

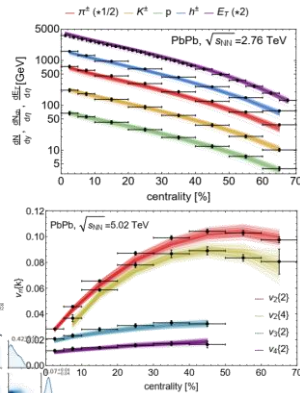
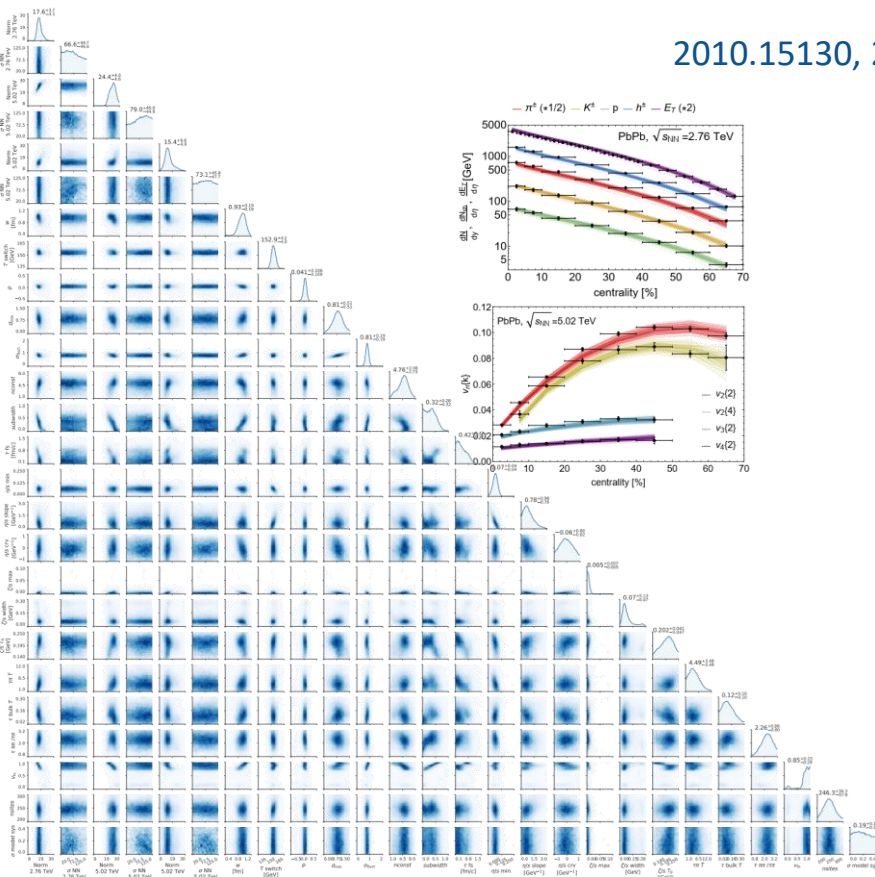


# A global analysis of Heavy Ion Collisions with transverse momentum dependence

Towards a precision analysis of heavy ion collisions

Based on *Trajectum* with Govert Nijs

2010.15130, 2010.15134 with Govert Nijs, Umut Gursoy and Raimond Snellings



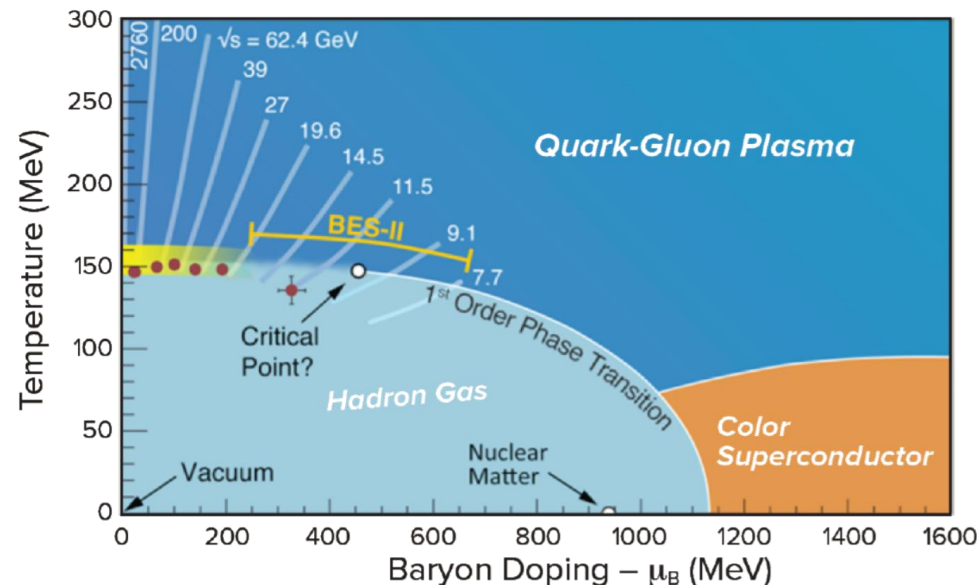
Roman excavations in Utrecht (from *Trajectum*, or bridge) in 1929

**Wilke van der Schee**

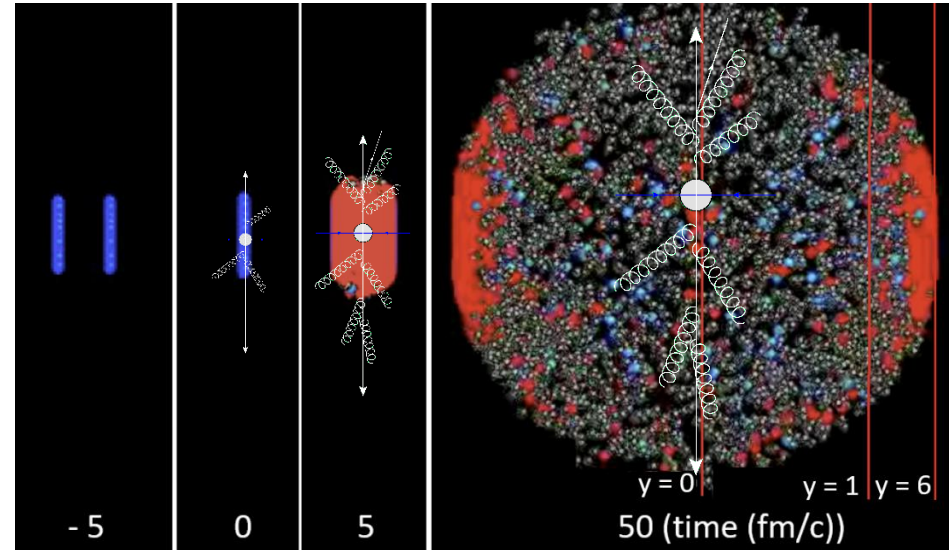
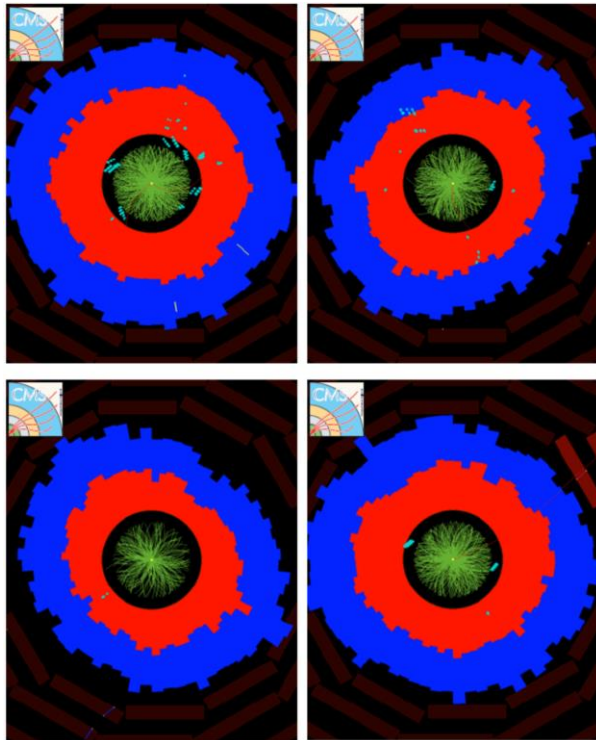
Heavy Ion seminar, Niels Bohr Institute  
Copenhagen, 26 November 2020

# Why do we study heavy ion collisions?

1. Fundamental force of nature
2. Perhaps the simplest form of complex matter
  - Confinement: hadron gas in IR
  - Cross-over to quark-gluon plasma
  - QGP: strongly coupled
  - A critical point?

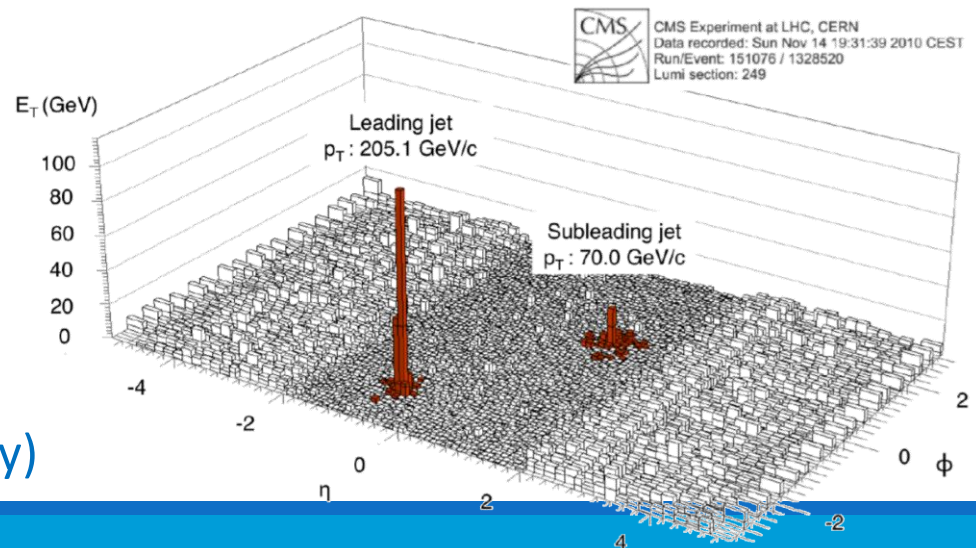


# Quark-gluon plasma is strongly interacting



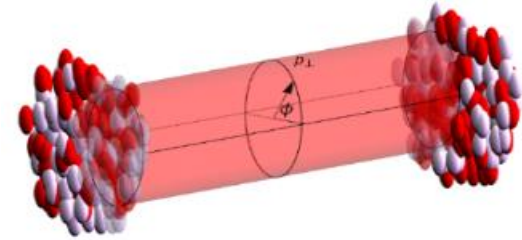
## Studying the most perfect liquid

- Jet energy loss in dijet pair
- Anisotropic flow (small viscosity)



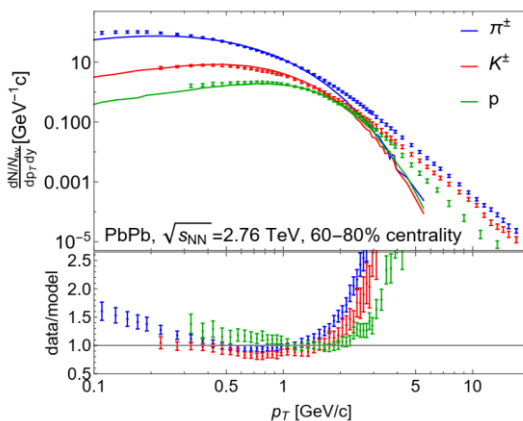
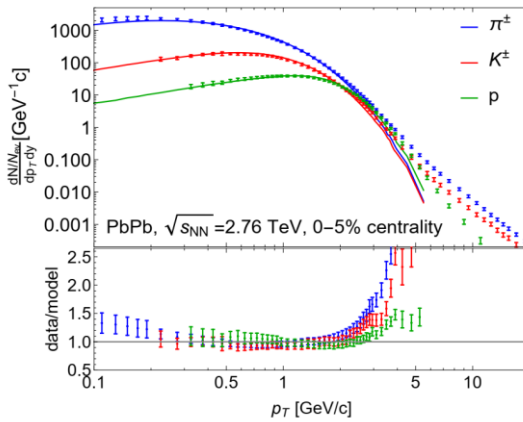
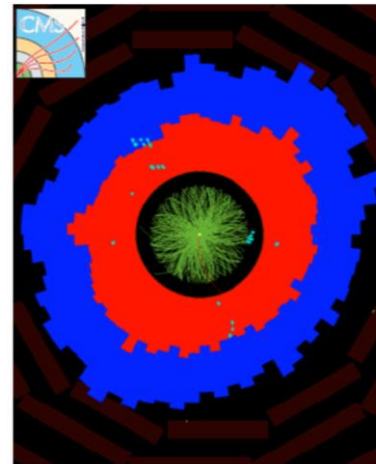
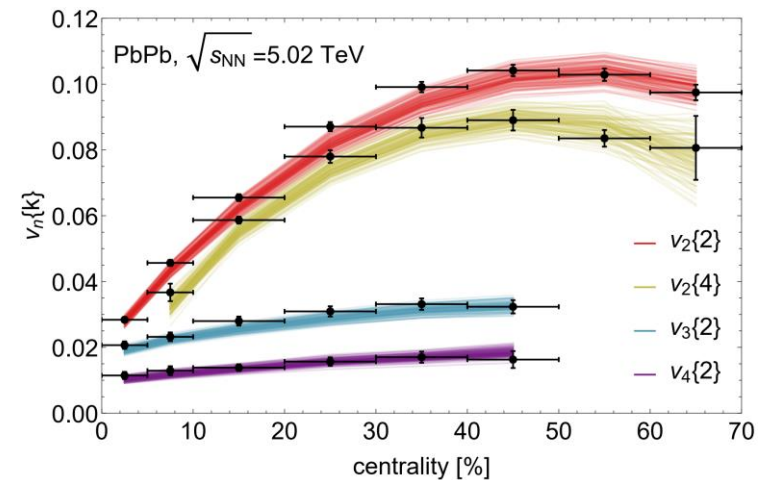
# A wealth of experimental data

## Spectra for pions, kaons and protons



## Quantify anisotropic flow: Fourier coefficients:

- $v_2$  : elliptic flow
- $v_3$  : triangular flow, etc



# What do we study in heavy ion collisions?

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## 1. Fundamental force of nature

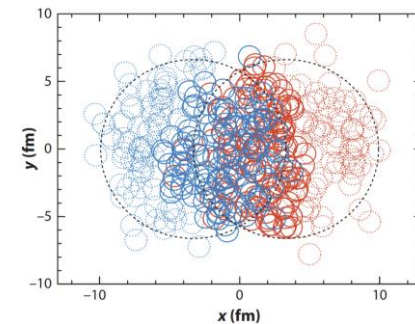
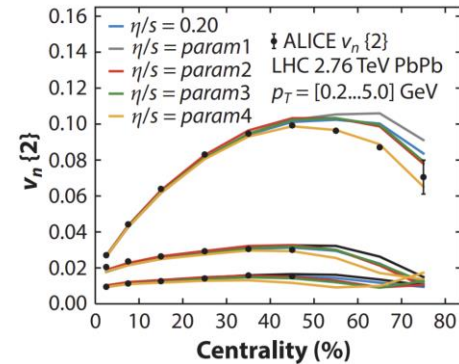
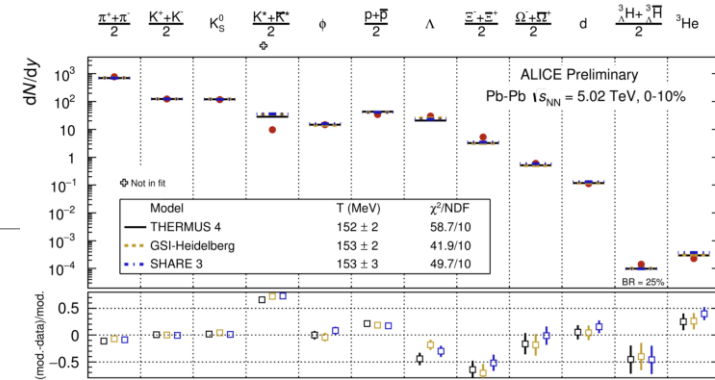
- Asymptotic freedom: from quasi-particles to strong coupling
- Can we understand transport when it is close to equilibrium?
- Can we understand the collision itself? Hydrodynamisation?

## 2. A lot of qualitative progress in (simple?) models

- Ideally simple relations: elliptic flow  $\rightarrow$  shear viscosity
- Realistically all aspects of heavy ion collisions influence elliptic flow

# What have we learnt?

1. Particle ratios: approximately thermal
2. Hydrodynamics for PbPb up to 50% centrality
  - 'fast' applicability: within 1 or 2 fm/c
  - Small specific shear viscosity
3. Initial shape: some variation of Monte Carlo Glauber



# What are the open questions?

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## 1. Particle ratios: (sizeable) deviations from thermal equilibrium

- Viscous corrections within hydrodynamics (later)

Hydro at large Reynolds

## 2. Hydrodynamics for very peripheral PbPb and pPb?

- How fast? 0.1 fm/c or 1.5 fm/c?
- T-dependent shear viscosity, bulk viscosity
- Second order transport relevant?

Is QGP strongly coupled?  
At which energy scale?  
Non-conformal?

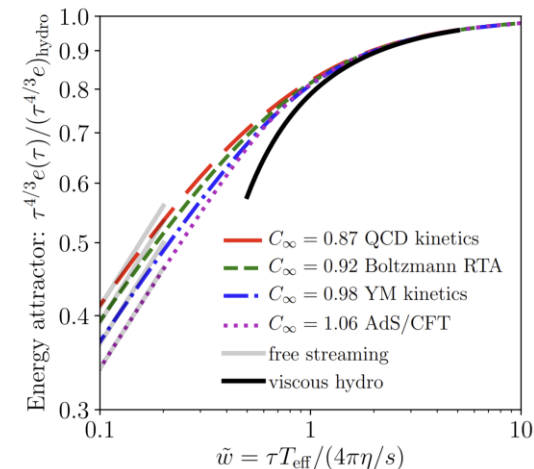
## 3. Initial shape: how to convert colliding nucleons to energy density

- Not even settled if binary collisions are ruled out (!)
- More profound in pPb: spherical proton unlikely

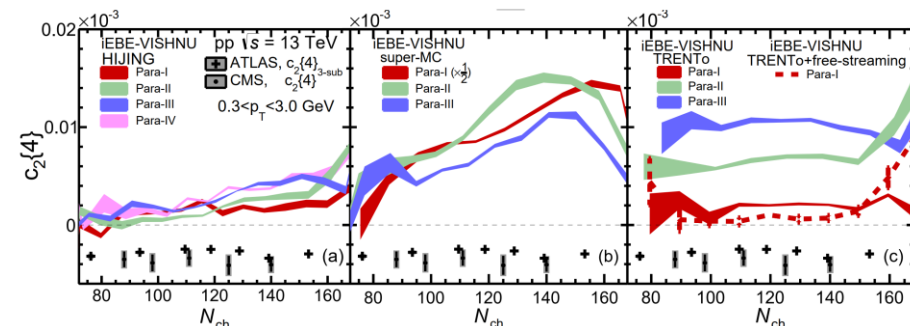
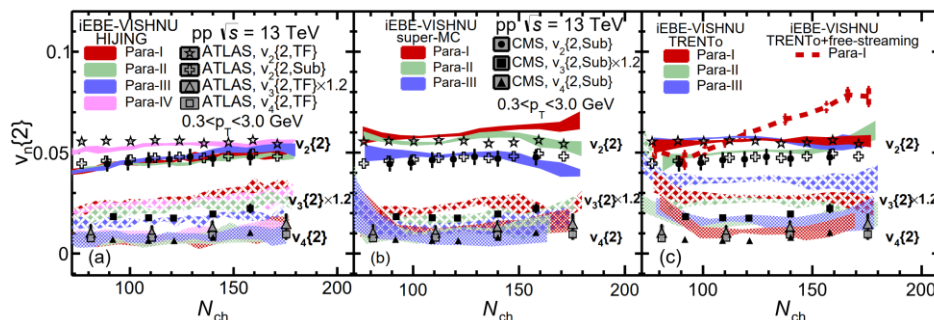
What are the d.o.f.?  
Partons? Glasma?

# Questions are becoming more precise

- Theoretically: are we sensitive to the first 2 fm/c?
  - A (perceived?) equivalence between weakly/strongly coupled approaches
  - But note dependence of  $\eta/s$  is scaled out
  - Smaller systems may be more sensitive to microscopics*



- Experimentally: can we understand soft observables in small systems?



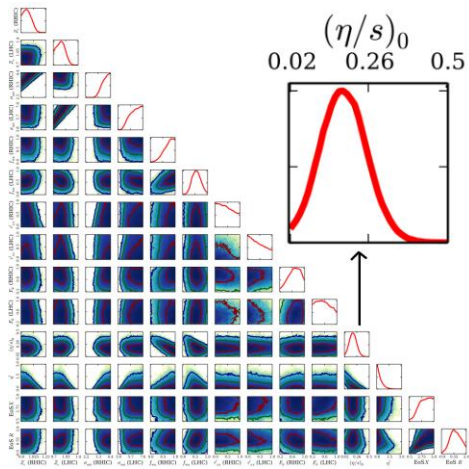
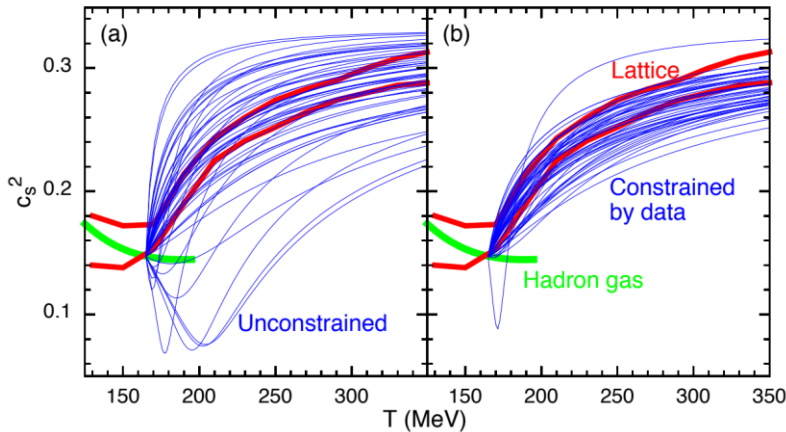


# First global analyses

## Constraining EOS (Jan 2015)

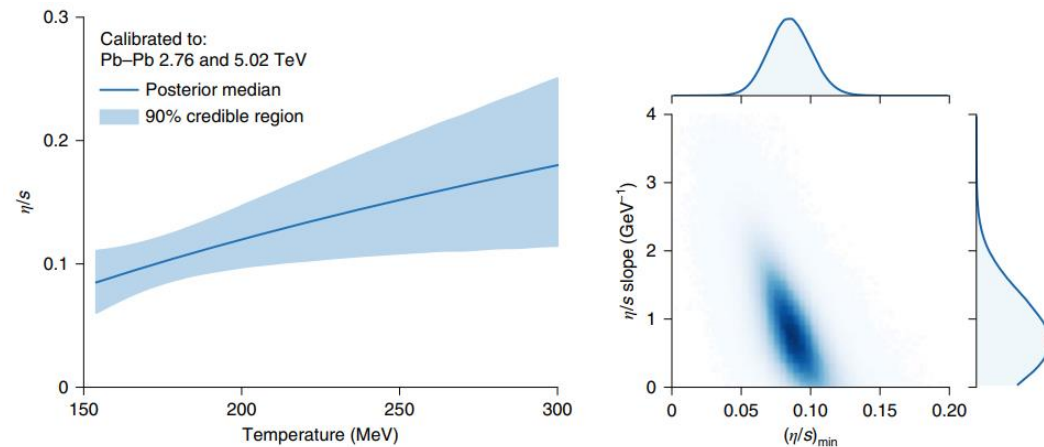
Precise questions require precise understanding of interplay of rich physics in heavy ion collisions

Prior                      Posterior (data)



## Constraining $\eta/s$ (2019, Nature Physics)

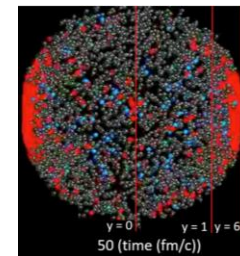
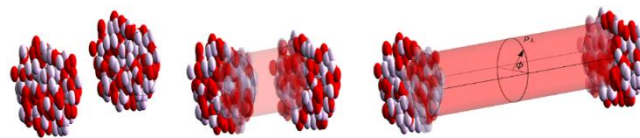
### $\eta/s$ versus temperature Posterior ( $\eta/s$ +slope)



Jonah E. Bernhard, J. Scott Moreland and Steffen A. Bass  
 Bayesian estimation of the specific shear and bulk viscosity of quark–gluon plasma

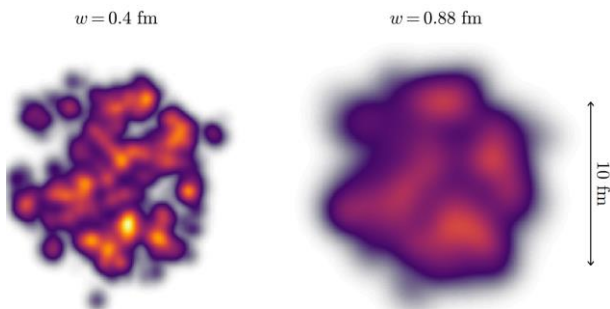
Important: ‘average’ viscosity better constrained than T-dependent viscosity

# Standard model of heavy ion collisions



## Initial stage (9)

Subnucleonic structure? (7)



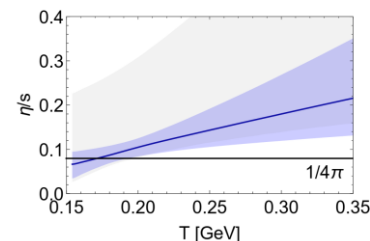
Non-thermal flow? (2)

Yes: for time  $\tau$  with varying speed

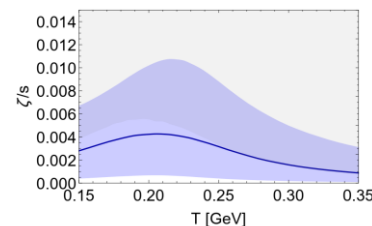
Fluctuations? (1)

## Viscous hydrodynamics (9) Cascade of hadrons (1)

Shear viscosity (3)



Bulk viscosity (3)



Second order transports: 3

Convert quark-gluon plasma at  $T_{\text{switch}}$  to particles following Boltzmann distribution (particlization, 1)

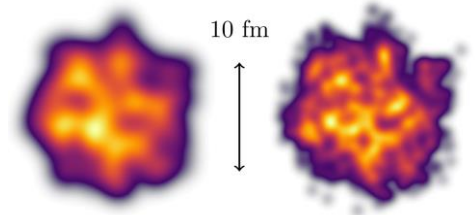
Subtle: viscous corrections

Evolve particles with hadronic code: SMASH

# Initial geometry: two (three?) uncertainties

## 1. The structure of nucleons

- $n_c$  constituents of Gaussian subwidth  $v$  within a nucleon of width  $w$
- Nucleons placed according to MC Glauber



## 2. How do colliding (sub)nucleons deposit their energy? $\mathcal{T} = \left( \frac{\mathcal{T}_A^p + \mathcal{T}_B^p}{2} \right)^{1/p}$

- For  $p = 0$  we get  $\mathcal{T} = \sqrt{\mathcal{T}_A \mathcal{T}_B}$ : close to EKRT or Holography ( $\mathcal{T} \approx (\mathcal{T}_A \mathcal{T}_B)^{4/9}$ )
- Does not quite allow binary scaling?

## 3. (Quantum) fluctuations in the above: Gamma-distribution:

- Goes beyond MC Glauber fluctuations

$$p(T) = \frac{1}{\Gamma(1/\sigma)\sigma^{1/\sigma}} T^{(1-\sigma)/\sigma} e^{-T/\sigma}$$

# Pre-flow and initial conditions

---

## 1. Free streaming with free streaming velocity

- → Match stress energy tensor to hydro

$$\hat{p}^\mu = \begin{pmatrix} 1 \\ v_{fs} \cos \phi \\ v_{fs} \sin \phi \end{pmatrix}$$

$$T^{\mu\nu}(x, y) = \frac{1}{2\pi\tau_{fs}} \int_0^{2\pi} d\phi \hat{p}^\mu \hat{p}^\nu \mathcal{T}(x - v_{fs}\tau_{fs} \cos \phi, y - v_{fs}\tau_{fs} \sin(\phi))$$

## 2. Important: velocity also determines pressure

- Allows pressureless fluid ( $P=0$ ) all the way till conformal EOS ( $P=e/3$ )
- In reality in equilibrium around 400 MeV we have  $P = 0.85 e/3$

# Hydrodynamics: first and second order

1. Constitutive relations for the stress tensor, with  $p(\rho)$  EOS from HotQCD

$$T^{\mu\nu} = \rho u^\mu u^\nu - (p + \Pi)\Delta^{\mu\nu} + \pi^{\mu\nu}, \quad \Delta^{\mu\nu} = g^{\mu\nu} - u^\mu u^\nu$$

With shear and bulk tensors:

$$D\Pi = -\frac{1}{\tau_\Pi} [\Pi + \zeta \nabla \cdot u + \delta_{\Pi\Pi} \nabla \cdot u \Pi - \lambda_{\Pi\pi} \pi^{\mu\nu} \sigma_{\mu\nu}],$$

$$\Delta_\alpha^\mu \Delta_\beta^\nu D\pi^{\alpha\beta} = -\frac{1}{\tau_\pi} \left[ \pi^{\mu\nu} - 2\eta \sigma^{\mu\nu} + \delta_{\pi\pi} \pi^{\mu\nu} \nabla \cdot u - \phi_7 \pi_\alpha^{\langle\mu} \pi^{\nu\rangle\alpha} \right. \\ \left. + \tau_{\pi\pi} \pi_\alpha^{\langle\mu} \sigma^{\nu\rangle\alpha} - \lambda_{\pi\Pi} \Pi \sigma^{\mu\nu} \right].$$

2. We vary the **green** coefficients,  $\eta$  and  $\zeta$  as a function of temperature,

2<sup>nd</sup> order according to  $\frac{\tau_{\Pi s} \mathbf{T} \delta^2}{\zeta}$ ,  $\frac{\tau_\pi s \mathbf{T}}{\eta}$  and  $\frac{\tau_{\pi\pi}}{\tau_\pi}$

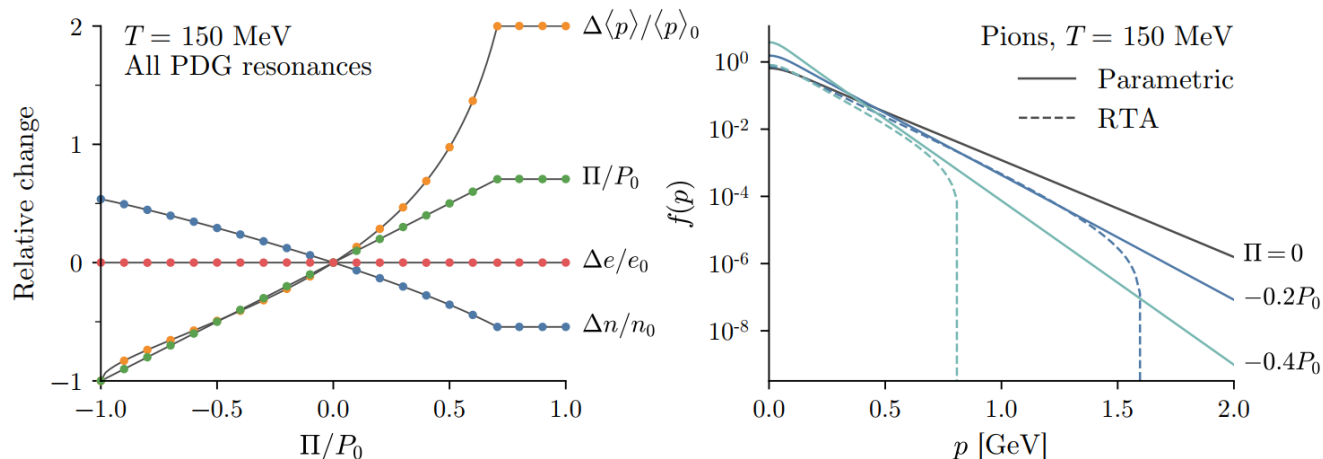
# Particlization: viscous corrections

$$T^{\mu\nu} = \sum_{\text{sp}} g \int \frac{d^3p}{(2\pi)^3} \frac{p^\mu p^\nu}{E} f(p),$$

1. Particles in fluid restframe cannot be in thermal equilibrium
2. Several methods that (only) agree for small deviations

$f(p) \rightarrow z_{\text{bulk}} f(p + \lambda_{\text{bulk}} p)$  parametric, rescale  $p$ : fix  $z$  and  $\lambda$  such that  $e$  and  $P$  match

$\delta f = f_0(1 \pm f_0) \frac{\tau}{ET} \left[ \frac{1}{2\eta} p^i p^j \pi_{ij} + \frac{1}{\zeta} \left( \frac{p^2}{3} - c_s^2 E^2 \right) \Pi \right]$  change  $f(p)$  directly, motivated by RTA



'Parametric' clearly better at high  $p_T$ , but somewhat ad-hoc and species independent

# Performing a global analysis

Bayes theorem:

$$\mathcal{P}(\mathbf{x}|\mathbf{y}_{\text{exp}}) = \frac{e^{-\Delta^2/2}}{\sqrt{(2\pi)^n \det(\Sigma(\mathbf{x}))}} \mathcal{P}(\mathbf{x})$$

$$\text{with } \Delta^2 = (\mathbf{y}(\mathbf{x}) - \mathbf{y}_{\text{exp}}) \cdot \Sigma(\mathbf{x})^{-1} \cdot (\mathbf{y}(\mathbf{x}) - \mathbf{y}_{\text{exp}})$$

We have a 20-dimensional parameter space and 514 datapoints

- Run model on 1000 `design' points, spaced on a latin hypercube (Iplus 😊)
- `Interpolate' results by training a Gaussian Process Emulator

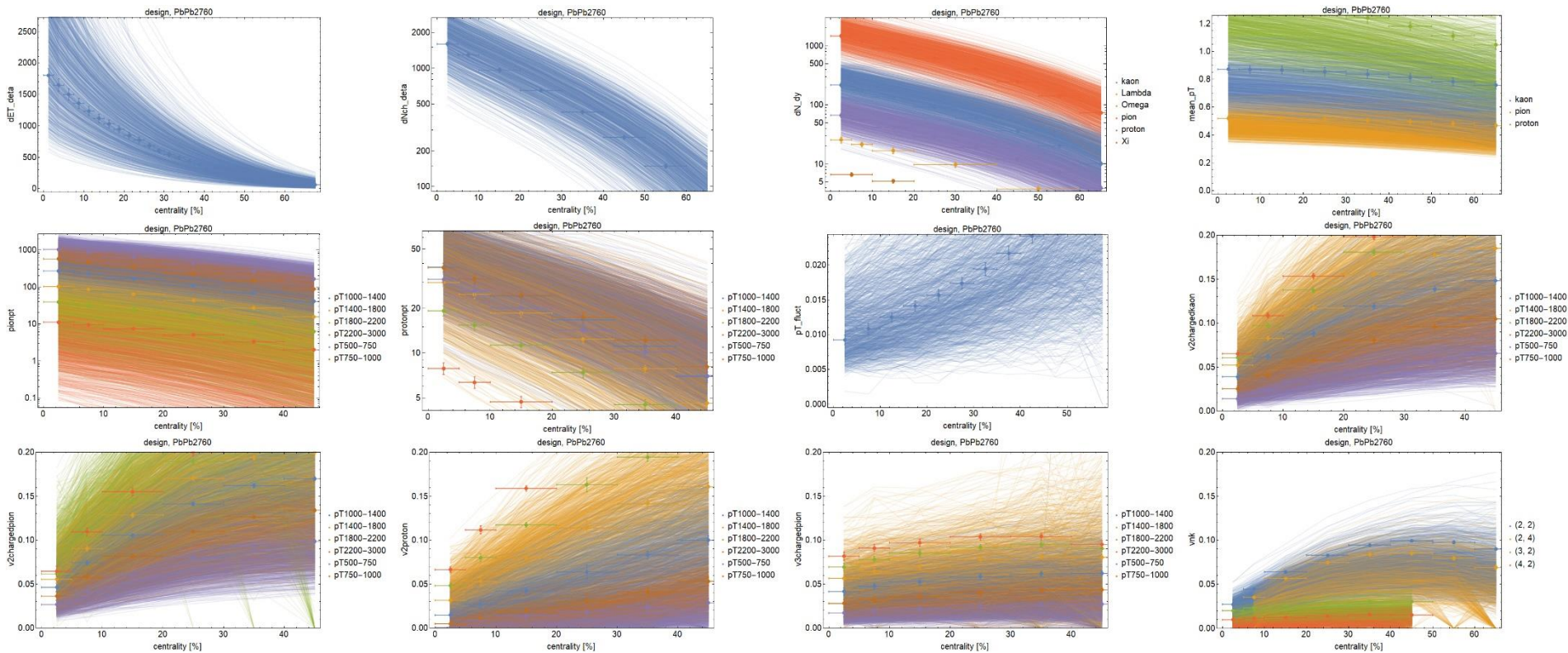
Markov Chain Monte Carlo (emcee2.2)

- Obtain sample of  $10^6$  likely values

Compare posterior with data

- From emulator (emulator has its own uncertainty estimate)
- A high statistics run at the optimal value (MAP, maximum a posteriori)

# Overview of selected model output

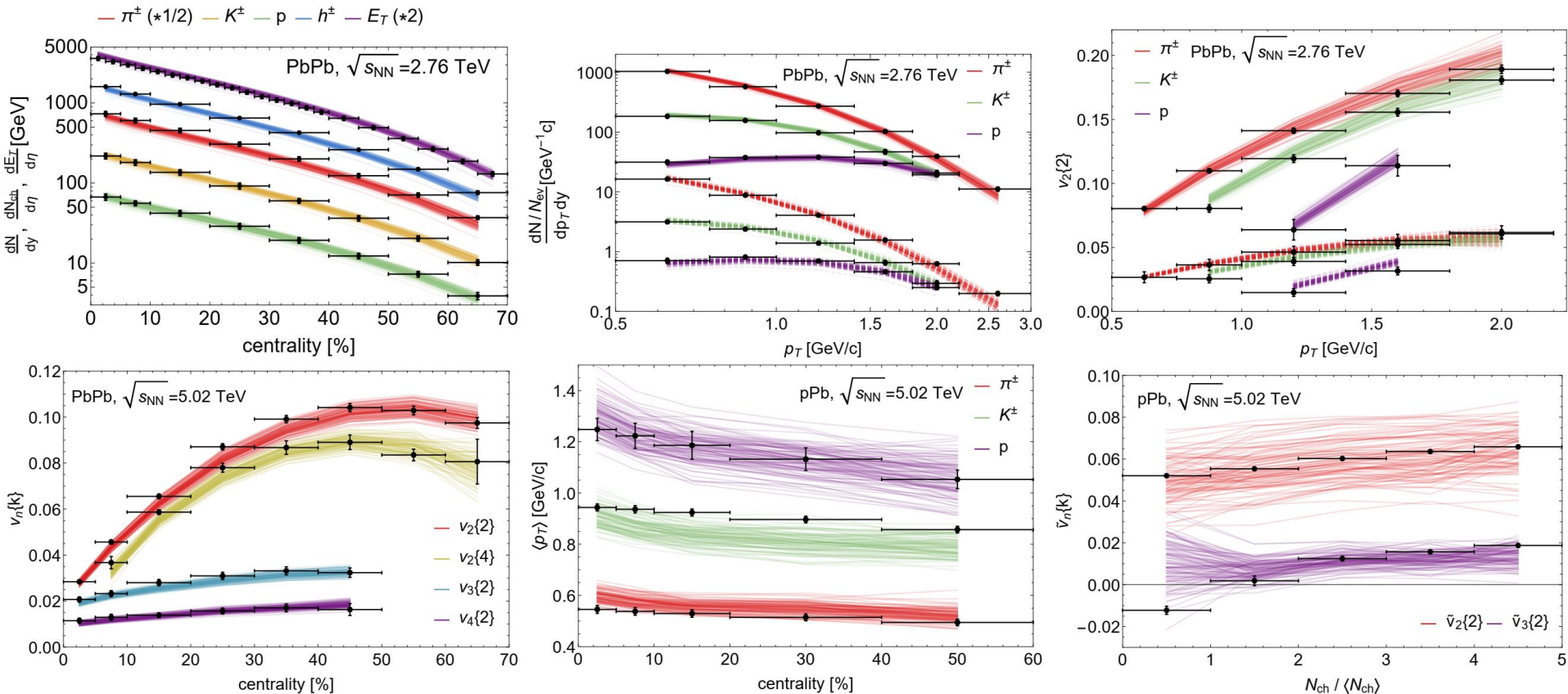


1000 design points for PbPb, 2000 for pPb. 6k hydro events for PbPb, 40k for pPb



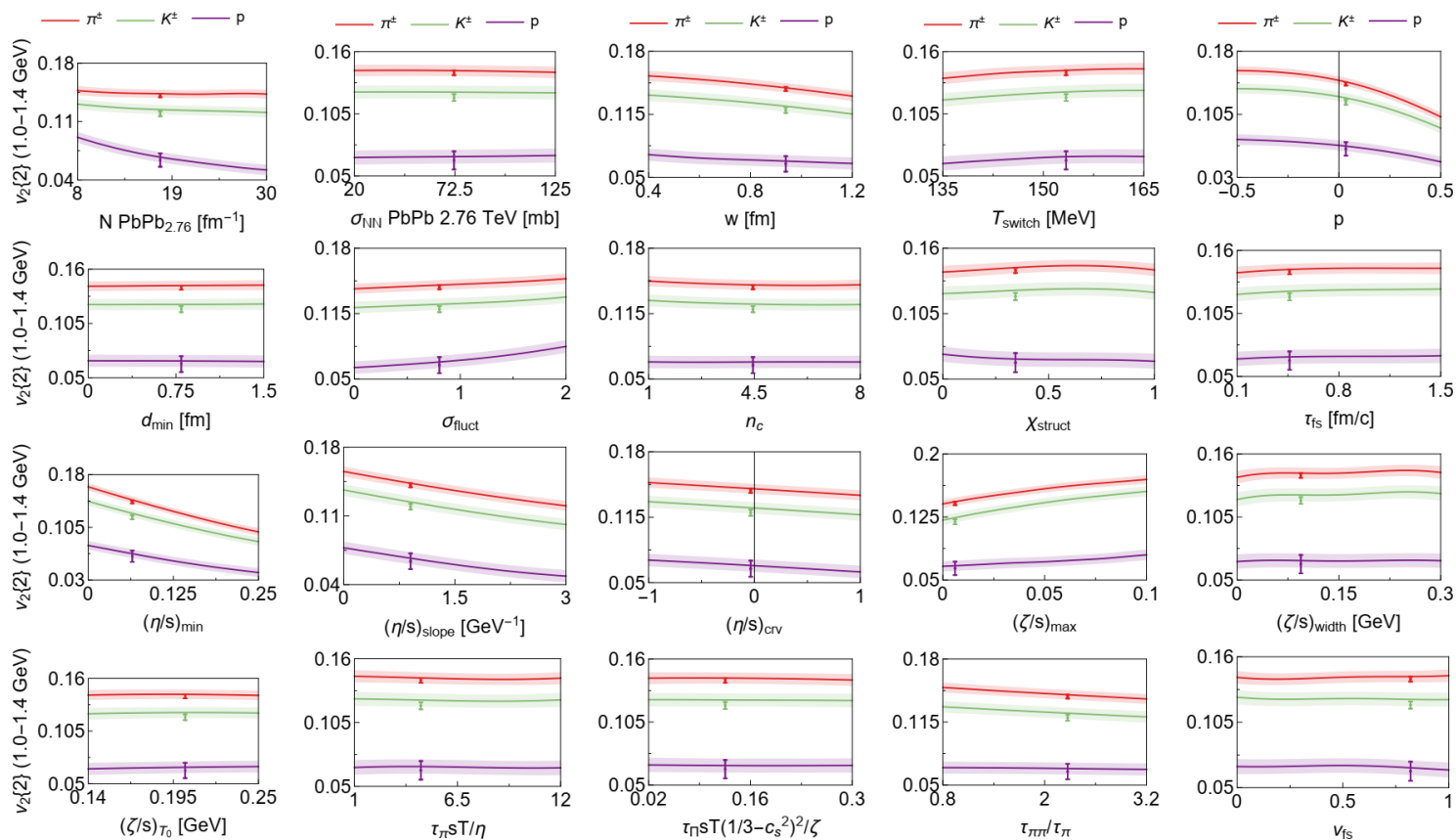
# Experimental observables: *a wealth of data*

1. Yields, spectra, identified  $v_n\{2\}$  versus  $p_T$ , pPb and PbPb (514 datapoints)
2. Note: points are highly correlated, without  $p_T$  dependence effectively only 6 to 8 principal components (PCs), for 20 parameters. With  $p_T$ -dependence roughly 12 PCs.



# Selected results: the emulator

## 1. $v_2$ in 1.0-1.4 GeV/c $p_T$ -bin, for optimal values, varying our parameters

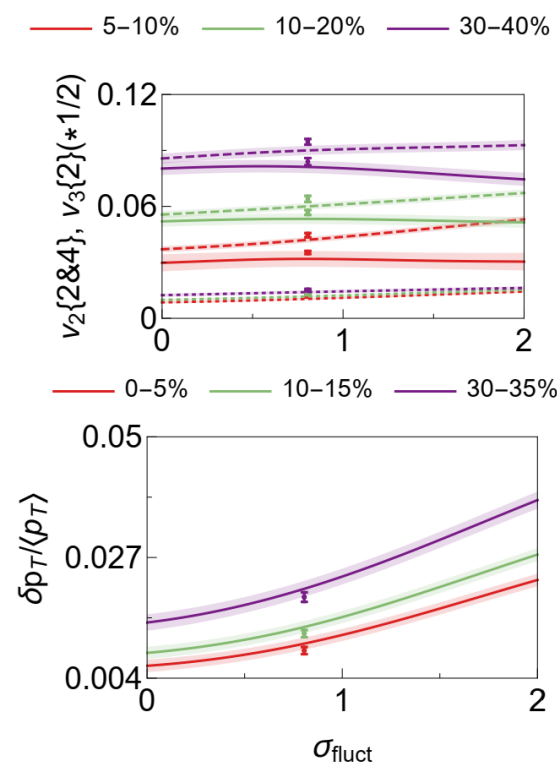
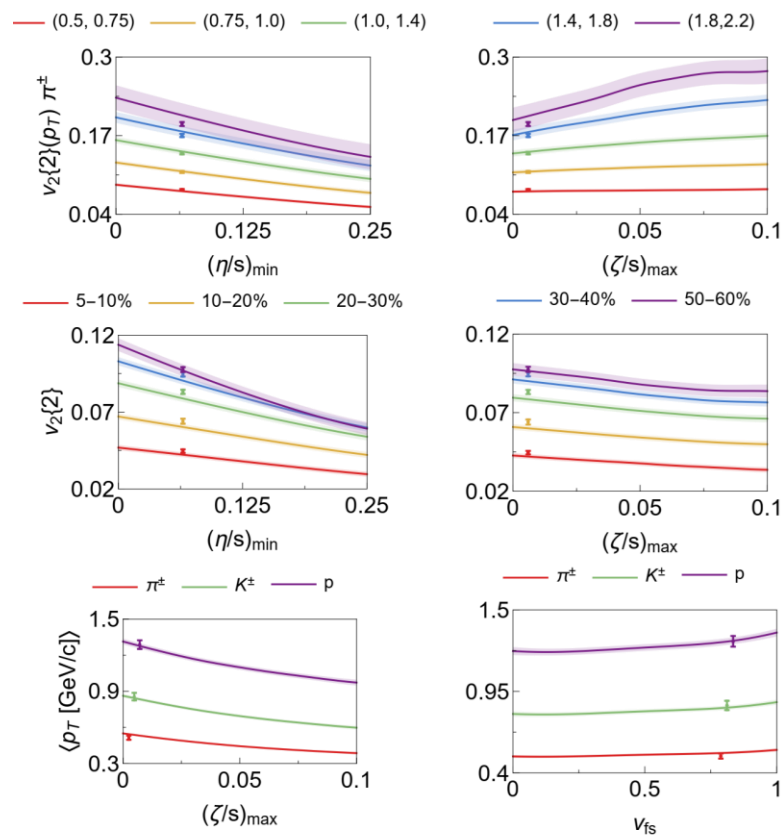


# The emulator: Viscosities and fluctuations

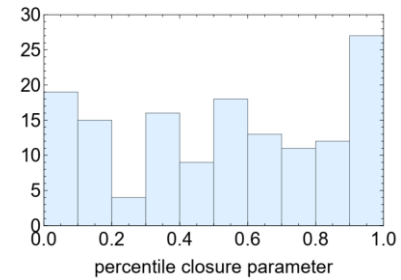
also note: emulator uncertainty (50-60%, or  $v_2\{4\}$ )

$v_2$  increases in every  $p_T$  bin, but decreases on average for  $\zeta$ .

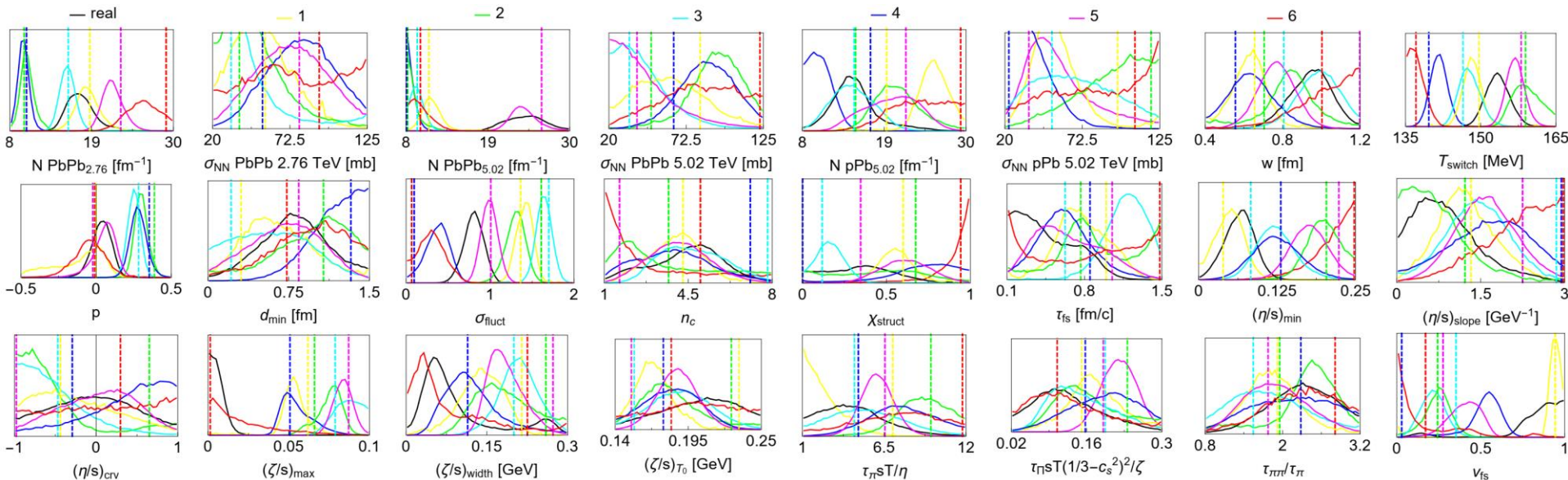
$v_2\{2\} - v_2\{4\}$  increases when increasing fluctuations



# Selected results: closure test

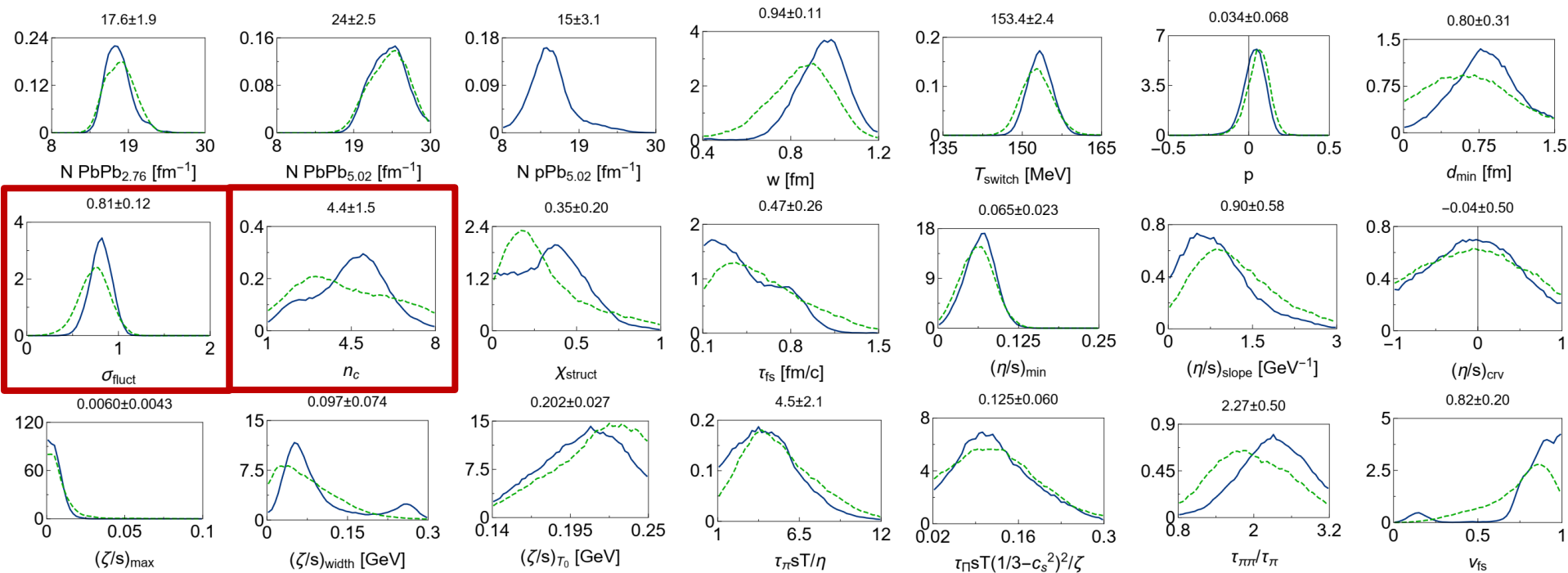


1. We chose six random parameter points (sometimes at edge of prior)
  - Try to extract parameters from model-generated `experimental' data
2. Verifies model + shows sensitivity data on parameter
  - Output indeed consistent with input
  - Sensitive to viscosities, less so for second order



# Posterior distributions

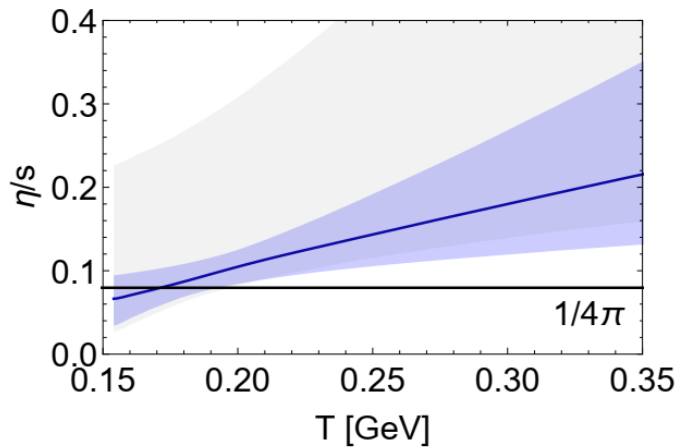
1. Dashed: without  $p$ Pb: indeed much flatter for e.g.  $n_c$
2. Somewhat surprising constraint on fluctuations? (first found at Duke)



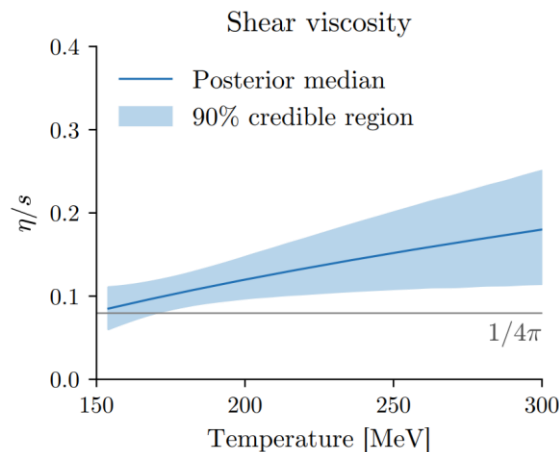
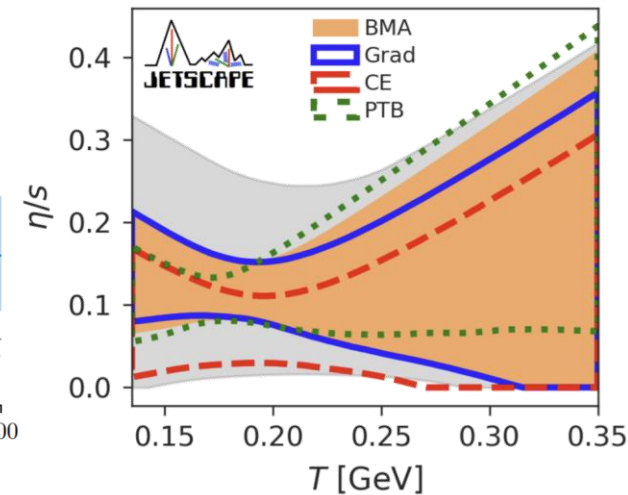
# Posterior distributions – shear viscosity

## 1. Shear viscosity consistent with previous work

- More data, but also enlarged model  $\rightarrow$  similar constraint on  $\eta/s$
- New JETSCAPE slightly broader band (larger priors, single PbPb energy but with RHIC)



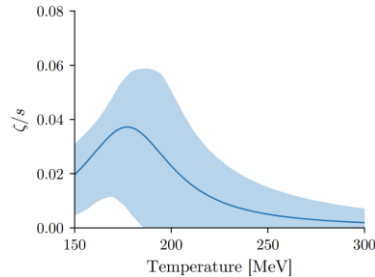
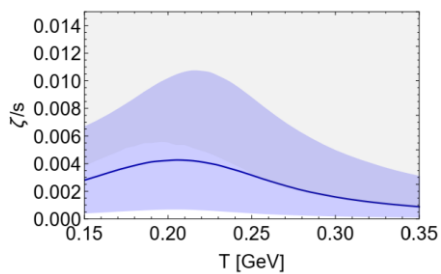
Current work (2020)

J. Bernhard, S. Moreland and S. Bass,  
Nature Physics (2019)

JETSCAPE (2020)

# Posterior distributions – bulk viscosity:

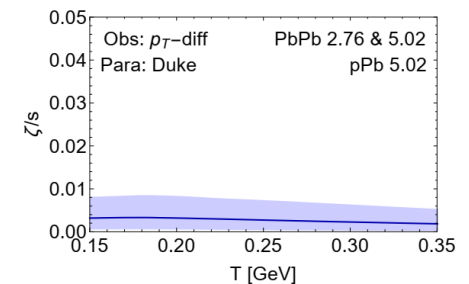
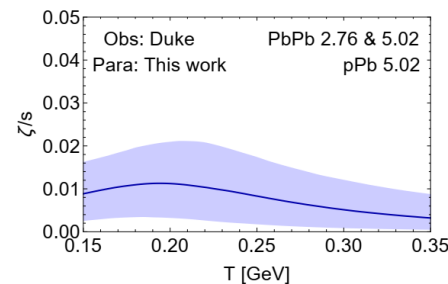
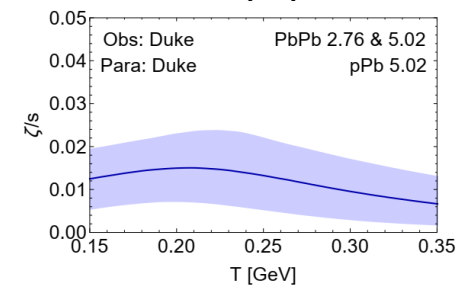
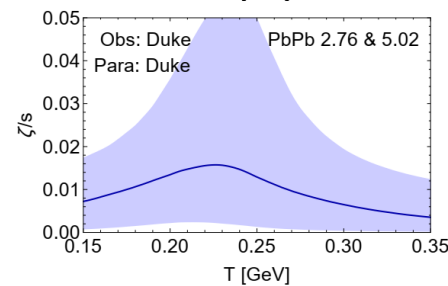
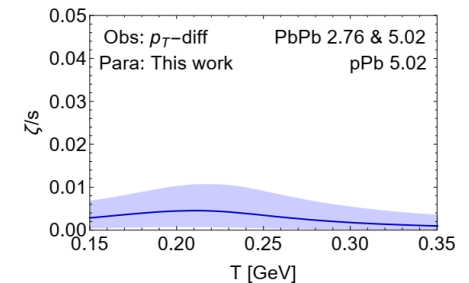
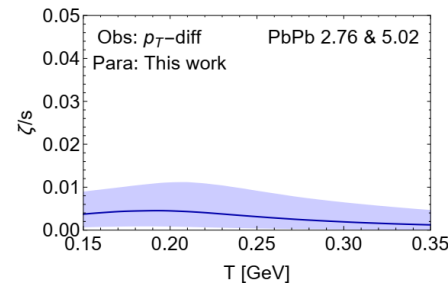
## Much smaller, even consistent with zero



J. Bernhard, S. Moreland and S. Bass,  
Nature Physics (2019)

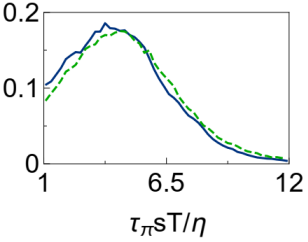
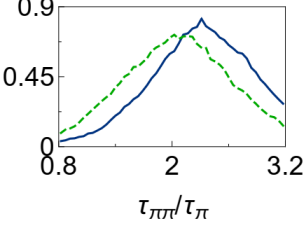
### Bulk viscosity, varied several aspects:

- More limited parameter set
  - All versus only 'Duke'
- Include or not include p-Pb collisions
- Include  $p_T$ -differential observables



# Posterior distributions – 2nd order transport

1.  $\tau_\pi$  and  $\tau_{\pi\pi}$  can be compared to strong and weak coupling values
  - Both consistent, AdS/CFT slightly favoured for  $\tau_{\pi\pi}$

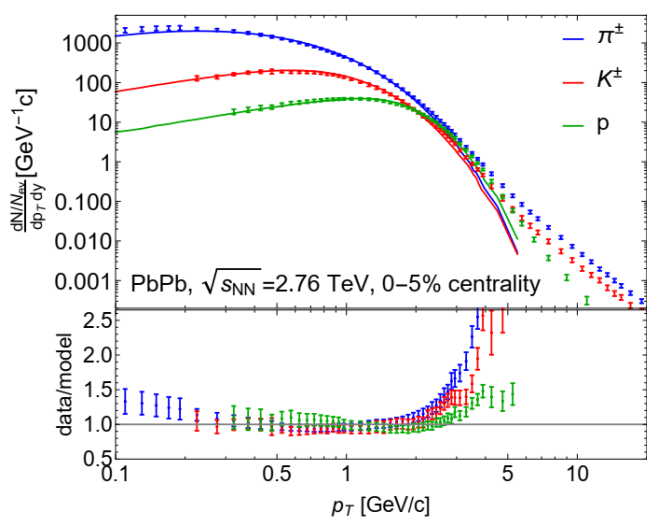
	this work	AdS/CFT	kinetic theory
$\frac{\tau_\pi sT}{\eta}$	$4.5 \pm 2.1$ 	$4 - \log(4) \approx 2.61$	5
$\frac{\tau_{\pi\pi}}{\tau_\pi}$	$2.27 \pm 0.50$ 	$\frac{88}{35(2 - \log 2)} \approx 1.92$	$\frac{10}{7} \approx 1.43$



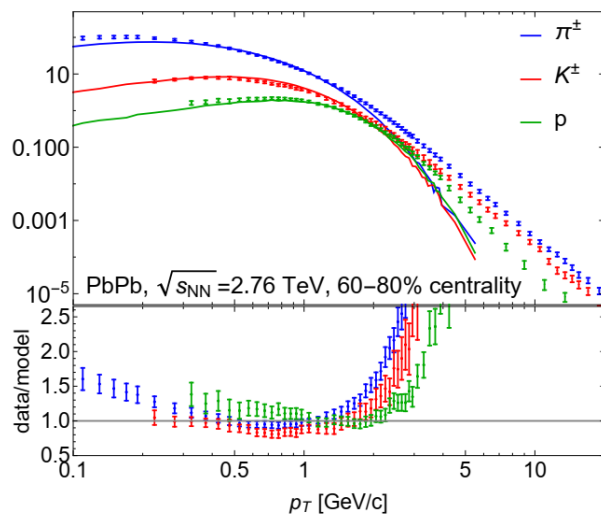
# MAP: maximum a posteriori: spectra

## 1. High statistics run at optimal parameters, compared with ALICE data

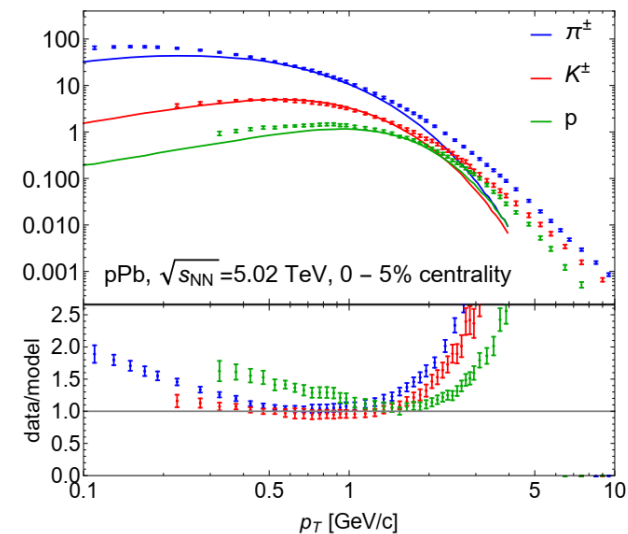
### Central PbPb



### Very peripheral PbPb

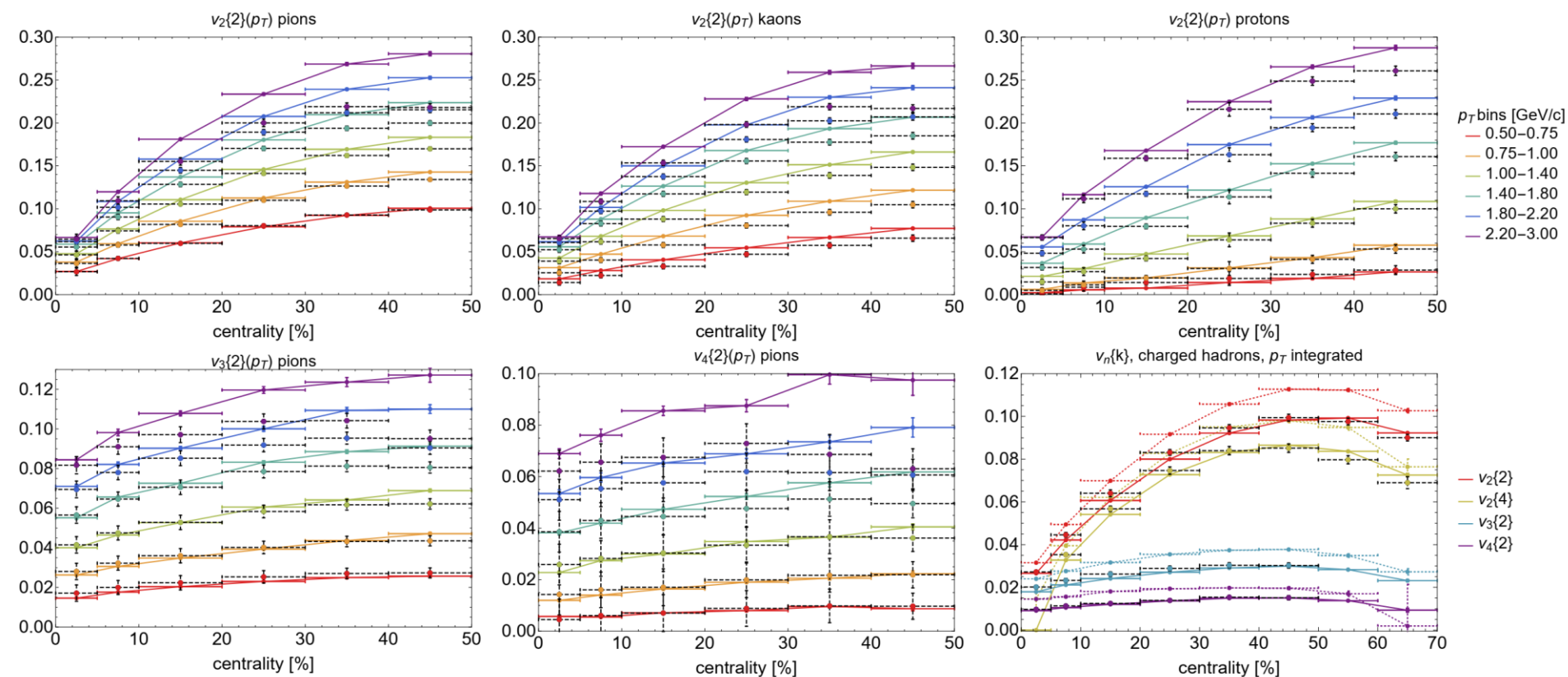


### Central pPb



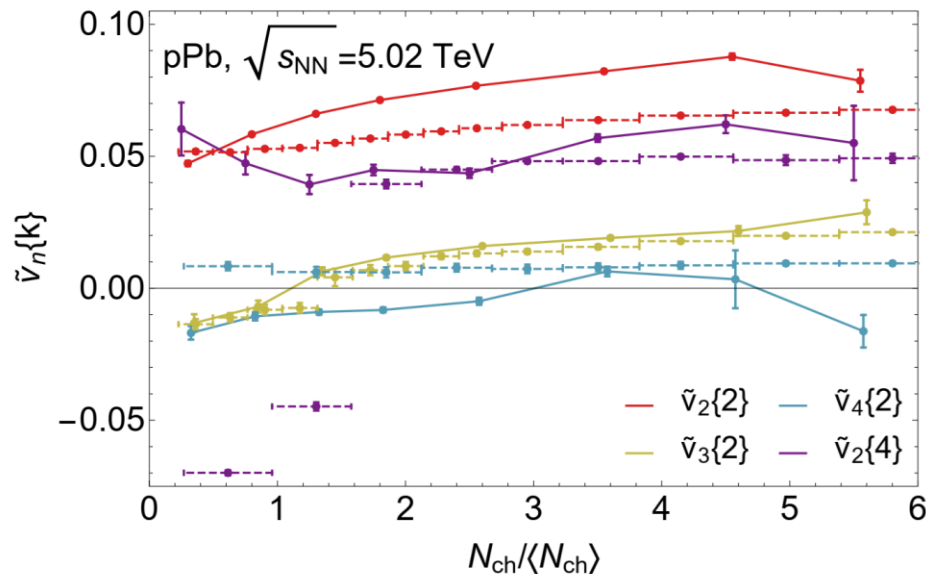
# MAP: PbPb anisotropic flow

## 1. Anisotropic flow matches well, except for a few high $p_T$ bins



# MAP: $p$ Pb anisotropic flow

1. Emulator and MCMC are less precise for  $p$ Pb: theory errors is statistical only
2. Shows potential to obtain imaginary  $v_n\{2\}$  (= negative  $\tilde{v}_n\{k\}$ ), in agreement with ATLAS low multiplicity result
3. Sheds new light on discussion of hydro versus sign of  $\langle\langle 2 \rangle\rangle_n$



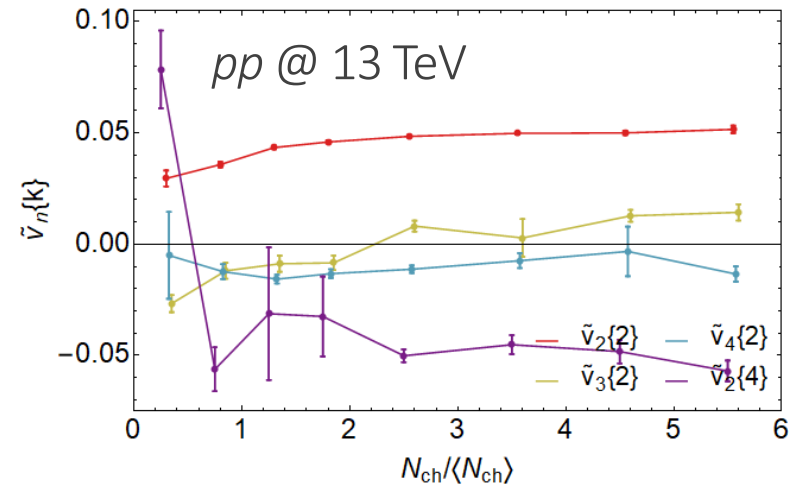
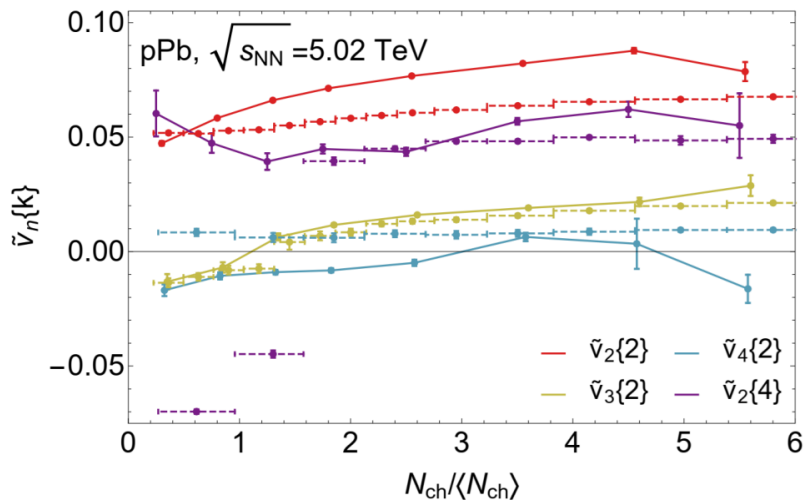
$$Q_n = \sum_{i=1}^M e^{in\phi_i}$$

$$\langle 2 \rangle_n = \frac{|Q_n|^2 - M}{M(M-1)}$$

$$v_n\{2\} = \sqrt{\langle\langle 2 \rangle\rangle_n}$$

# MAP: $pp$ anisotropic flow

## 1. Preliminary results for You; different sign for $v_2\{4\}^2$ (?)



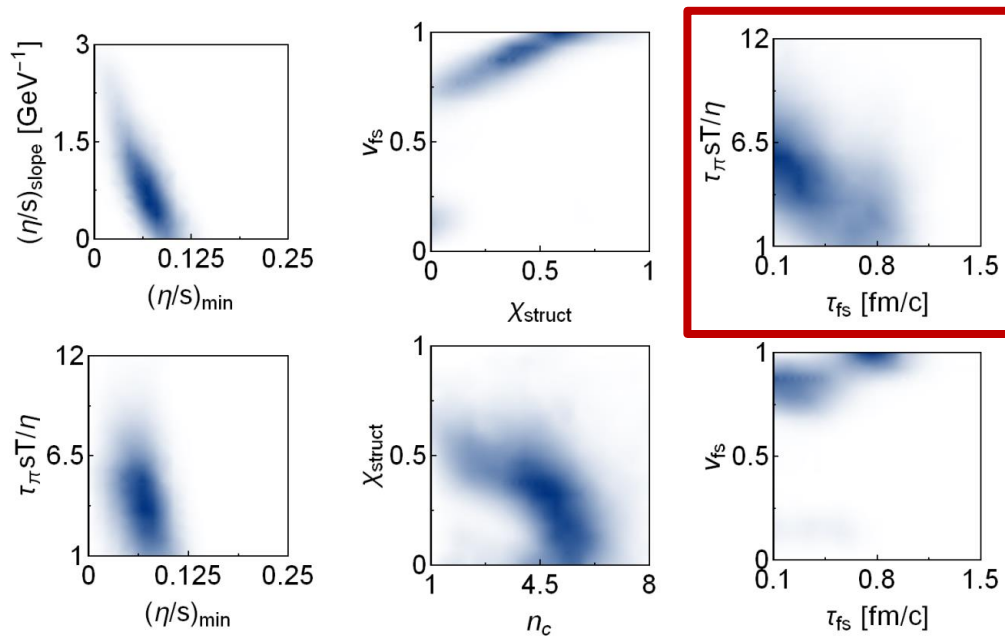
# Discussion

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1. A road to precision analysis of the quark-gluon plasma
  - Measuring transport and initial stage `beyond  $\eta/s$ ', revisiting bulk viscosity
  - Hints on constraints for second order transport
  
2. Encouraging results
  - $p_T$ -differential anisotropic flow sheds new light on global analyses
  - Interesting MAP results on flow in  $pPb$
  
3. Study is still limited:
  - Still significant uncertainties in initial stage and particlisation
  - No variation of uncertainties in SMASH
  - Data set still fairly small, should still include RHIC results

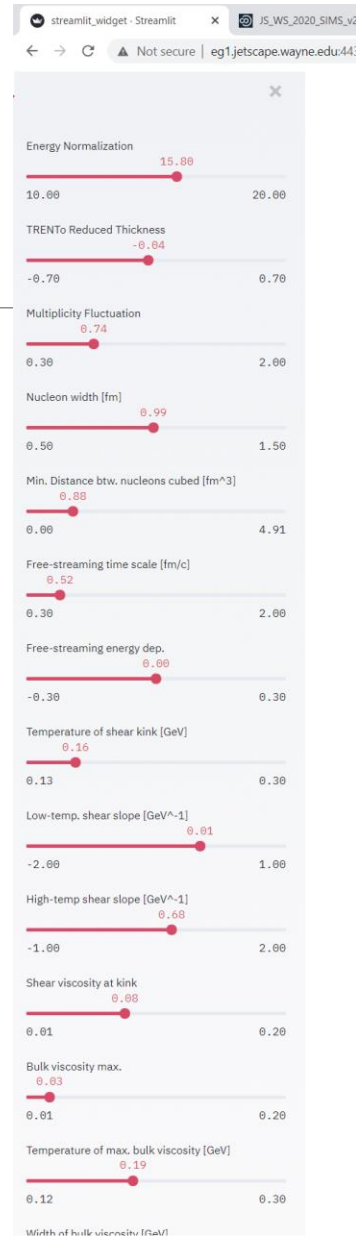
# Correlations among the parameters

1. Interesting correlation between free streaming time and  $\tau_\pi$



# Comparison with JETSCAPE

Results seem to be in relatively good agreement. Data is quite consistent without a sizeable bulk viscosity.



The experimentally measured observables by the [ALICE collaboration](#) are shown as black dots.

The last row displays the temperature dependence of the specific shear and bulk viscosities (red lines), as determined by different parameters on the left sidebar.

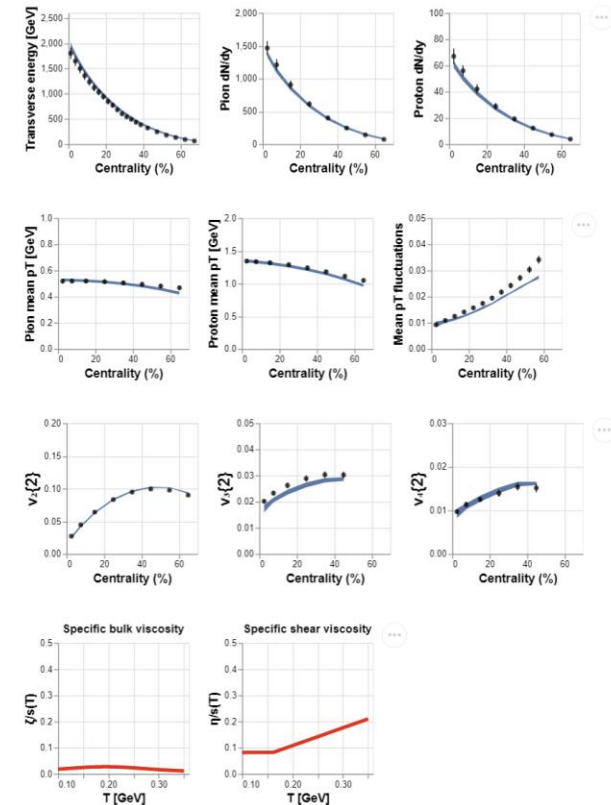
By default, these parameters are assigned the values that fit the experimental data *best* (maximize the likelihood).

An important modelling ingredient is the particization model used to convert hydrodynamic fields into individual hadrons. Three different viscous correction models can be selected by clicking the "Particization model" button below.

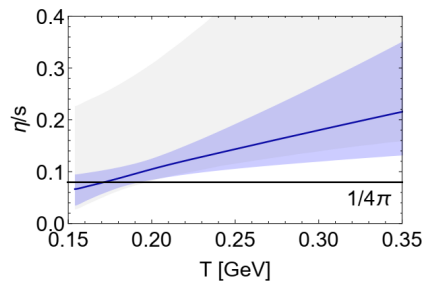
Particization model

Pratt-Torrieri-Bernhard

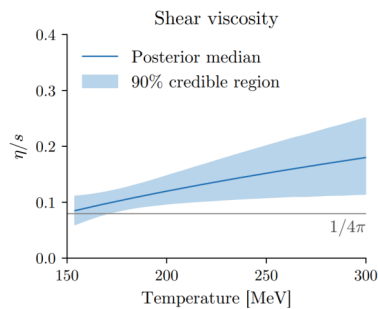
[Reset](#)



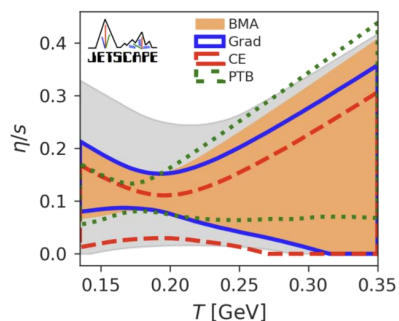
# Posterior distributions – shear viscosity



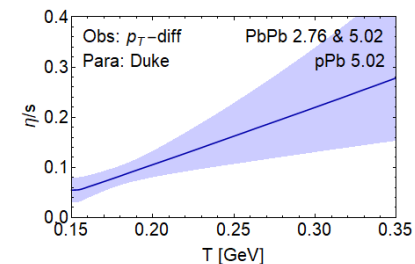
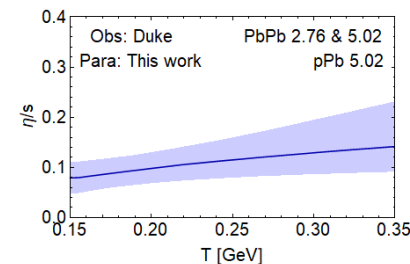
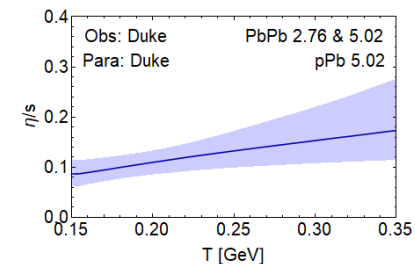
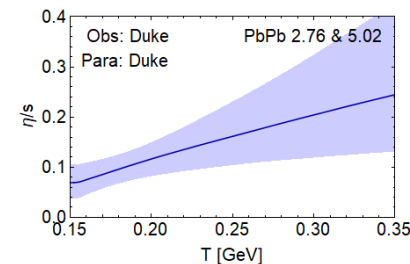
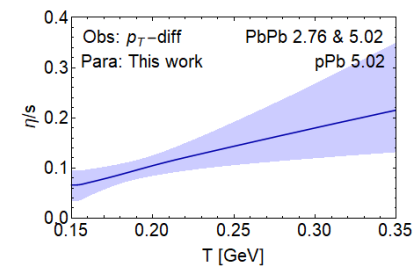
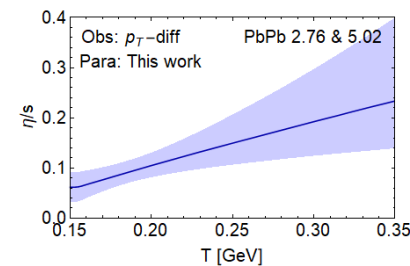
Current work (2020)



J. Bernhard, S. Moreland and S. Bass, Nature Physics (2019)



JETSCAPE (2020)





# Closure test: viscosities

1. Closure test works well for both viscosities
2. Most sensitive to low-T region

