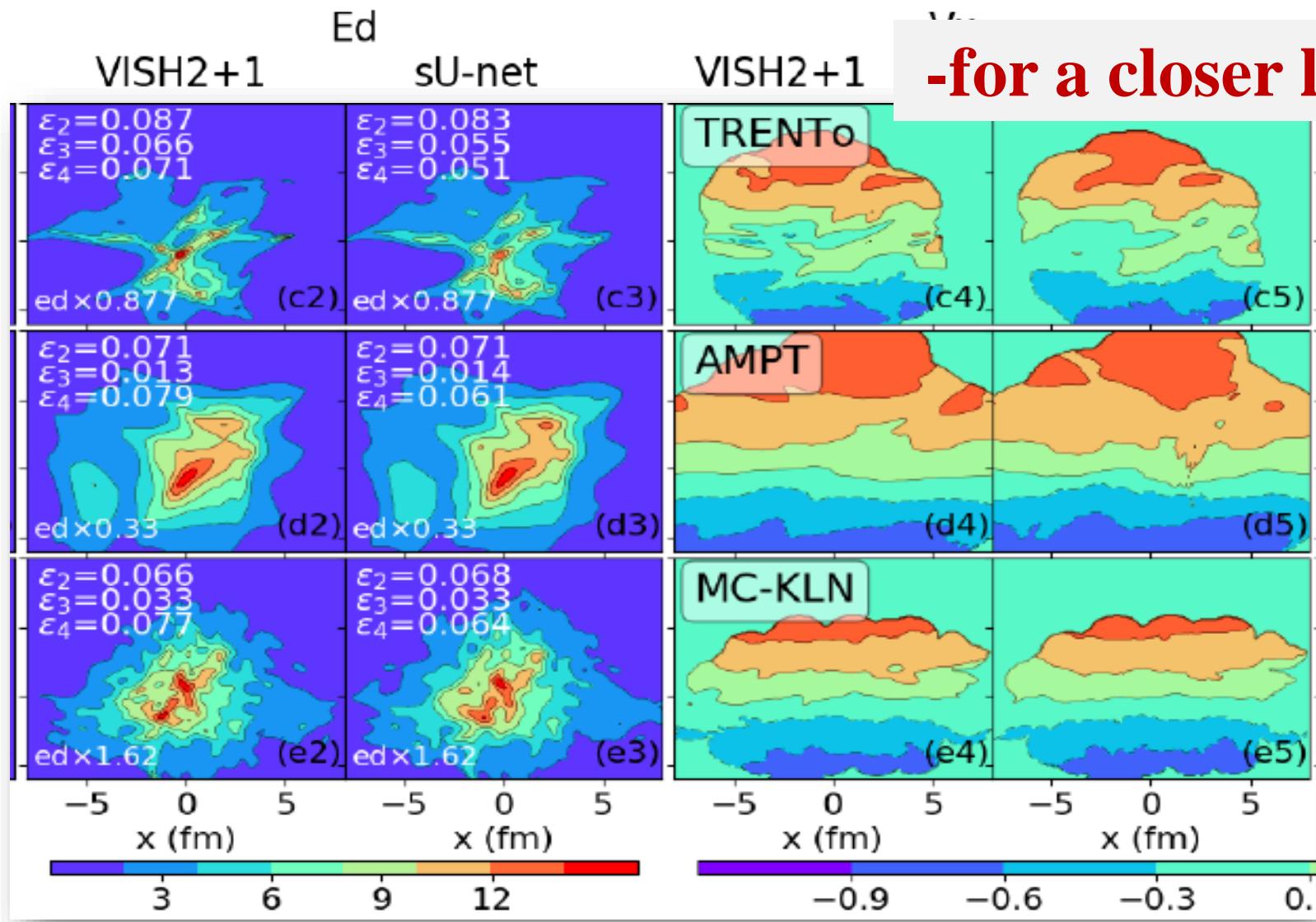
$$\tau - \tau_0 = 6.0 \text{fm}/c$$



# sUnet prediction vs. hydro simulations

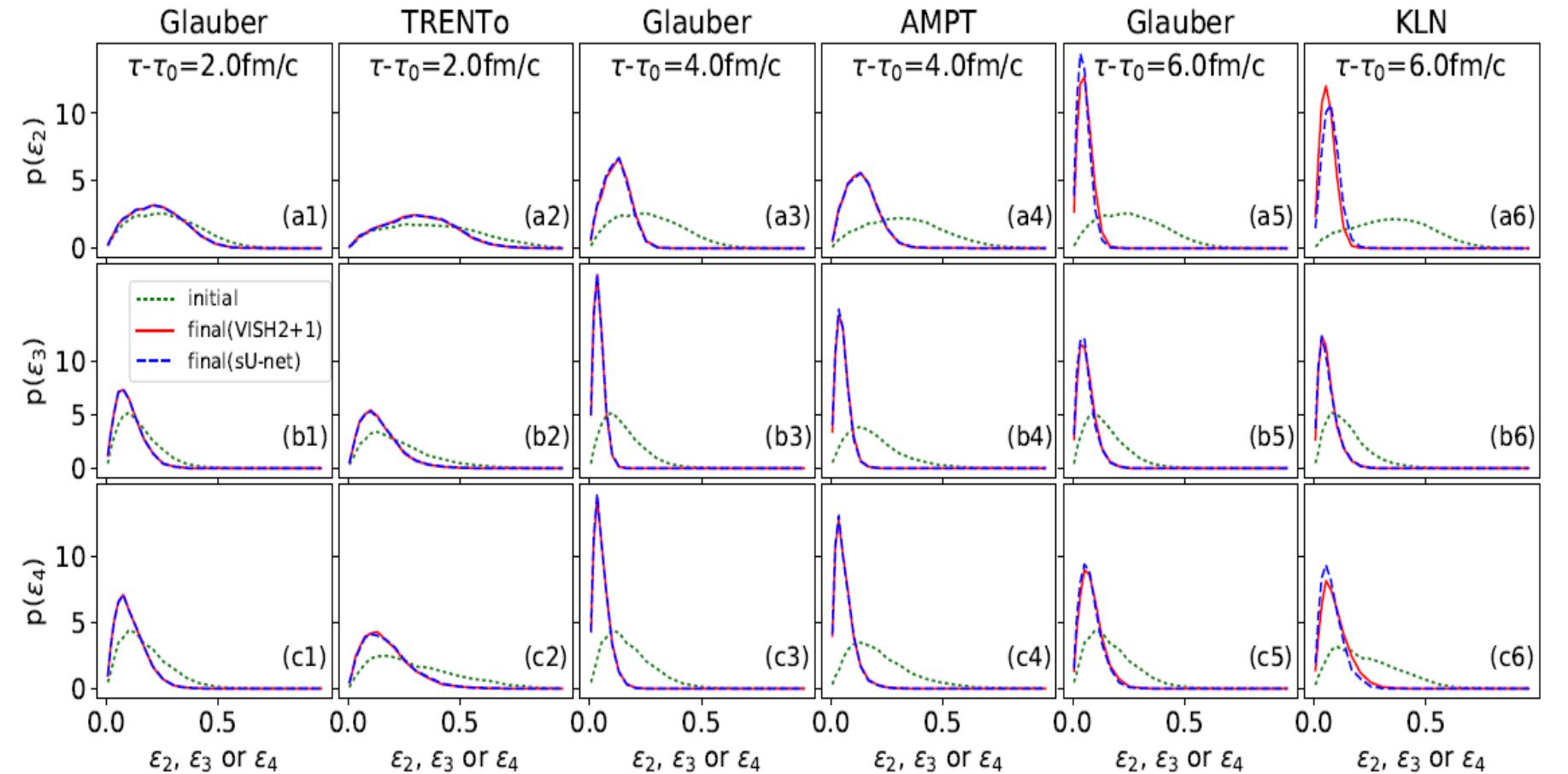
$$\tau - \tau_0 = 6.0 \text{fm}/c$$

-for a closer look



# sUnet prediction vs. hydro simulations

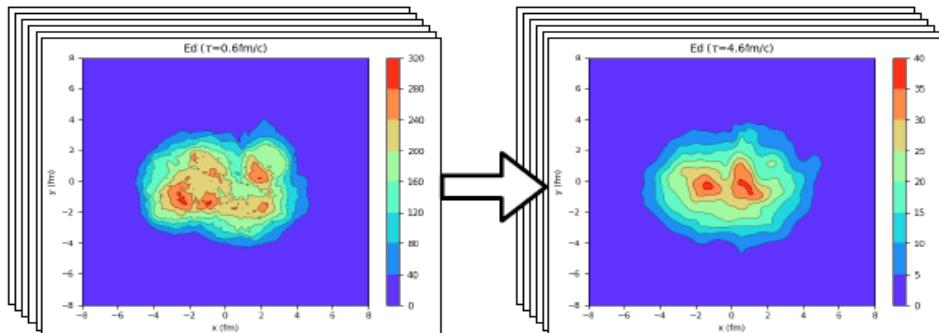
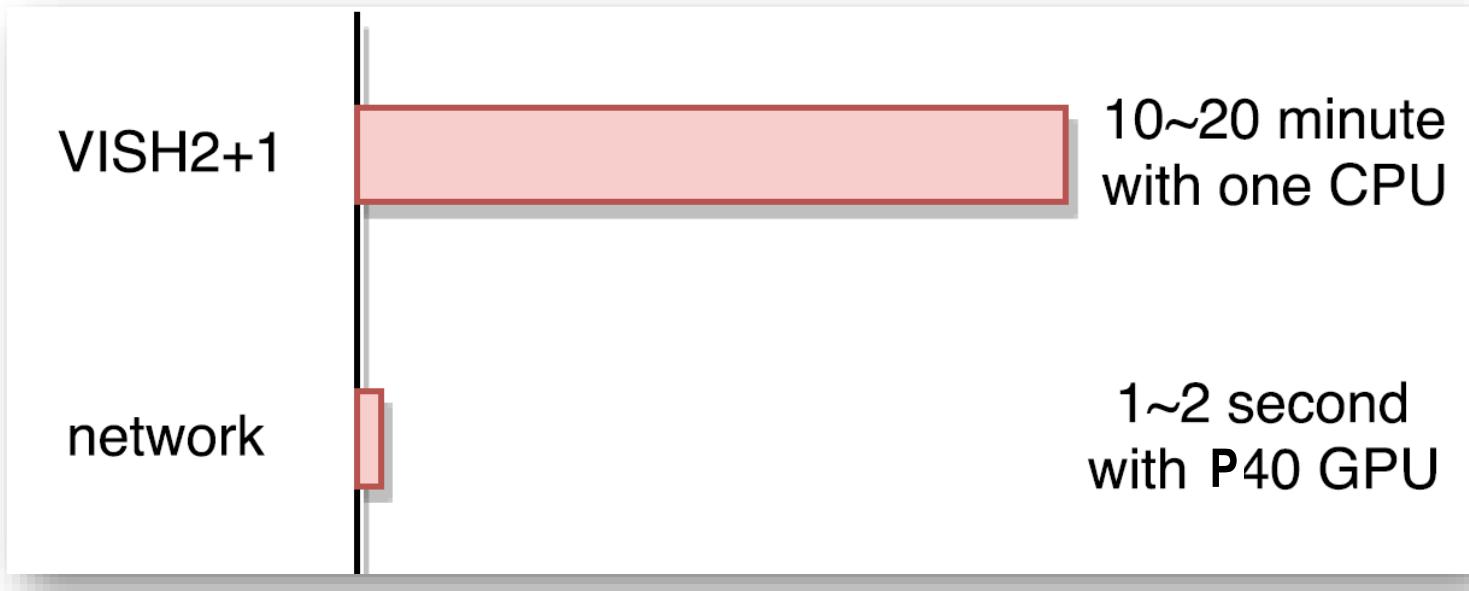
## Eccentricity distributions:



$$\varepsilon_n e^{in\Phi_n} = - \frac{\int dx dy r^2 e^{in\phi} e(x,y)}{\int dx dy r^2 e(x,y)}$$

--- initial  
— final(VISH2+1)  
--- final(sU-net)

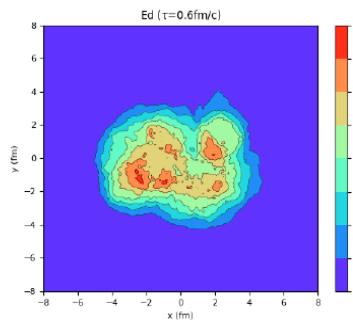
# Simulation time: sUnet vs. hydro



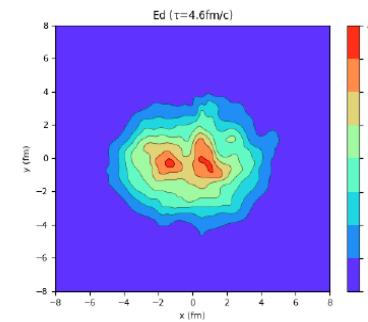
With the well trained network,  
the final state profiles can be  
quickly generated from the  
initial profiles.

# **Summary & outlook**

# Traditional hydrodynamics

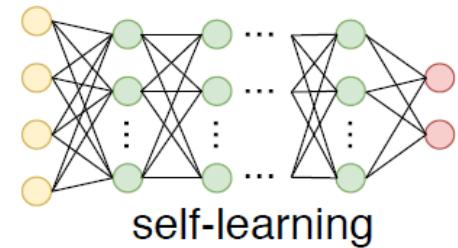
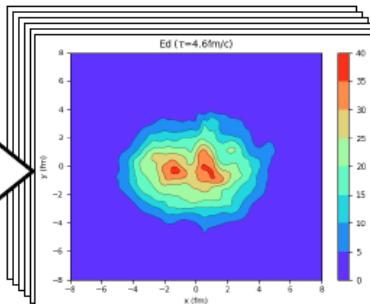
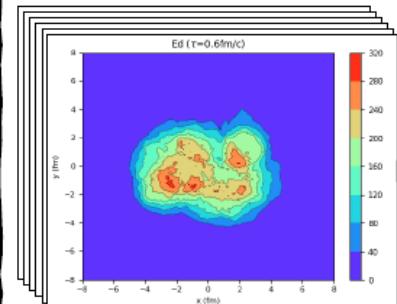


$$\partial_\mu T^{\mu\nu} = 0$$

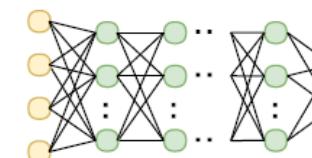
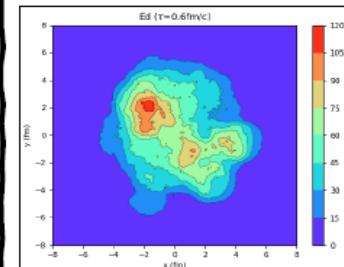


# Deep Learning

training



testing



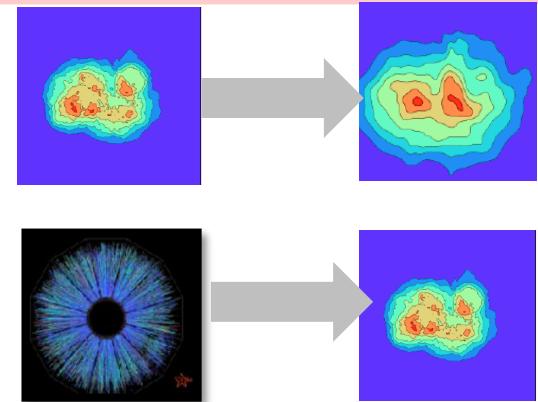
well-trained

# Outlook

## For hydrodynamics

Initial energy density profiles

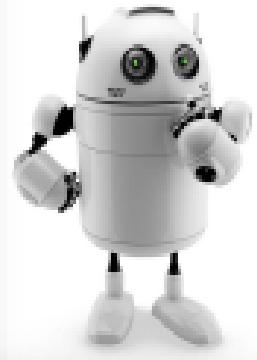
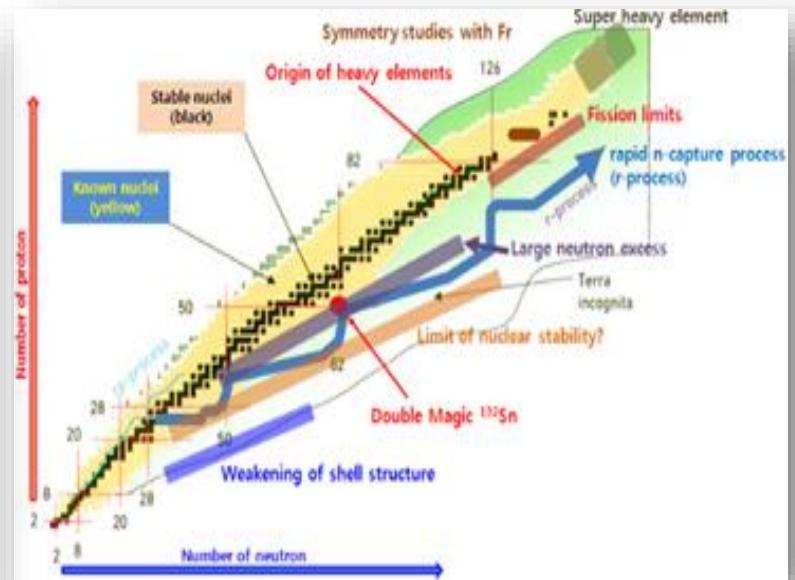
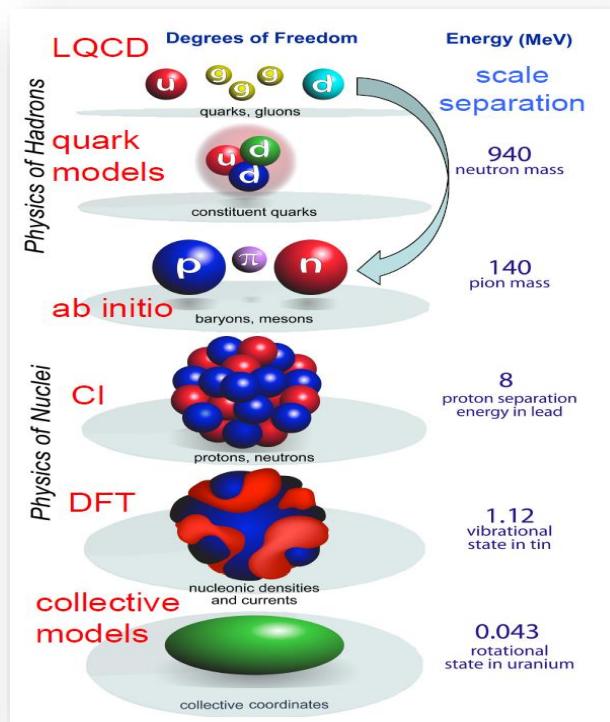
----- > final energy density velocity profiles



Final particle profiles

----- > Initial energy density profiles

## For Nuclear Physics



Many many more to explore . . .  
Enjoy it! have fun!











# Flow from the QGP

$$\mathsf{V}_2(\mathsf{P}_\mathsf{T})$$

$$\mathsf{V}_2(\mathsf{P}_\mathsf{T})$$