Data-driven extraction of heavy quark diffusion in quark-gluon plasma

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Abstract Heavy quark production provides a unique probe of the quark-gluon plasma transport properties in heavy ion collisions. Experimental observables like the nuclear modification factor R_{AA} and elliptic anisotropy v_2 of heavy flavor mesons are sensitive to the heavy quark diffusion coefficient. There now exist an extensive set of such measurements, which allow a data-driven extraction of this coefficient. In this work, we make such an attempt within our recently developed heavy quark transport modeling framework (Langevin-transport with Gluon Radiation, LGR). A question of particular interest is the temperature dependence of the diffusion coefficient, for which we test a wide range of possibility and draw constraints by comparing relevant charm meson data with model results. We find that a relatively strong increase of diffusion coefficient from crossover temperature T_c toward high temperature is preferred by data. We also make predictions for Bottom meson observables for further experimental tests.

1 Introduction

At extremely high temperatures such as those available at the earliest moments of cosmic evolution, normal matter turns into a new form of deconfined nuclear matter known as a quark-gluon plasma (QGP). Such a state of matter once filled the early universe when the temperature was high enough. Today the QGP is recreated in laboratories by high energy nuclear collisions at the Relativistic Heavy Ion Collider (RHIC) and the Large Hadron Collider (LHC). A lot of measurements have been performed at RHIC and the LHC,

allowing the use of empirical data to extract key properties of the QGP, which are of fundamental interests. The transport properties (such as the shear and bulk viscosity, jet transport coefficient, etc) have been found to be particularly informative for unraveling the dynamical features of QGP, leading to its identification as the nearly perfect fluid [1–3].

Heavy quark production provides a unique probe of the quark-gluon plasma in heavy ion collisions [4–9]. Charm and bottom quarks are very hard to be thermally produced in QGP and are dominantly produced from the initial hard scatterings. These rare objects then propagate through the QGP fireball and encode the medium information during their dynamical evolution. Experimental observables like the nuclear modification factor R_{AA} and elliptic anisotropy v_2 of (for heavy flavor mesons as well as heavy flavor decay leptons) are sensitive to the heavy quark diffusion coefficient inside the QGP. There now exist an extensive set of such measurements, which allow a data-driven extraction/constraint of this coefficient. In this work, we make such an attempt within our recently developed heavy quark transport modeling framework, Langevin-transport with Gluon Radiation (LGR) [10].

A particularly interesting question about the QGP transport properties is their temperature dependence, especially how they change in the temperature region from transition temperature T_c to a few times T_c . This is the region accessible through RHIC and LHC collision experiments. It has been suggested that such temperature dependence could be highly nontrivial, especially close to T_c . For example, it was proposed long ago that the jet-medium interaction strength (quantified by e.g. normalized jet transport coefficient $\hat{q}/T^3$) may rapidly increase from high temperature down toward T_c and develop a near- T_c peak structure [11]. Such a scenario appears to be confirmed by many subsequent studies [12–

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[17]. Another important transport property, shear viscosity over entropy density ratio η/s , also seems to have a visible T -dependence with a considerable increase from T_c toward higher temperature [18]. Regarding the diffusion and drag coefficients relevant for heavy quark dynamics, there are also indications of nontrivial temperature dependence [19]. In this work we will focus on the diffusion coefficient and test a wide range of possibility for its temperature dependence. By comparing modeling results with experimental data of charm hadrons, we draw constraints on the behavior of this important transport property of QGP. Based on that, we further make predictions for bottom hadron observables.

The rest of this paper is structured as follows. In Sect. 2, we introduce the detailed setup of the LGR modeling framework and discuss the temperature dependence of diffusion constant. In Sect. 3, we systematically compare modeling results with data and extract optimal range of this transport coefficient based on global χ^2 analysis. Direct comparison of optimized model results with experimental observables as well as predictions for new measurements are presented in Sect. 4. Finally we summarize this study in Sect. 5.

2 Methodology

In this section, we present the details of our modeling framework. The heavy quark evolution is described by the following Langevin transport equation that incorporates gluon radiation [20]:

$$\begin{aligned} d\vec{x} &= \frac{\vec{p}}{E} dt \\ d\vec{p} &= (\vec{F}_D + \vec{F}_T + \vec{F}_G) dt \end{aligned} \quad (1)$$

where the deterministic drag force reads

$$\vec{F}_D = -\eta_D(\vec{p}, T) \cdot \vec{p}, \quad (2)$$

with $\eta_D(\vec{p}, T)$ being the drag coefficient. The two-point temporal correlation of the stochastic thermal force $\vec{F}_T$ is given by [21]

$$\begin{aligned} \langle \vec{F}_T^i(t) \cdot \vec{F}_T^j(t') \rangle &= \left[\kappa_{\parallel}(\vec{p}, T) P_{\parallel}^{ij} + \kappa_{\perp}(\vec{p}, T) P_{\perp}^{ij} \right] \\ &\delta(t - t'), \end{aligned} \quad (3)$$

indicating the uncorrelated random momentum kicks from the medium partons. $P_{\parallel}^{ij} = p^i p^j / p^2$ and $P_{\perp}^{ij} = \delta^{ij} - p^i p^j / p^2$ are the projection operators for momentum components parallel and perpendicular to the direction of the HQ motion, respectively. Adopting the post-point discretization scheme of the stochastic integral, the relation between the

drag coefficient (η_D), the longitudinal ($\kappa_{\parallel}$) and transverse momentum diffusion coefficients ($\kappa_{\perp}$) can be written as:

$$\eta_D(\vec{p}, T) = \frac{\kappa_{\parallel}(\vec{p}, T)}{2TE} - \frac{1}{p^2} \left(\sqrt{\kappa_{\perp}(\vec{p}, T)} - \sqrt{\kappa_{\parallel}(\vec{p}, T)} \right)^2. \quad (4)$$

Detailed derivation of the above relation can be found in the Appendix.

The third term on the right hand side of Eq. (1),

$$\vec{F}_G = - \sum_{j=1}^{N_G} \frac{d\vec{p}_G^j}{dt}, \quad (5)$$

denotes the total recoil force induced by the emitted gluons. The emission rate of gluons is estimated with the following Higher-Twist model formula [22]:

$$\frac{dN_G}{dz dk_{\perp}^2 dt} = \frac{2\alpha_s C_A P(z) \hat{q}_q}{\pi k_{\perp}^4} \left[\frac{k_{\perp}^2}{k_{\perp}^2 + (zm_Q)^2} \right]^4 \sin^2 \left(\frac{t - t_0}{2\tau_f} \right). \quad (6)$$

In the above, z denotes the fraction of energy carried away by the emitted gluon, and $P(z)$ represents the quark splitting function; $\alpha_s(k_{\perp})$ is the strong coupling constant of QCD at leading order approximation; $\tau_f = 2z(1-z)E/[k_{\perp}^2 + (zm_Q)^2]$ is the gluon formation time; t_0 is the initial time for gluon radiation and $(t - t_0)$ is the time interval between two inelastic scatterings; $\hat{q}_q$ is the quark jet transport coefficient. The recoil force becomes important when the heavy quark is in the high energy regime $E \gg m_Q$, where HQ velocity $v_Q = \sqrt{1 - (m_Q/E)^2} \sim 1$ and radiative energy loss becomes significant. In this regime, the $\hat{q}_q$ in the above can be approximated by

$$\hat{q}_q = \frac{2\kappa_{\perp}}{v_Q} \approx 2\kappa_{\perp}. \quad (7)$$

As one can see at this point, the key parameters controlling all the forces in Eq. (1) are the momentum diffusion coefficients ($\kappa_{\parallel}$ and $\kappa_{\perp}$). It is customary in heavy quark phenomenological modelings [20, 20, 23–26] to further connect these parameters to the spatial diffusion constant under reasonable approximations. In the low momentum regime where diffusion dynamics is most important, one could assume approximate isotropy for the momentum diffusion coefficients, i.e. $\kappa_{\parallel} = \kappa_{\perp} \equiv \kappa$. Thus the Eq. (4) is further reduced to

$$\eta_D = \frac{\kappa}{2TE}, \quad (8)$$

i.e. the so-called dissipation–fluctuation relation in the non-relativistic approximation. The connection to the (scaled) spatial diffusion constant, strictly speaking, is valid at zero-momentum limit [27], $2\pi T D_s = 2\pi T^2/[m_Q \cdot \eta_D(|\vec{p}| \rightarrow 0, T)]$. Such relation has been phenomenologically generalized to finite momentum and widely used in heavy quark modelings [20, 25, 26], allowing the expressions of both the drag and the momentum diffusion coefficients (Eq. 8) in terms of spacial diffusion constant:

$$\begin{aligned}\eta_D(\vec{p}, T) &= \frac{1}{2\pi T D_s} \cdot \frac{2\pi T^2}{E} \\ \kappa(T) &= \frac{1}{2\pi T D_s} \cdot 4\pi T^3.\end{aligned}\quad (9)$$

We can see that now there is only one key transport parameter, the spatial diffusion constant ($2\pi T D_s$) that quantifies all relevant components: the drag force (Eq. 2), thermal random force (Eq. 3) and the recoil force (Eqs. 5, 6) in the Langevin approach (Eq. 1). Thus, the dynamical interactions between the heavy quarks and the QGP medium are conveniently encoded into $2\pi T D_s$. We note that, in a naive way, a small/large spatial diffusion corresponds to a short/long mean-free path and thus strong/weak HQ-medium coupling strength.

Indeed, many past studies have demonstrated sensitivity of experimental observables (such as R_{AA} and v_2 of heavy flavor mesons) to this key parameter. It appears that, very similar to the situation of jet energy loss, the R_{AA} is mainly controlled by the HQ-medium interaction on average while the v_2 is strongly influenced by the temperature dependence of the diffusion constant [24, 28–30]. In this study, we aim to investigate such temperature dependence. Let us focus on the temperature range $(1 \sim 3)T_c$ and frame the question in a model-independent way. Consider D_s as an arbitrary function of temperature T in this range, it can always be expressed via a series of polynomials (as long as one can include enough terms): $D_s = d_0 + d_1 \cdot T + d_2 \cdot T^2 + \dots$ without the need of assuming any theoretically-motivated temperature dependence. In principle, with sufficient experimental data and adequate computing power, one could exploit data-driven extraction of all these coefficients term by term. As a first step, we take only the first two polynomials, i.e. a constant plus a linear dependence, with the following ansatz (where we use T and T_c to make dimensionless combinations):

$$2\pi T D_s \approx \alpha \left(\frac{T}{T_c} \right) + \beta. \quad (10)$$

The two dimensionless parameters in Eq. (10), the slope α and the intercept β , will be explored in a very wide range without presuming any reasonable value. Our approach is to compute observables for any given (α, β) and let the large set

of experimental data decide what would be preferred via χ^2 analysis. We will then compare so-extracted spatial diffusion constant with various other results [31].

Finally we describe a few detailed aspects of the numerical implementation. When solving the Langevin transport equation (Eq. 1), we need the space-time evolution of the medium temperature and the fireball velocity field. It is simulated in terms of a 3 + 1 dimensional relativistic viscous hydrodynamics based on the HLLE algorithm (—see details in [32]). Concerning the hadronization of HQ, a “dual” approach, including both fragmentation and heavy-light coalescence mechanisms, is utilized when the local temperature is below $T_c = 165$ GeV. Following our previous work [26, 33], the Braaten fragmentation functions [34] is employed with the parameter $r = 0.1$ [35]. Within the instantaneous coalescence approach, the momentum distributions of heavy-flavor mesons (M) composed of a heavy quark (Q) and a light anti-quark ($\bar{q}$) reads

$$\begin{aligned}\frac{dN_M}{d^3\vec{p}_M} &= g_M \int d^6\xi_Q d^6\xi_{\bar{q}} f_Q f_{\bar{q}} \\ &\times \sum_{n=0}^1 \bar{W}_M^{(n)}(\vec{y}_M, \vec{k}_M) \delta^{(3)}\left(\sum \vec{p}\right)\end{aligned}\quad (11)$$

where, g_M is the spin-color degeneracy factor; $d^6\xi_i = d^3\vec{x}_i d^3\vec{p}_i$ is the phase-space volume for $i = Q, \bar{q}$; $f_i(\vec{x}_i, \vec{p}_i)$ denotes the phase-space distributions; $\bar{W}_M^{(n)}$ represents the coalescence probability for $Q\bar{q}$ combination to form the heavy-flavor meson in the n th excited state, and it is defined as the overlap integral of the Wigner functions for the meson and $Q\bar{q}$ pair [36]

$$\bar{W}_M^{(n)}(\vec{y}_M, \vec{k}_M) = \frac{\lambda^n}{n!} e^{-\lambda}, \quad \lambda = \frac{1}{2} \left(\frac{\vec{y}_M^2}{\sigma_M^2} + \sigma_M^2 \vec{k}_M^2 \right). \quad (12)$$

where $\vec{y}_M = (\vec{x}_Q - \vec{x}_{\bar{q}})$ and $\vec{k}_M = (m_{\bar{q}}\vec{p}_Q - m_Q\vec{p}_{\bar{q}})/(m_Q + m_{\bar{q}})$ are the relative coordinate and the relative momentum, respectively, in the center-of-mass frame of $Q\bar{q}$ pair. Note that the parton Wigner functions are defined through the Gaussian wave-function, while for heavy-flavor meson, it is quantified by a harmonic oscillator one [37]. The width parameter σ_M is expressed as [26]

$$\sigma_M^2 = K \frac{(e_Q + e_{\bar{q}})(m_Q + m_{\bar{q}})^2}{e_Q m_{\bar{q}}^2 + e_{\bar{q}} m_Q^2} \langle r_M^2 \rangle \quad (13)$$

where, $K = 2/3$ ($K = 2/5$) for the ground state $n = 0$ (1st excited state $n = 1$); $\langle r_M^2 \rangle$ is the mean-square charge radius of a given species of D-meson, which is predicted by the light-front quark model [38]; e_i and m_i are the charge and mass of a given parton, respectively. See Ref. [26] for more details.

Fig. 1 Comparison of $\chi^2/d.o.f$ based on the experimental data of **a** R_{AA} and **b** v_2 . The model predictions are calculated by using various combinations of parameter α and β (Eq. 10), which are represented as

α (y-axis) and $2\pi T D_s(T)$ obtained at $T = 2T_c$ (x-axis), respectively. **c** Comparison of $\chi^2/d.o.f$ for various models. See the legend and text for details

3 Constraining diffusion constant

In this section, we focus on constraining diffusion constant using experimental data. With any given set of parameters (α, β) in Eq. (10), we can calculate the corresponding final observable y for the desired species of D-meson. Then, a χ^2 analysis can be performed by comparing the model predictions with experimental data

$$\chi^2 = \sum_{i=1}^N \left(\frac{y_i^{\text{Data}} - y_i^{\text{Model}}}{\sigma_i} \right)^2. \quad (14)$$

In the above σ_i is the total uncertainty in data points, including the statistic and systematic components which are added in quadrature. $n = N - 1$ denotes the degree of freedom ($d.o.f$) when there are N data points used in the comparison. In this study, we use an extensive set of LHC data: D^0 , D^+ , D^{*+} and D_s^+ collected at mid-rapidity ($|y| < 0.5$) in the most central (0–10%) and semi-central (30–50%) Pb–Pb collisions at $\sqrt{s_{NN}} = 2.76$ TeV [39, 40] and $\sqrt{s_{NN}} = 5.02$ TeV [41], as well as the v_2 data in semi-central (30–50%) collisions [42, 43].

We scan a wide range of values for (α, β) in Eq. (10): $0 \leq \alpha \leq 9$ and $-8.5 \leq \beta \leq 4$. We note this covers a significantly broader span than existing studies and than commonly conceived reasonable values of $(2\pi T) D_s$. It would be highly unlikely, if not impossible, for the actual QGP diffusion constant to fall outside this range. A total of 25 different combinations were computed and compared with experimental data, and we summarize these in Table 1. The χ^2 values were computed separately for R_{AA} and v_2 as well as for all data combined. To better visualize the results, we also show them in Fig. 1, with panel (a) for R_{AA} analysis and panel (b) for v_2 analysis. In both panels, the y-axis labels the slope α and x-axis labels the $2\pi T D_s$ value at $T = 2T_c$: basically y-axis quantifies a model's temperature dependence while x-axis calibrates the average diffusion in that model. The different

points (filled circles) represent the different combinations of parameters (α, β) in Table 1, with the number near each point to display the relevant $\chi^2/d.o.f$ for that model. A number of observations can be drawn from the comprehensive model-data comparison. For the R_{AA} , several models achieve $\chi^2/d.o.f \sim 1$ with widespread values of slope parameter. This suggests that R_{AA} appears to be more sensitive to the average diffusion constant while insensitive to the temperature dependence. For the v_2 , it clearly shows a stronger sensitivity to the temperature dependence. There also exist several models with $\chi^2/d.o.f \sim 1$ and it appears that a small value of $(2\pi T) D_s$ near T_c is crucial for a better description of v_2 data. Taken all together, we are able to identify two particular models that outperform others in describing both R_{AA} and v_2 data simultaneously with $\chi^2/d.o.f \sim 1$. These two will be the parameter-optimized models from the LGR framework: the LGR (Model-A) with $(\alpha, \beta) = (3, -1)$ and the LGR (Model-B) with $(\alpha, \beta) = (6.5, -5.5)$. While both models give similarly nice good description of R_{AA} , the Model-B has a much stronger temperature dependence and gives a better description of v_2 .

Let us make a comparison with various existing modeling frameworks, e.g. TAMU [24], PHSD [28], LTB [44], POWLANG [45], BAMPs (elastic) [46], BAMPs (elastic+radiative) [46] and CUJET3 [47, 48]. The published results from these models for relevant observables are taken from pertinent references and used to evaluate the corresponding χ^2 for each model. The analysis results $\chi^2/d.o.f(R_{AA})$ and $\chi^2/d.o.f(v_2)$ are then shown and compared in the panel (c) of Fig. 1. One can see that to describe simultaneously both R_{AA} and v_2 data is challenging in general. The LGR Model-A and Model-B, featuring a moderate to strong temperature dependence and a small diffusion constant very close to T_c , demonstrate a successful description of current measurements.

Finally in Fig. 2 we present the spacial diffusion constant $2\pi T D_s$ of charm quark from various phenomenological extractions and theoretical calculations. Very close to

Table 1 Summary of the adjustable parameters in Eq. (10), together with the relevant $\chi^2/d.o.f$ obtained for R_{AA} and v_2

Model ID	α (Slope)	β (Intercept)	$\chi^2/d.o.f$ (R_{AA})	$\chi^2/d.o.f$ (v_2)	Total
1	1.00	1.00	2.61	0.85	2.37
2	2.00	0.00	1.58	0.87	1.49
3 (A)	3.00	− 1.00	1.09	1.26	1.11
4	4.00	− 2.00	1.03	1.86	1.14
5	0.00	4.00	1.03	2.68	1.26
6	1.00	3.00	1.55	2.64	1.70
7	2.00	2.00	2.58	3.17	2.66
8	3.00	1.00	4.45	4.06	4.40
9	4.00	0.00	6.10	3.76	5.78
10	0.50	0.50	7.61	1.17	6.73
11	1.50	− 0.50	5.77	1.04	5.12
12	2.50	− 1.50	3.95	0.70	3.51
13	3.50	− 2.50	2.68	0.58	2.39
14	4.50	− 3.50	1.84	0.90	1.71
15	5.50	− 4.50	1.44	0.53	1.32
16 (B)	6.50	− 5.50	1.15	0.77	1.10
17	7.50	− 6.50	1.27	1.41	1.29
18	2.00	− 1.50	7.69	1.25	6.81
19	3.00	− 2.50	5.95	1.05	5.28
20	4.00	− 3.50	4.75	0.89	4.22
21	5.00	− 4.50	3.46	0.68	3.08
22	6.00	− 5.50	2.61	0.60	2.34
23	7.00	− 6.50	1.93	0.57	1.74
24	8.00	− 7.50	1.52	0.76	1.42
25	9.00	− 8.50	1.35	0.66	1.26

Fig. 2 Spatial diffusion constant $2\pi T D_s$ of charm quark from various calculations, including: the LGR Model-A and Model-B, the optimized parameters, lattice QCD calculations (pink circle [49], red triangle [50] and blue square [51]), CUJET3 (red region [52]), a Bayesian analysis in 95% CL from LIDO (shadowed gray band [53]) and a LO calculation with a Boltzmann dynamics (long dashed blue curve [54]). The result for D-meson (dot dashed green curve [55]) in the hadronic phase is also shown for comparison

T_c , the results from both LGR Model-A (solid black curve) and Model-B (dashed orange curve) are compatible with the LQCD calculations within their significant uncertainties

(pink circle [49], red triangle [50] and blue square [51]) as well as consistent with other models [54,56,57]. Toward the higher temperature end, the region spanned by our Model-A and Model-B compare well with the band from the Bayesian analysis based on the Duke model (gray region [53]). Combining various information together, we observe that: (1) a small value $2\pi T D_s \simeq (2 \sim 4)$ appears to be much preferred in the vicinity of T_c ; (2) a relatively strong increase of its value toward higher temperature is favored, albeit still with large uncertainty for $T \gtrsim 2T_c$.

4 LGR results for observables

In this section, we present the results for various observables to be compared with experimental data. Specifically we use the optimized LGR Model-B based on analysis from the previous section.

Figure 3 shows the R_{AA} of (a) D^0 , (b) D^+ , (c) D^{*+} and (d) D_s^+ in the most central (0–10%) Pb–Pb collisions at $\sqrt{s_{NN}} = 2.76$ TeV, respectively. The calculations are done with FONLL initial charm quark spectra and EPS09

Fig. 3 Comparison between experimental data (red box [39,40]) and LGR Model-B calculations (solid black curve with green uncertainty band) for the nuclear modification factor R_{AA} of **a** D^0 , **b** D^+ , **c** D^{*+} and **d** D_s^+ at mid-rapidity ($|y| < 0.5$) in the (0–10%) centrality Pb–Pb collisions at $\sqrt{s_{NN}} = 2.76$ TeV

Fig. 4 Comparison between experimental data (red box [41]) and LGR Model-B calculations (solid black curve with green uncertainty band) for the nuclear modification factor R_{AA} of **a** D^0 , **b** D^+ , **c** D^{*+} and **d** D_s^+ at mid-rapidity ($|y| < 0.5$) in the (0–10%) centrality Pb–Pb collisions at $\sqrt{s_{NN}} = 5.02$ TeV

NLO parametrization for the nPDF in Pb [26], and the green band reflects the theoretical uncertainties coming from these inputs. It can be seen that the model calculations provide a very good description of the measured p_T -dependent R_{AA} data for various charm mesons. The same conclusion can be drawn for the comparison in Pb–Pb collisions at $\sqrt{s_{NN}} = 5.02$ TeV, as shown in Fig. 4.

Figure 5 presents the elliptic flow coefficient v_2 of non-strange D-meson (averaged D^0 , D^+ , and D^{*+}) in the 30–50% centrality Pb–Pb collisions at (a) $\sqrt{s_{NN}} = 2.76$ TeV and (b) $\sqrt{s_{NN}} = 5.02$ TeV. Within the uncertainties of the experimental data, our model calculations describe well the

Fig. 5 Comparison between experimental data (red [42], black [43] and blue boxes [58]) and LGR Model-B calculations (solid black curve with green uncertainty band) for the elliptic flow v_2 of non-strange D-meson at mid-rapidity ($|y| < 0.5$) in the 30–50% centrality Pb–Pb collisions at **a** $\sqrt{s_{NN}} = 2.76$ TeV and **b** $\sqrt{s_{NN}} = 5.02$ TeV

anisotropy of the transverse momentum distribution of the non-strange D-meson. The sizable v_2 of these charm mesons, in particular at intermediate $p_T \sim 3$ to 5 GeV, suggests that charm quarks actively participate in the collective expansion of the fireball.

Given that our model has provided a very good description of charm meson data, it is tempting to further test it with bottom meson measurements. Here we present LGR Model-B results for the strange and non-strange bottom mesons. To do that, one would need the relevant transport coefficient for bottom quarks. It has been suggested [45,54,61] that the ratio of bottom quark spatial diffusion constant to that for charm quark exhibits a weak T -dependence and varies within ~ 0.8 to 0.9 in the range $T_c < T < 4T_c$. We therefore use a constant factor 0.85 to give a temperature dependent spatial diffusion constant $2\pi T D_s(\text{bottom}) = 0.85 \times 2\pi T D_s(\text{charm})$ for calculating the nuclear modification factor of open-bottom hadrons. Figure 6 shows the obtained results in the 30–50% centrality Pb–Pb collisions at $\sqrt{s_{NN}} = 5.02$ TeV. It is found that $R_{AA}(B_s^0)$ is significant larger than $R_{AA}(B^+)$, in particular at $p_T \sim 4$ to 6 GeV. This difference decreases toward high p_T . Similar to previous results for the open-charm systems [33], the enhancement behavior is mainly induced by

Fig. 6 **a** Comparison of $R_{AA}(B^+)$ (long dashed blue curve) and $R_{AA}(B_s^0)$ (dashed pink curve) in semi-central (30–50%) Pb–Pb collisions at $\sqrt{s_{NN}} = 5.02$ TeV. The experimental data for $R_{AA}(B^+)$ (green circle point [59]) and $R_{AA}(B_s^0)$ (black triangle point [60]) are collected from the minimum-bias events (0–100%). **b** R_{AA} ratio between $R_{AA}(B_s^0)$ and $R_{AA}(B^+)$

the heavy-light coalescence effect, which is more pronounced for the $B_s^0(\bar{b}s)$ than for the $B^+(\bar{b}u)$. The observation is consistent with the B-meson measurements (0–100%) reported by the CMS Collaboration [59,60].

5 Summary

In summary we have used a recently developed heavy quark transport modeling framework (Langevin-transport with Gluon Radiation, LGR) to study the heavy flavor spatial diffusion constant in the quark-gluon plasma in a data-driven approach. In particular we have examined the temperature dependence of this transport coefficient by systematically scanning a wide range of possibilities. Our global χ^2 analysis using extensive set of LHC data on charm meson R_{AA} and v_2 has allowed us to constrain the preferred range of this parameter. It is found that R_{AA} is more sensitive to the average value in the relevant temperature region while v_2 is more sensitive

to the temperature dependence. Taken together, our analysis suggests that a small value $2\pi T D_s \simeq (2 \sim 4)$ appears to be much preferred in the vicinity of T_c while a relatively strong increase of its value toward higher temperature is favored. The extracted temperature-dependent $2\pi T D_s$ curve is shown in Fig. 2 and consistent with other phenomenological analyses as well as lattice calculations. With the optimized LGR model calculations we have demonstrated a simultaneous description of charm meson R_{AA} and v_2 observables. We've further made predictions for bottom meson observables in the same model, for which an enhancement of the ratio $R_{AA}(B_s^0)/R_{AA}(B^+)$ is found in the low to intermediate p_T region with its maximum around $p_T \sim 4$ to 6 GeV.

We end with discussions on a few important caveats in the present study that deserve emphasis and that call for future investigations:

- In this work (and in many other studies in literature), the heavy flavour dynamics is encoded in a single parameter, i.e. the spatial diffusion constant $2\pi T D_s$. This is certainly a simplifying approximation, which neglects the momentum dependence of the diffusion coefficients and the distinction between transverse and longitudinal momentum broadening (Eq. 8), leading to the relations in Eqs. (7) and (9). Such approximation is valid in the non-relativistic limit when the heavy quark momentum is small compared with mass. However, this condition is often questionable when one compares model results with experimental data, most of which are available for charm quarks with moderate to large transverse momentum ($p_T > m_Q$). Future measurements on B-mesons at low p_T may help remedy this situation. Future improvements of existing modelings will also be explored by e.g. introducing momentum dependence and distinguishing longitudinal/transverse dynamics [62].
- It may be noted that the fluctuation–dissipation relation Eq. (8) is strictly speaking violated by the additional term $\vec{F}_G$ in Eq. (1) from gluon radiation contribution. This could be partially addressed by imposing a lower cut-off on the gluon energy ($\omega \geq \pi T$ [63]) to balance the gluon radiation and the inverse absorption, as well as to constrain the evolution of low-energy heavy quarks to follow the soft scattering scenario, where the detailed balance is well defined. This issue was discussed in e.g. [63] which argues that the violation is at a mild level of ~ 5 to 10% and should not substantially influence the modeling results. In the future we plan to take the more rigorous step to further incorporate the missing process for gluon absorption so that detailed balance could be strictly maintained.
- Another important caveat in the present modeling (and in many other studies as well) is the uncertainty associated with the hadronization procedure. The in-medium

hadronization is an intrinsically non-perturbative process, which can only be treated with model assumptions. Both the fragmentation and heavy-light coalescence mechanisms are considered in this work. It was shown (e.g. in [4, 64]) that different hadronization procedures could cause considerable variation of the modeling results and thus make it more difficult to draw conclusions from theory-experiment comparisons. A systematic investigation of such uncertainty would be very important for any effort to extract heavy quark transport coefficients from experimental data.

- It would be tempting to go beyond the linear ansatz for $2\pi T D_s$ (Eq. 10). We plan to further employ a multi-term nonlinear ansatz and to use Bayesian inference for efficiently extracting the full temperature dependence. Another improvement would be the inclusion of RHIC data in the analysis. Compared with LHC, the RHIC fireball shall be more sensitive to the near- T_c region and would help further constrain the transport coefficient there. It has also been noticed that the major uncertainty in nailing down the temperature dependence lies in the high temperature end, which has not been well constrained by current data. One possibility is to explore the extremely central collisions (e.g. top 1% events of multiplicity) at the highest LHC energies, which should produce a fireball that has more fraction of its space-time evolution in the high temperature region and thus becomes more sensitive to the behavior of QGP in that region. We also plan to explore this idea in the future.

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Appendix: Relation between transport coefficients

The Fokker–Planck transport equation reads [65]

$$\frac{\partial f_Q}{\partial t} = \frac{\partial}{\partial p^i} \left(A^i f_Q \right) + \frac{\partial^2}{\partial p^i \partial p^j} \left(B^{ij} f_Q \right), \quad (\text{A1})$$

where $f_Q(t, \vec{p})$ is the heavy quark phase-space distribution; A^i and B^{ij} ($i, j = 1, 2, 3$) are the drag and momentum diffusion coefficients, respectively.

$$\begin{aligned} A^i(\vec{p}) &= A(\vec{p}) \cdot p^i \\ B^{ij}(\vec{p}) &= B_0(\vec{p}) P_\perp^{ij}(\vec{p}) + B_1(\vec{p}) P_\parallel^{ij}(\vec{p}). \end{aligned} \quad (\text{A2})$$

$P_\perp^{ij} \equiv \delta^{ij} - p^i p^j / \vec{p}^2$ and $P_\parallel^{ij} \equiv p^i p^j / \vec{p}^2$ are the projection operators for momentum components perpendicular and parallel to the direction of the heavy quark motion, respectively. To get the Einstein fluctuation–dissipation relation from Eq. (A1), one can admit a steady solution $f_Q \rightarrow f_{\text{eq}} \propto \exp\{-E/T\}$ when the left hand side vanishes. It yields

$$\begin{aligned} A \cdot p^i &= -\frac{\partial B^{ij}}{\partial p^j} + \frac{B^{ij}}{TE} \cdot p^j \\ &\stackrel{(\text{A2})}{=} \frac{B_1}{TE} \cdot p^i - \frac{\partial B_1}{\partial p^i} - \frac{d-1}{\vec{p}^2} (B_1 - B_0) \cdot p^i, \end{aligned} \quad (\text{A3})$$

where, d denotes the spatial dimension. Equation (A3) can be further reduced to

$$A = \frac{B_1}{TE} - \frac{\partial B_1}{p \partial p} - \frac{d-1}{\vec{p}^2} (B_1 - B_0). \quad (\text{A4})$$

The momentum diffusion of a single heavy quark can be quantified by the Langevin equation [65]

$$dp^i = -\eta_D \cdot p^i dt + C^{ij} p^j \sqrt{dt}. \quad (\text{A5})$$

The first and second terms on the right hand side of Eq. (A5) represent the deterministic drag (Eq. 2) and stochastic thermal components (Eq. 3), respectively. During the numerical implementation, the stochastic process depends on the specific choice of the momentum argument of the covariance matrix,

$$C^{ij} \rightarrow C^{ij}(\vec{p} + \xi d\vec{p}) \quad (\text{A6})$$

via a parameter $\xi = 0, 0.5, 1$, corresponding to the pre-point Ito, the mid-point Stratonovic, and the post-point discretiza-

tion schemes, respectively. Equation (A6) can be further expressed as

$$C^{ij}(\vec{p} + \xi d\vec{p}) = C^{ij}(\vec{p}) + \xi \frac{\partial C^{ij}}{\partial p^k} dp^k \quad (\text{A7})$$

by performing a Taylor expansion and keeping the terms up to the order of dt . The Gaussian noise ρ^j in Eq. (A5) follows a normal distribution $P(\vec{\rho}) = (\frac{1}{2\pi})^{3/2} \exp\{-\frac{\vec{\rho}^2}{2}\}$, resulting in

$$\langle \rho^i \rangle = 0 \quad \langle \rho^i \rho^j \rangle = \delta^{ij}. \quad (\text{A8})$$

There is therefore no correlation for the random momentum kicks between two different time scale (Eq. 3).

We now can consider an arbitrary phase-space function of the heavy quark momentum $g = g(\vec{p})$, and take its variation in the interval $[\vec{p}, \vec{p} + d\vec{p}]$, keeping only terms up to the order of dt . This yields

$$\begin{aligned} dg &= g(\vec{p} + d\vec{p}) - g(\vec{p}) \\ &= \frac{\partial g}{\partial p^i} dp^i + \frac{1}{2} \frac{\partial^2 g}{\partial p^j \partial p^i} dp^j dp^i \\ &\stackrel{(\text{A7})}{=} \left\{ \frac{\partial g}{\partial p^i} [-\eta_D \cdot p^i + \xi \frac{\partial C^{ij}}{\partial p^k} C^{kl} \rho^l \rho^j] \right. \\ &\quad \left. + \frac{1}{2} \frac{\partial^2 g}{\partial p^i \partial p^j} C^{ik} C^{jl} \rho^k \rho^l \right\} dt + \frac{\partial g}{\partial p^i} C^{ij} \rho^j \sqrt{dt}. \end{aligned} \quad (\text{A9})$$

Here all momentum arguments in the final step have to be taken at the argument $\vec{p}$. The expectation value of Eq. (A9) over the thermal ensembles reads

$$\begin{aligned} \langle dg \rangle &\stackrel{(\text{A8})}{=} \left[\frac{\partial g}{\partial p^i} (-\eta_D \cdot p^i + \xi \frac{\partial C^{ij}}{\partial p^k} C^{kj}) \right. \\ &\quad \left. + \frac{1}{2} \frac{\partial^2 g}{\partial p^i \partial p^j} C^{ik} C^{jk} \right] dt. \end{aligned} \quad (\text{A10})$$

In the above the expectation value over the hydrodynamic evolution time is taken according to the heavy quark phase-space distribution

$$\langle g(\vec{p}) \rangle \equiv \int d^3 \vec{p} g(\vec{p}) f_Q(t, \vec{p}).$$

The time evolution of the above equation gives the differential equation

$$\begin{aligned} \frac{d}{dt} \langle g(\vec{p}) \rangle &\equiv \int d^3 \vec{p} g(\vec{p}) \frac{\partial}{\partial t} f_Q(t, \vec{p}) \\ &\stackrel{(\text{A10})}{=} \int d^3 \vec{p} \left[\frac{\partial g}{\partial p^i} (-\eta_D \cdot p^i + \xi \frac{\partial C^{ij}}{\partial p^k} C^{kj}) \right. \\ &\quad \left. + \frac{1}{2} \frac{\partial^2 g}{\partial p^i \partial p^j} C^{ik} C^{jk} \right] f_Q(t, \vec{p}) \\ &= \int d^3 \vec{p} g(\vec{p}) \left\{ \frac{\partial}{\partial p^i} [(\eta_D \cdot p^i - \xi \frac{\partial C^{ij}}{\partial p^k} C^{kj}) f_Q] \right. \\ &\quad \left. + \frac{1}{2} \frac{\partial^2}{\partial p^i \partial p^j} (C^{ik} C^{jk} f_Q) \right\}. \end{aligned} \quad (\text{A11})$$

Comparing the first and third steps in Eq. (A11), and considering the fact that $g(\vec{p})$ is arbitrary, one can obtain the time evolution of $f_Q(t, \vec{p})$,

$$\begin{aligned} \frac{\partial f_Q}{\partial t} &= \frac{\partial}{\partial p^i} \left[(\eta_D \cdot p^i - \xi \frac{\partial C^{ij}}{\partial p^k} C^{kj}) f_Q \right] \\ &\quad + \frac{1}{2} \frac{\partial^2}{\partial p^i \partial p^j} (C^{ik} C^{jk} f_Q) \end{aligned} \quad (\text{A12})$$

By comparing Eq. (A12) with Eq. (A1), it is found that,

- for the momentum coefficients

$$C^{ij} \stackrel{(\text{A2})}{=} \sqrt{2B_1} P_{\parallel}^{ij} + \sqrt{2B_0} P_{\perp}^{ij} \equiv \sqrt{\kappa_{\parallel}} P_{\parallel}^{ij} + \sqrt{\kappa_{\perp}} P_{\perp}^{ij}, \quad (\text{A13})$$

where, $\kappa_{\parallel} = 2B_0$ and $\kappa_{\perp} = 2B_1$ are the longitudinal and transverse momentum diffusion coefficients in the framework of Langevin dynamics;

- for the drag coefficients

$$\begin{aligned} \eta_D &\stackrel{(\text{A2})}{=} A + \frac{\xi}{p^i} \frac{\partial C^{ij}}{\partial p^k} C^{kj} \\ &\stackrel{(\text{A4}, \text{A13})}{=} \frac{\kappa_{\parallel}}{2TE} + \frac{\xi - 1}{2p} \frac{\partial \kappa_{\parallel}}{\partial p} + \frac{d - 1}{2\vec{p}^2} \left[\xi (\sqrt{\kappa_{\perp}} + \sqrt{\kappa_{\parallel}})^2 \right. \\ &\quad \left. - (3\xi - 1)\kappa_{\perp} - (\xi + 1)\kappa_{\parallel} \right]. \end{aligned} \quad (\text{A14})$$

Taking the post-point Ito scheme ($\xi = 1$) and $d = 3$ in the final step, one can arrive at

$$\eta_D = \frac{\kappa_{\parallel}}{2TE} - \frac{1}{\vec{p}^2} \left(\sqrt{\kappa_{\perp}} - \sqrt{\kappa_{\parallel}} \right)^2. \quad (\text{A15})$$

References

1. M. Gyulassy, L.L. McLerran, Nucl. Phys. A **750**, 30 (2005)
2. E. Shuryak, Nucl. Phys. A **750**, 64 (2005)
3. B. Muller, J. Schukraft, B. Wyslouch, Ann. Rev. Nucl. Part. Sci. **62**, 361 (2012)
4. A. Beraudo et al., Nucl. Phys. A **979**, 21 (2018). [arXiv:1803.03824](#) [nucl-th]
5. S. Cao et al., Phys. Rev. C **99**, 054907 (2019). [arXiv:1809.07894](#) [nucl-th]
6. X. Dong, Y.-J. Lee, R. Rapp, Ann. Rev. Nucl. Part. Sci. **69**, 417 (2019). [arXiv:1903.07709](#) [nucl-ex]
7. K. Zhou, N. Xu, Z. Xu, P. Zhuang, Phys. Rev. C **89**, 054911 (2014). [arXiv:1401.5845](#) [nucl-th]
8. Z. Tang, N. Xu, K. Zhou, P. Zhuang, J. Phys. **G41**, 124006 (2014). [arXiv:1409.5559](#) [nucl-th]
9. A. Andronic et al., Eur. Phys. J. C **76**, 107 (2016). [arXiv:1506.03981](#) [nucl-ex]
10. S. Li, C. Wang, R. Wan, J. Liao, Phys. Rev. C **99**, 054909 (2019). [arXiv:1901.04600](#) [hep-ph]
11. J. Liao, E. Shuryak, Phys. Rev. Lett. **102**, 202302 (2009). [arXiv:0810.4116](#) [nucl-th]
12. J. Xu, J. Liao, M. Gyulassy, Chin. Phys. Lett. **32**, 092501 (2015). [arXiv:1411.3673](#) [hep-ph]
13. J. Xu, J. Liao, M. Gyulassy, JHEP **02**, 169 (2016). [arXiv:1508.00552](#) [hep-ph]
14. K.M. Burke et al. (JET), Phys. Rev. C **90**, 014909 (2014). [arXiv:1312.5003](#) [nucl-th]
15. S. Shi, J. Liao, M. Gyulassy, Chin. Phys. C **42**, 104104 (2018). [arXiv:1804.01915](#) [hep-ph]
16. S. Shi, J. Liao, M. Gyulassy, Chin. Phys. C **43**, 044101 (2019). [arXiv:1808.05461](#) [hep-ph]
17. A. Ramamurti, E. Shuryak, Phys. Rev. D **97**, 016010 (2018). [arXiv:1708.04254](#) [hep-ph]
18. J.E. Bernhard, J.S. Moreland, S.A. Bass, Nat. Phys. **15**, 1113–1117 (2019)
19. Y. Xu, S.A. Bass, P. Moreau, T. Song, M. Nahrgang, E. Bratkovskaya, P. Gossiaux, J. Aichelin, S. Cao, V. Greco, G. Coci, K. Werner, Phys. Rev. C **99**, 014902 (2019)
20. S.S. Cao, G.Y. Qin, S.A. Bass, Phys. Rev. C **92**, 024907 (2015)
21. F. Prino, R. Rapp, J. Phys. G **43**, 093002 (2016)
22. B.W. Zhang, E.K. Wang, X.N. Wang, Phys. Rev. Lett. **93**, 072301 (2004)
23. Y. Akamatsu, T. Hatsuda, T. Hirano, Phys. Rev. C **79**, 054907 (2009)
24. M. He, R.J. Fries, R. Rapp, Phys. Rev. Lett. **110**, 112301 (2013)
25. Y.R. Xu, J.E. Bernhard, S.A. Bass, M. Nahrgang, S.S. Cao, Phys. Rev. C **97**, 014907 (2018)
26. S. Li, C.W. Wang, X.B. Yuan, S.Q. Feng, Phys. Rev. C **98**, 014909 (2018)
27. G.D. Moore, D. Teaney, Phys. Rev. C **71**, 064904 (2005)
28. T. Song, H. Berrehrah, D. Cabrera, W. Cassing, E. Bratkovskaya, Phys. Rev. C **93**, 034906 (2016)
29. H. Berrehrah, P.B. Gossiaux, J. Aichelin, W. Cassing, E. Bratkovskaya, Phys. Rev. C **90**, 064906 (2014)
30. F. Scardina, M. Colonna, S. Plumari, V. Greco, Phys. Lett. B **724**, 296 (2013)
31. X. Dong, V. Greco, Prog. Part. Nucl. Phys. **104**, 97 (2019)
32. I. Karpenko, P. Huovinen, M. Bleicher, Comput. Phys. Commun. **185**, 3016 (2014)
33. S. Li, C.W. Wang, Phys. Rev. C **98**, 034914 (2018)
34. E. Braaten, K. Cheung, T.C. Yuan, Phys. Rev. D **48**, R5049 (1993)
35. M. Cacciari, P. Nason, R. Vogt, Phys. Rev. Lett. **95**, 122001 (2005)
36. K.C. Han, R.J. Fries, C.M. Ko, Phys. Rev. C **93**, 045207 (2016)
37. C.B. Dover, U. Heinz, E. Schnedermann, J. Zimanyi, Phys. Rev. C **44**, 1636 (1991)
38. C.W. Hwang, Eur. Phys. J. C **23**, 585 (2002)
39. ALICE Collaboration, J. High Energy Phys. **03**, 081 (2016)
40. ALICE Collaboration, J. High Energy Phys. **03**, 082 (2016)
41. ALICE Collaboration, J. High Energy Phys. **10**, 174 (2018)
42. ALICE Collaboration, Phys. Rev. C **90**, 034904 (2014)
43. ALICE Collaboration, Phys. Rev. Lett. **120**, 102301 (2018)
44. S.S. Cao, T. Luo, G.Y. Qin, X.N. Wang, Phys. Rev. C **94**, 014909 (2016)
45. W.M. Alberico, A. Beraudo, A. De Pace, A. Molinari, M. Monteno, M. Nardi, F. Prino, Eur. Phys. J. C **71**, 1666 (2011)
46. O. Fochler, Z. Xu, C. Greiner, Phys. Rev. C **82**, 024907 (2010)
47. S.Z. Shi, J.F. Liao, M. Gyulassy, Chin. Phys. C **42**, 104104 (2018)
48. S.Z. Shi, J.F. Liao, M. Gyulassy, Chin. Phys. C **43**, 044101 (2018)
49. D. Banerjee, S. Datta, R. Gavai, P. Majumdar, Phys. Rev. D **85**, 014510 (2012)
50. H.T. Ding, A. Francis, O. Kaczmarek, F. Karsch, H. Satz, W. Soeldner, Phys. Rev. D **86**, 014509 (2012)
51. O. Kaczmarek, Nucl. Phys. A **931**, 633 (2014)
52. J.C. Xu, J.F. Liao, M. Gyulassy, J. High Energy Phys. **1602**, 169 (2016)
53. W.Y. Ke, Y.R. Xu, S.A. Bass, Phys. Rev. C **98**, 064901 (2018)
54. S. Li, C.W. Wang, R.Z. Wan, J.F. Liao, Phys. Rev. C **99**, 054909 (2019)
55. L. Tolos, J.M. Torres-Rincon, Phys. Rev. D **88**, 074019 (2013)
56. O. Andreev, Mod. Phys. Lett. A **33**, 1850041 (2018)
57. S.S. Gubser, Phys. Rev. D **76**, 126003 (2007)
58. C.M.S. Collaboration, Phys. Rev. Lett. **120**, 202301 (2018)
59. C.M.S. Collaboration, Phys. Rev. Lett. **119**, 152301 (2017)
60. C.M.S. Collaboration, Phys. Lett. B **798**, 168 (2019)
61. S.K. Das, J.M. Torres-Rincon, L. Tolos, V. Minissale, F. Scardina, V. Greco, Phys. Rev. D **94**, 114039 (2016)
62. P.B. Gossiaux, Nucl. Phys. A **982**, 113 (2019)
63. S.S. Cao, G.Y. Qin, S.A. Bass, Phys. Rev. C **88**, 044907 (2013)
64. J.X. Zhao, S.Z. Shi, N. Xu, P.F. Zhuang, [arXiv:1805.10858](#) (2018)
65. R. Rapp, H. van Hees, *Quark-Gluon Plasma*, vol. 4 (Singapore, World Science, 2010), p. 111206