

# Heavy Flavor Jet Substructure for Heavy Ion Collisions

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Based on 2312.15560 and ongoing works



Parton Showers and Resummation 2024  
July 3, 2024

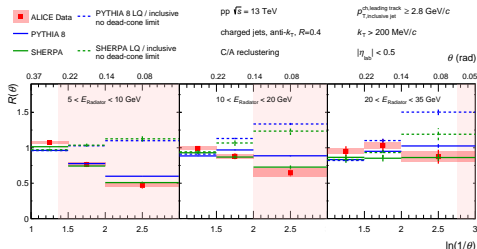


- 1 Introduction
- 2 Medium induced radiation in dense medium
  - NN-based solution for BMDPS-Z
  - Heavy flavor jet substructure in dense medium
- 3 Towards medium-induced radiation in expanding medium



- Dead-cone effect: radiation is suppressed within an angular size of  $m/E$
- First direct experimental observation of collinear radiation suppression

ALICE: ArXiv: 2106.05713



- But only a handful of theoretical studies for heavy flavour jet substructure:
  - L. Cunqueiro, D. Napoletano and A. Soto-Ontoso ArXiv: 2211.11789
  - S. Caletti, A. Ghira and S. Marzani ArXiv: 2312.11623
  - B. Blok, C. Wu ArXiv: 2312.15560
- Our goal: study medium modification effects on the parton splitting functions



# Soft drop grooming and $z_g$ distribution

Soft drop (SD) grooming: clean the jets up by removing soft radiation (**More details in Andrea Ghira's talk**)

- identify the “correct” angular scale
- throw away what is soft & large angle
- left a groomed jet

Declustering the jet constituents until the subjects satisfy the SD condition:

$$z_g = \frac{\min(p_1, p_2)}{p_1 + p_2} > z_{cut} \theta_g^\beta, \quad \theta_g = \frac{\Delta R_{12}}{R}$$

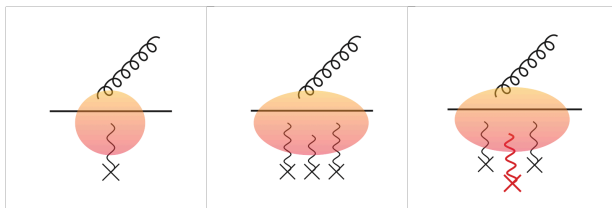
- For  $\beta \geq 0$ , collinear splittings always pass the SD condition,  $z_g$  **not IRC safe**, need applying Sudakov safe techniques.
- For  $\beta = 0$ , i.e. modified mass drop,  $z_g$  provides a direct measurement of the splitting function.

$$p_i(z_g) = \frac{\bar{P}_i(z_g)}{\int_{z_{cut}}^{1/2} \bar{P}_i(z_g) dz} \Theta(z_g - z_{cut})$$



# Parton propagation through medium

- Dilute medium: For low medium opacity, only one scattering occurs.
- Dense medium:
  - Bethe-Heitler regime,  $\omega < \omega_{BH}$
  - BDMPS-Z regime,  $\omega_{BH} < \omega < \omega_c$ : Multiple scatterings based on a path-integral formalism
  - Hard GLV regime,  $\omega > \omega_c$ : Opacity expansion in terms of the number of scattering centers



Three regimes of the radiative spectrum in dense media [ArXiv: 2206.02811].

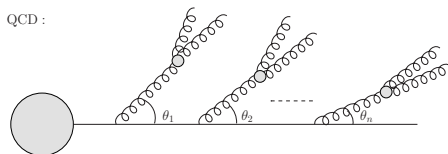


# Parton propagation in dense medium

- Vacuum-like emissions (VLE): double differential probability for bremsstrahlung at DLA

$$d^2P = \frac{\alpha_s C_R}{\pi} \frac{d\omega}{\omega} \frac{d\theta^2}{\theta^2}$$

- Duration:  $t_f \sim \omega/k_T^2 = 1/(\omega\theta^2)$   
Parent parton and the emitted gluon lose their mutual quantum coherence
- Angular ordering:  $\theta_{n+1} \ll \theta_n$  radiation is confined in a cone



- Heavy flavor VLE: dead-cone approximation

$$d^2P = \frac{\alpha_s C_R}{\pi} \frac{d\omega}{\omega} \frac{d\theta^2}{\theta^2} \cdot \frac{1}{(1 + \theta_0^2/\theta^2)^2}$$

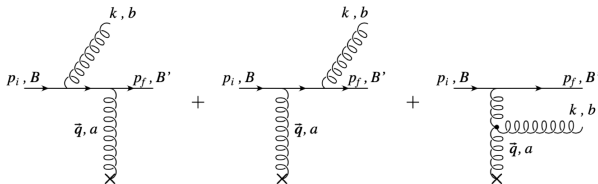


# Parton propagation in dense medium

- Medium-induced emissions (MIE): no collinear divergence

$$d^3P \sim \frac{\alpha_s C_R}{\pi} \frac{d\omega}{\omega} \frac{dt}{t_{med}} P_{broad}(\theta) d\theta, \text{ with } t_{med} = \sqrt{\omega/q}$$

- Transverse momentum broadening:
  - Gaussian distribution, with a width  $\langle k_{\perp}^2 \rangle \sim q\Delta t$
  - The broadening accumulated momentum over the formation time.



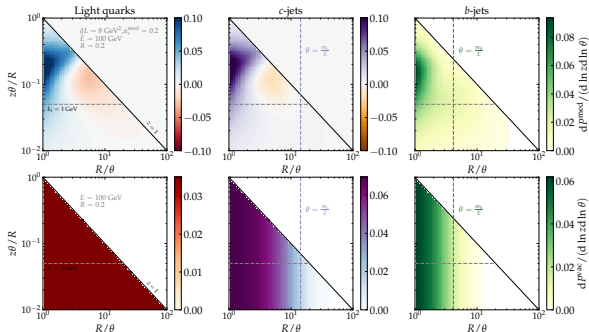
- Heavy flavor MIE: the radiation is also suppressed, but less effective due to the reduction of LPM effect.



# Dead-cone and radiation in dense QCD medium

Radiation from an energetic, massive quark is strongly suppressed within the dead-cone

$$\theta_0 = \frac{m_Q}{E}$$



Lund plane density: Medium-induced (top) and vacuum emissions (bottom) [ArXiv: 2211.11789].

## Definition (Jet modification factor)

$$R_i(z_g) \equiv f_{i,med}(z_g) / f_{i,vac}(z_g)$$

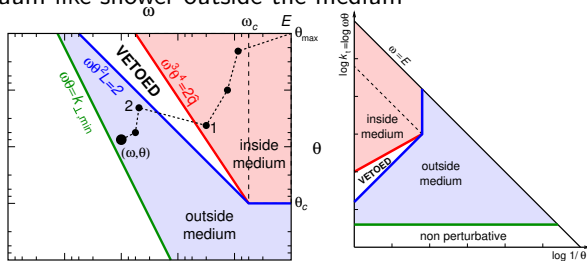


# Physical picture: factorization between VLE and MIE

- Physical picture: factorization between VLE and MIE:

$$t_f(\omega, \theta) \ll t_{med}(\omega)$$

- The medium  $k_{\perp}$  cannot be smaller than  $k_f^2 = qt_{med}$
- No VLE allowed:  $t_{med} < t_f < L$
- Jet factorizes into three regions:
  - angular ordered vacuum-like shower inside the medium
  - medium-induced emissions triggered by previous sources
  - vacuum-like shower outside the medium



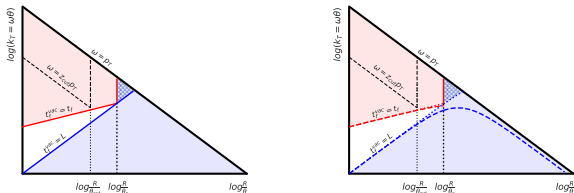
The phase-space for VLE and MIE [P. Caucal, E. Iancu, G. Soyez 1907.04866]



# Physical picture: extension to heavy flavor

Factorization between vacuum-like and medium-induced emissions:

$$t_f = \frac{\omega}{k_t^2 + \theta_0^2 \omega^2} \ll t_{med} = \sqrt{\frac{\omega}{q}}$$



Lund diagram representation of the phase space for the in-medium radiation for massless case (left) and heavy flavor jets (right) with c-jets (dotted line) and b-jets (dashed line).

- Blue region:  $t_f^{vac} > L$ , outside of the medium, the blue crossed region is between  $t_f^{vac} < L$  and  $\theta < \theta_c$ , i.e. not resolved by the medium
- Red region:  $t_f^{vac} \leq t_{med}$ , VLE emissions inside the medium
- White region:  $L \gg t_f^{vac} > t_{med}$ , the VLEs are vetoed.



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BDMPS formula: The medium-induced gluon spectrum is given by

$$\omega \frac{dI}{d\omega} = \frac{\alpha_s C_R}{\omega^2} 2\text{Re} \int_0^\infty dt_2 \int_0^{t_2} dt_1 \partial_{\vec{x}} \cdot \partial_{\vec{y}} [K(\vec{x}, t_2 | \vec{y}, t_1) - K_0(\vec{x}, t_2 | \vec{y}, t_1)] |_{\vec{x}=\vec{y}=0}$$

Alternative method: Zakharov approach

$$\omega \frac{dI}{d\omega} = \frac{\alpha_s C_R}{\omega^2} 2\text{Im} \int_0^L d\xi (L - \xi) \frac{d}{d\rho} \frac{\tilde{F}}{\sqrt{\rho}} |_{\rho=0},$$

where  $\tilde{H}$  is the solution of radial Schrodinger equation

$$\left( i\partial_\xi + \frac{1}{2\omega} \partial_\rho^2 - V(\rho) - \frac{4m^2 - 1}{8\omega\rho^2} \right) \tilde{F} = 0$$

with the initial condition

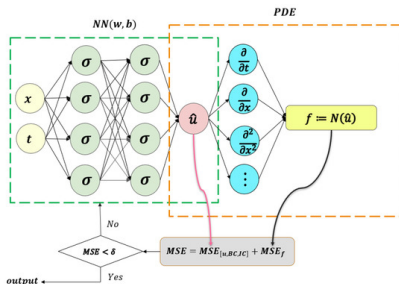
$$\tilde{F}(0, \rho) = V(\rho) / \sqrt{\rho}.$$



# NN-based differential equation solver

Neural network can solve differential equations as an optimization problem. In general, there are three approaches:

- Continuous time approach
- Discrete time approach
- Connection between PDEs and stochastic processes: backward stochastic differential equation



Neural network structures.

$$MSE_f = \frac{1}{N_f} \sum_{n=1}^{N_f} |f(x_f^n, t_f^n)|^2, \quad MSE_u = \frac{1}{N_u} \sum_{n=1}^{N_u} |\hat{u}^n - u(x_u^n, t_u^n)|^2.$$



# NN predicted solution for harmonic oscillator approximation

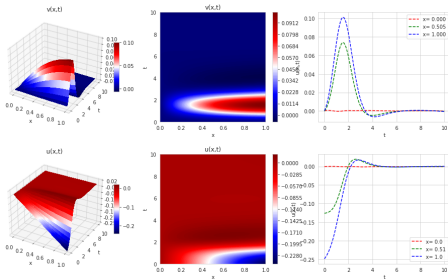
For harmonic potential

$$V(\rho) = \frac{\omega\Omega^2}{2}\rho^2,$$

with imaginary frequency  $\Omega = \frac{1-i}{2}\sqrt{\frac{g}{\omega}}$ . One can obtain the famous BDMPs spectrum

$$\omega \frac{dI}{d\omega} = \frac{2\alpha_s C_R}{\pi} \log|\cos(\Omega L)| \xrightarrow{\omega \ll \omega_c} \frac{\alpha_s C_R}{\pi} \sqrt{\frac{2\omega_c}{\omega}}$$

On the other hand, from my NN solver we can solve the TDSE, we have



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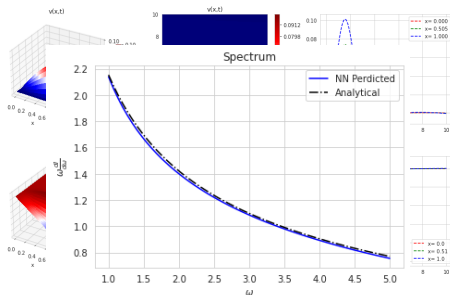
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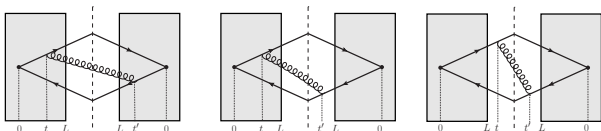
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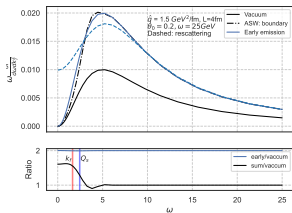


# Early/Late emission factorization and broadening



The three parts of the gluon spectrum in the presence of a medium

Early emission,  $t < t_{med}$



Late emission,  $t > t_{med}$ : at massless limit

$$\omega \frac{dI}{d\omega d^2k_t} = \frac{\alpha_s C_F}{\pi^2 \omega} \text{Re} \int_0^L dt \int \frac{d^2k'}{(2\pi)^2} P(\vec{k}_t - \vec{k}', t, L) e^{-(1+i)\frac{k'^2}{2k_F^2}}$$

$$\xrightarrow{k_t \gg k} \frac{\alpha_s C_F}{\pi^2} \sqrt{\frac{2\omega_c}{\omega}} \tilde{P}(k_t, q, L)$$





# Multiplicity and energy loss

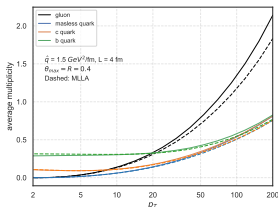
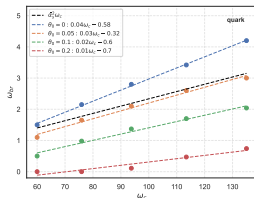
Recall the physical picture: VLEs in the medium act as the source of medium-induced radiation.

- multiple branching scale  $\omega_{br}$ :  $\omega < \omega_{br}$   
MIEs need to be resummed to all-order

$$\int_{\omega_{br}}^{\omega_c} \frac{dI}{d\omega} d\omega \sim O(1)$$

for massless case:  $\omega_{br}^{(R)} = \frac{\alpha_s^2}{\pi^2} C_A C_R \frac{qL^2}{2}$

- In medium VLE multiplicity:  $\nu(z, R) = \int_{\theta_{cut}}^R d\theta \int_{zPT}^{PT} d\omega \frac{d^2 N_{VLE}}{d\omega d\theta}$



# Multiplicity and energy loss

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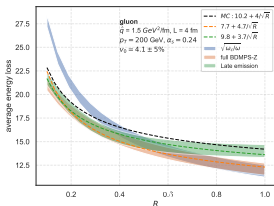
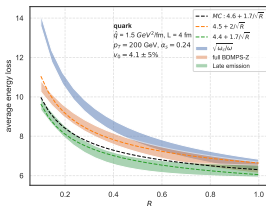
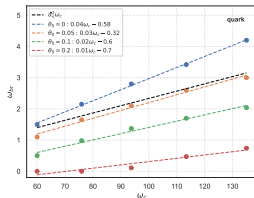
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- Energy loss: multiple soft branchings at large angles, and semi-hard gluons with angle  $\theta > R$

$$\epsilon_{flow}(E) = E \left( 1 - e^{-v_0 \frac{\omega_{br}}{E}} \right), \quad \epsilon_{spec}(R) = \int_{\omega_{br}}^{\bar{\omega}} d\omega \omega \frac{dI}{d\omega}, \quad \bar{\omega} \sim Q_s/R$$



# Multiplicity and energy loss

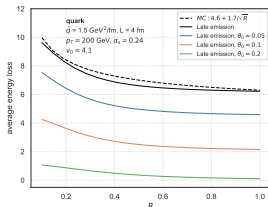
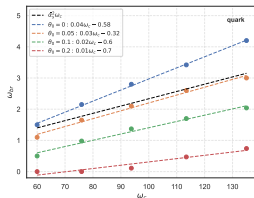
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for massless case:  $\omega_{br}^{(R)} = \frac{\alpha_s^2}{\pi^2} C_A C_R \frac{qL^2}{2}$

- Energy loss for heavy flavor jet: smaller energy loss for heavy quarks than for light quarks, a net effect due to the filling of dead-cone



# In medium $z_g$ distribution

- Full shower formula: included VLE multicity due to the fact each VLE act as a source of MIE Sudakov safe:

$$f(z_g) = N \int_{\theta_{cut}}^R d\theta_g \Delta^{tot}(R, \theta_g) P^{tot}(z_g, \theta_g) \Theta(z_g - z_{cut})$$

$$P^{tot}(z, \theta_g) = P_{VLE}(z, \theta_g) + \nu(z, \theta_g) P_{MIE}(z, \theta_g)$$

Alternative, due to no collinear singularities for MIE spectrum:

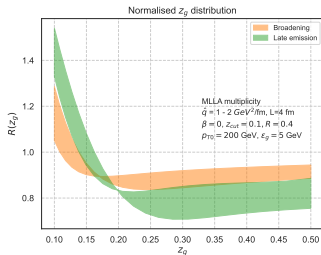
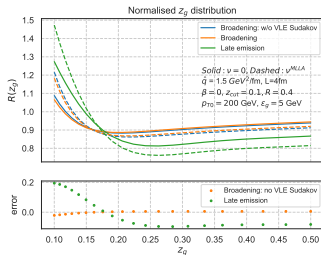
$$f(z_g) = N \int_{\theta_{cut}}^R d\theta_g \left[ P_{VLE}(z_g, \theta_g) \Delta^{VLE}(R, \theta_g) + \nu(z_g, \theta_g) P_{MIE}(z_g, \theta_g) \right] \Theta(z_g - z_{cut})$$

- Definition of  $z_g$  with energy loss:

$$z_g \equiv \frac{p_{T1}}{p_{T1} + p_{T2}} = \frac{zp_T - \mathcal{E}_g(zp_T, \theta_g)}{p_T - \mathcal{E}_i(p_T, \theta_g)} \equiv Z_g(z, \theta_g),$$



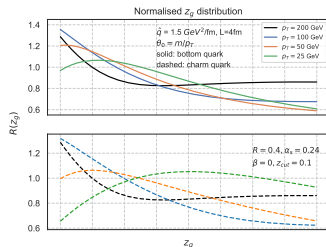
# Phenomenology: $z_g$ in dense medium



Combination of incoherent energy loss affecting vacuum-like splitting and a small  $z_g$  peak associated with the SD condition being triggered by MIE.



# Phenomenology: heavy flavor $z_g$ in dense medium



R ratio is sensitive to the dead-cone angle and can be used to help probe gluon filling the dead-cone

- vacuum emissions are more suppressed compared with the MIEs.
- in some limited regions of phase space the dead cone is filled



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# Towards medium-induced radiation in expanding medium

Expanding QGP medium: non-uniform, time-dependent,  $q \equiv q(t)$

- Bjorken expanding medium:  $q(t) = q_0 (t_0/t)^\alpha$
- Exponential decaying medium:  $q(t) = q_0 e^{-t/L}$

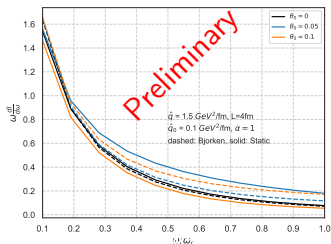
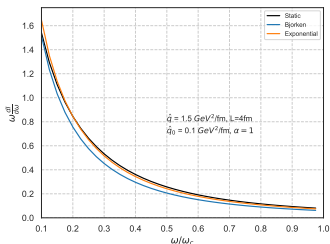
For massless case:

$$\omega \frac{dI}{d\omega} = \frac{\alpha}{\pi} x P_{i \rightarrow g}(x) \lim_{t \rightarrow \infty} \log |C(t; 0)|$$

Scaling law: an equivalent static scenario for expanding medium

C. Salgado, U. Wiedemann ArXiv: hep-ph/0302184, 0204221

$$\langle q \rangle = \frac{2}{L^2} \int_{t_0}^{L+t_0} dt (t - t_0) q(t)$$





# Conclusions and outlook

## Summary:

- We extended the factorization picture for heavy flavor and further extended it by factorizing early and late emissions
- Heavy flavor jet substructure can help probe dead-cone effect

## Ongoing and future works:

- Neural network approach to solve DGLAP-like evolution equation and its application to medium-induced heavy flavor jet evolution
- Heavy flavor jet substructure in expanding medium
- Heavy flavor extension for the Improved Opacity Expansion framework
- Towards precision phenomenology of jet quenching

**Thank you for your attention**



# Extra Slides



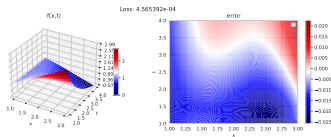
# Two examples

Unintegrated gluon distribution in the small  $x$  limit

$$u \frac{d}{du} \phi(x, u) = \frac{\alpha_s}{2\pi} \int_x^1 \frac{dy}{y} P\left(\frac{x}{y}\right) \phi(y, u)$$

$$\phi(x, 1) = x$$

For NN, the integral part is calculated via matrix multiplication, we have

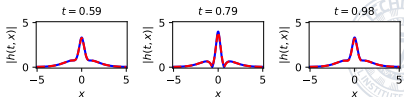
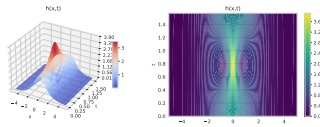


Comparison of the NN predicted and exact solution,  
fixed-coupling limit

Network parameters:

Parameter	TDSE	DGLAP
Hidden layers	5	5
Internal width	100	100
Activation function	Swish	Tanh
Train samples	2000	200
Batch size	1000	20
Epochs	10	100
Optimizer	L-BFGS	Adam
$(\alpha, \beta_1, \beta_2)$	(0.1, 1, 0.99)	$(1 \times 10^{-2}, 0.9, 0.999)$
Max iteration	200	

Non-linear time-dependent Schrodinger equation [Arxiv 1711.10561]



# Full shower result for in-medium $z_g$

