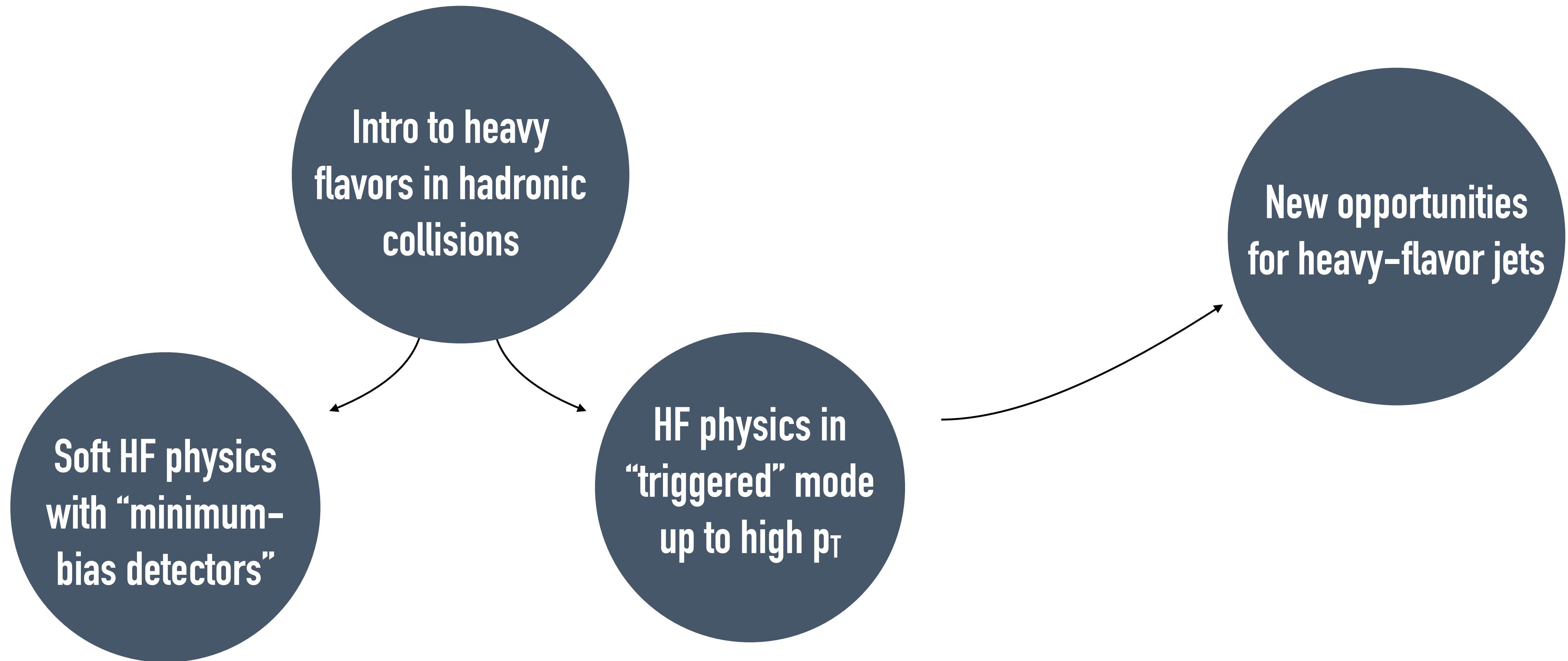


Techniques for heavy-flavor (HF) measurements: strategies, challenges, and future directions

Gian Michele Innocenti
CERN/MIT

JETSCAPE online summer school 2023
24/07/2023

Overview of the talk



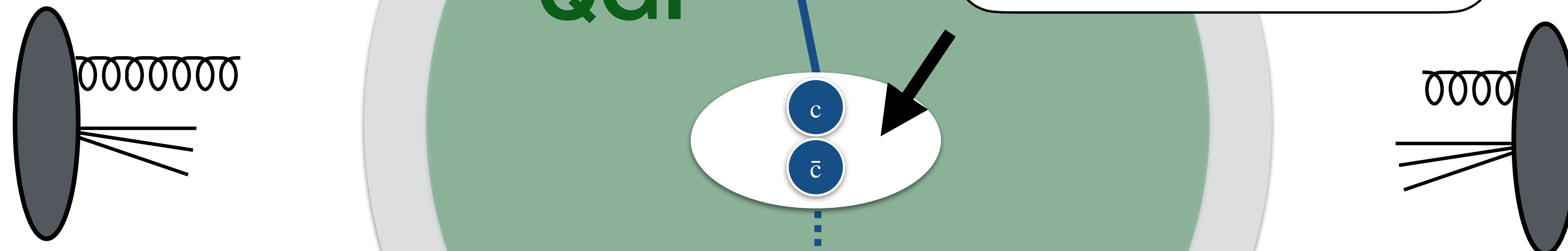
Hot QCD matter with heavy quarks

$m_c \sim 1.5 \text{ GeV}$
 $\Lambda_{\text{QCD}} \sim 200 \text{ MeV}$
 $T_{\text{QGP}} \sim 300 \text{ MeV}$
 $m_{u,d,s} \lesssim T_{\text{QGP}}$

HQs rescatter inside the QGP
→ lose energy, probing the
medium properties

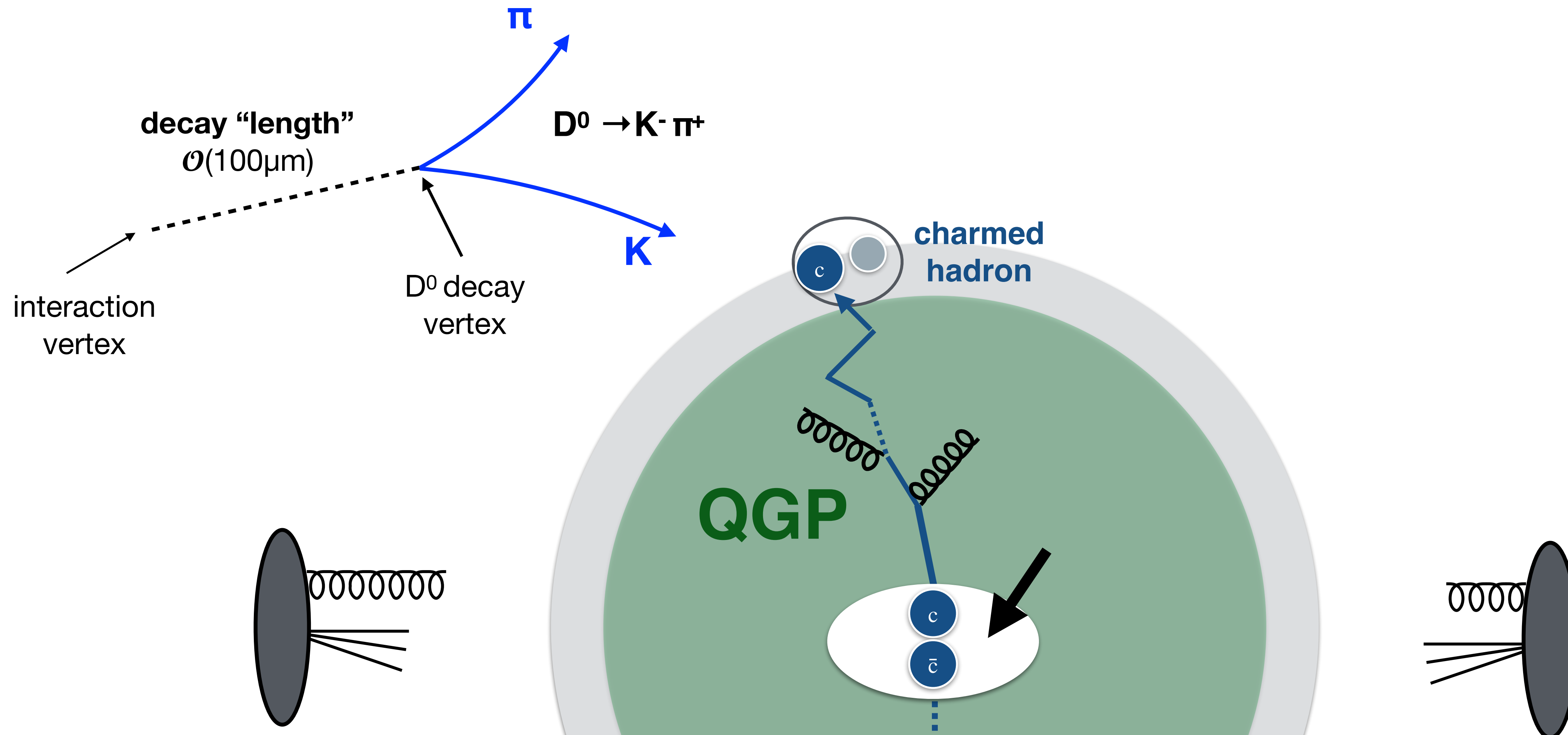
Hadronizes at the boundary of the QGP phase:
→ probing the mechanisms of hadronization

“pQCD” production in
vacuum ($m_{c,b} > \Lambda_{\text{QCD}}$).



Hot QCD matter with heavy quarks

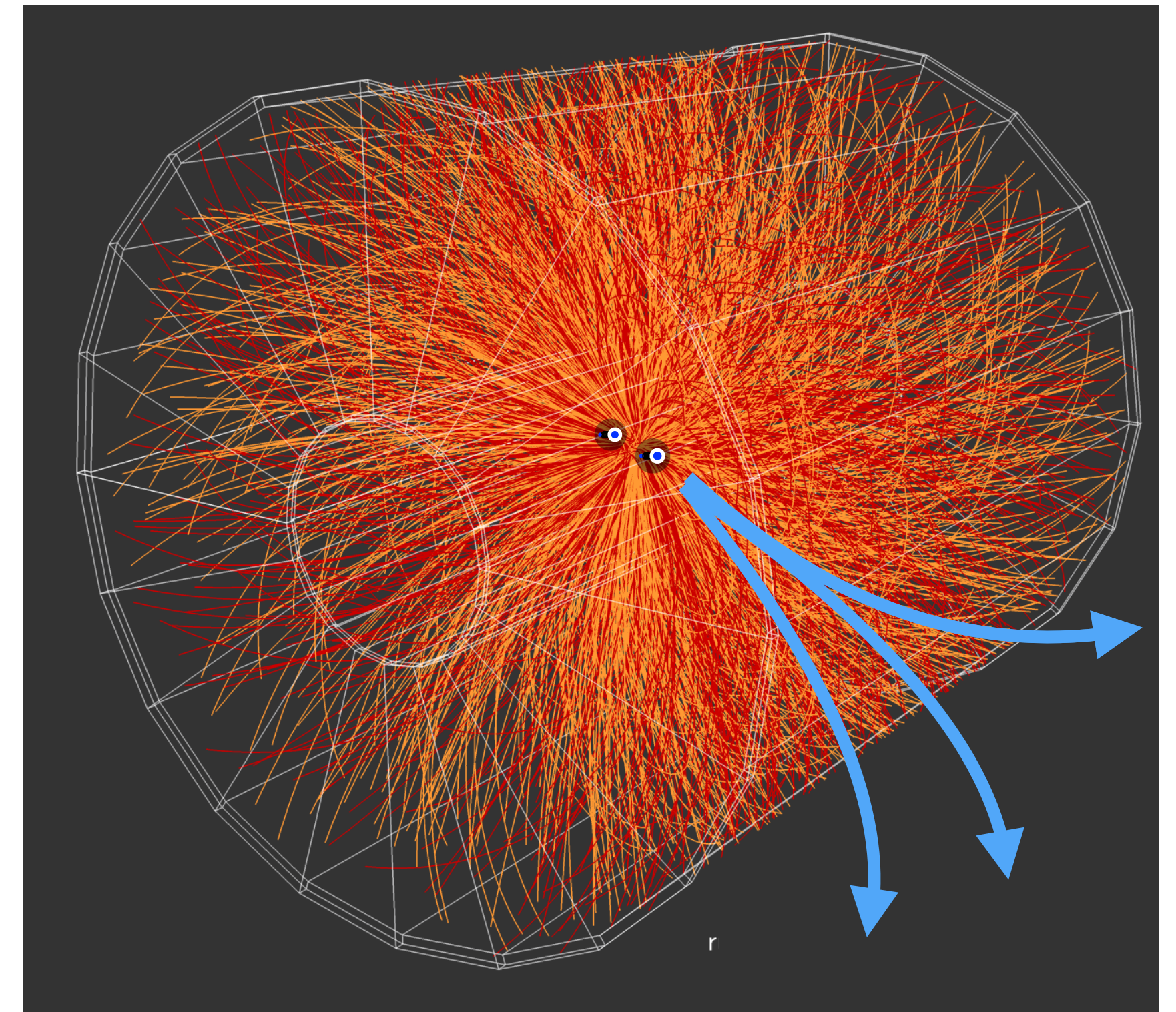
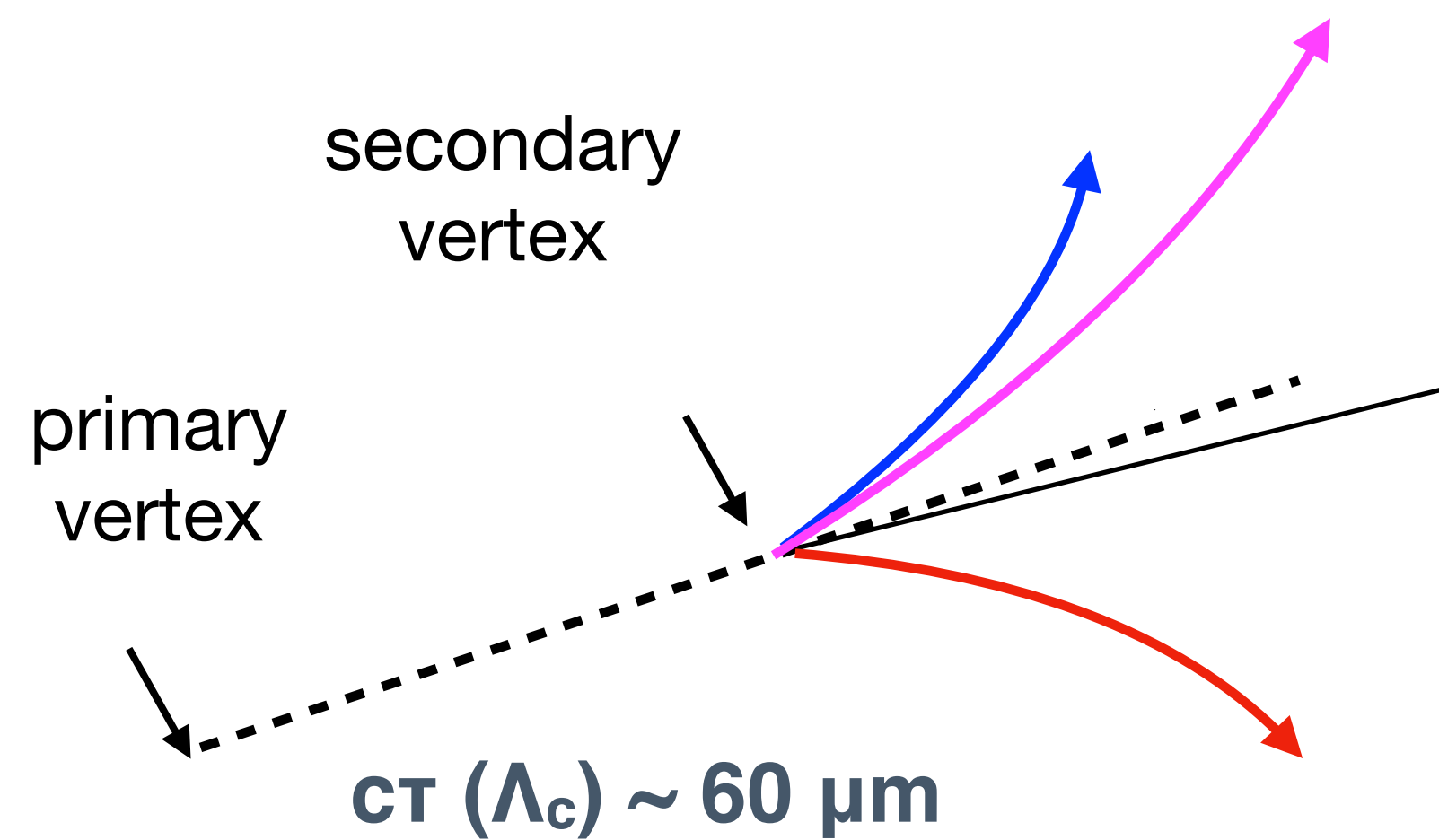
- **Conserved and traceable witness of the QGP evolution** (no “thermal production”)
- **Experimentally accessible at any p_T via fully-reconstructed decays**



**Soft HF physics with
“minimum-bias
detectors”**

“Soft” heavy-flavor physics with minimum bias HI collisions

- low- p_T hadrons (D^0 , Λ_c , Ξ_c ..) with small secondary vertex displacements
- small signal/background → **“un-triggerable” events**



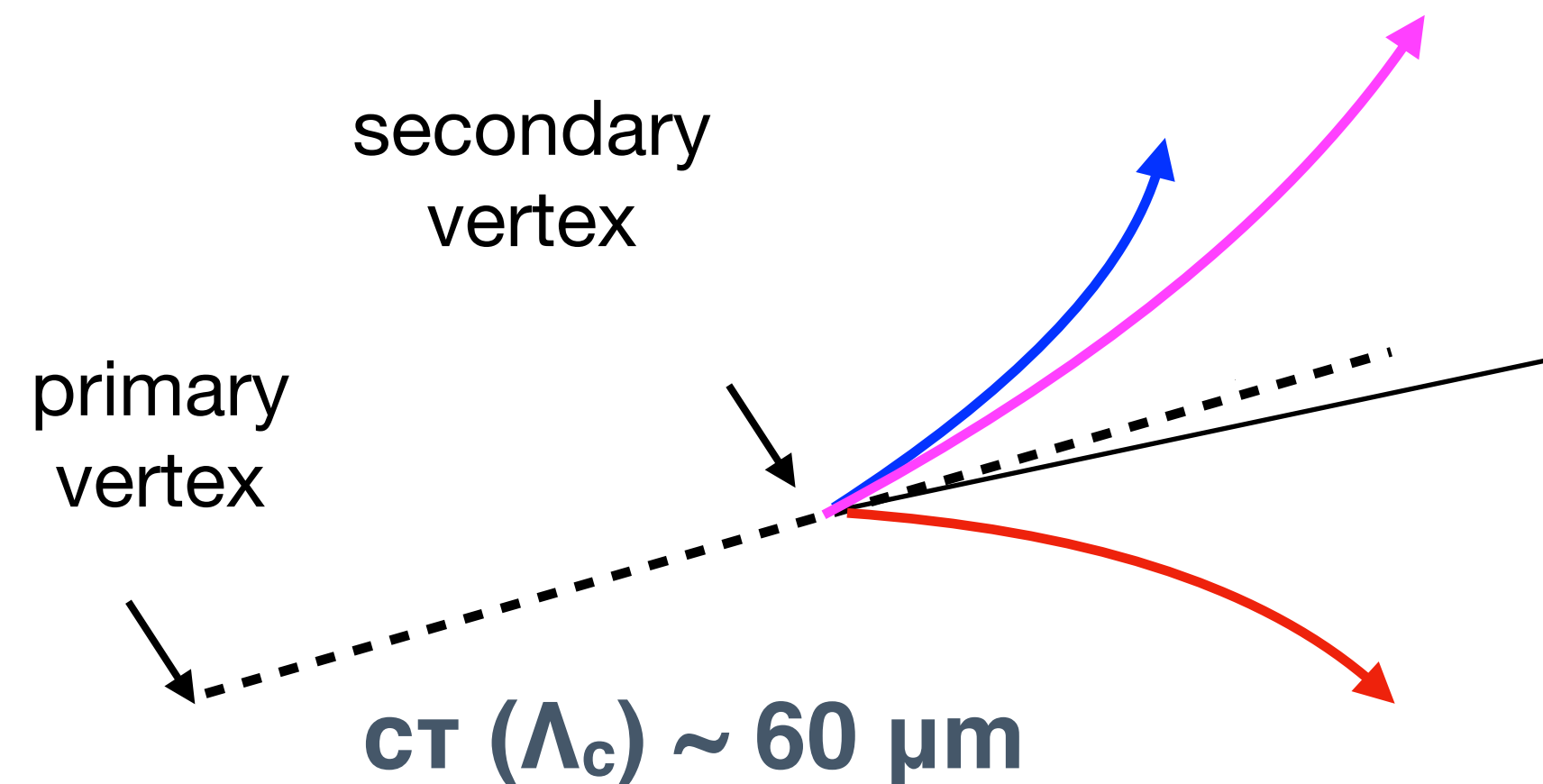
Techniques:

- 1) Machine learning techniques + Particle Identification for improved selection performances
- 2) Large “minimum-bias” statistics and outstanding tracking/vertexing performance,
→ new analysis techniques (data processing, skimming, analysis) and detector technology

Low p_T charmed baryons: one of the biggest challenges

→ Λ_c/D^0 ratio in PbPb and pp: **stronge sensitivity to hadronization in a high-partonic density environment**

Secondary-vertex analysis not possible
with Run 2 ALICE DCA resolution



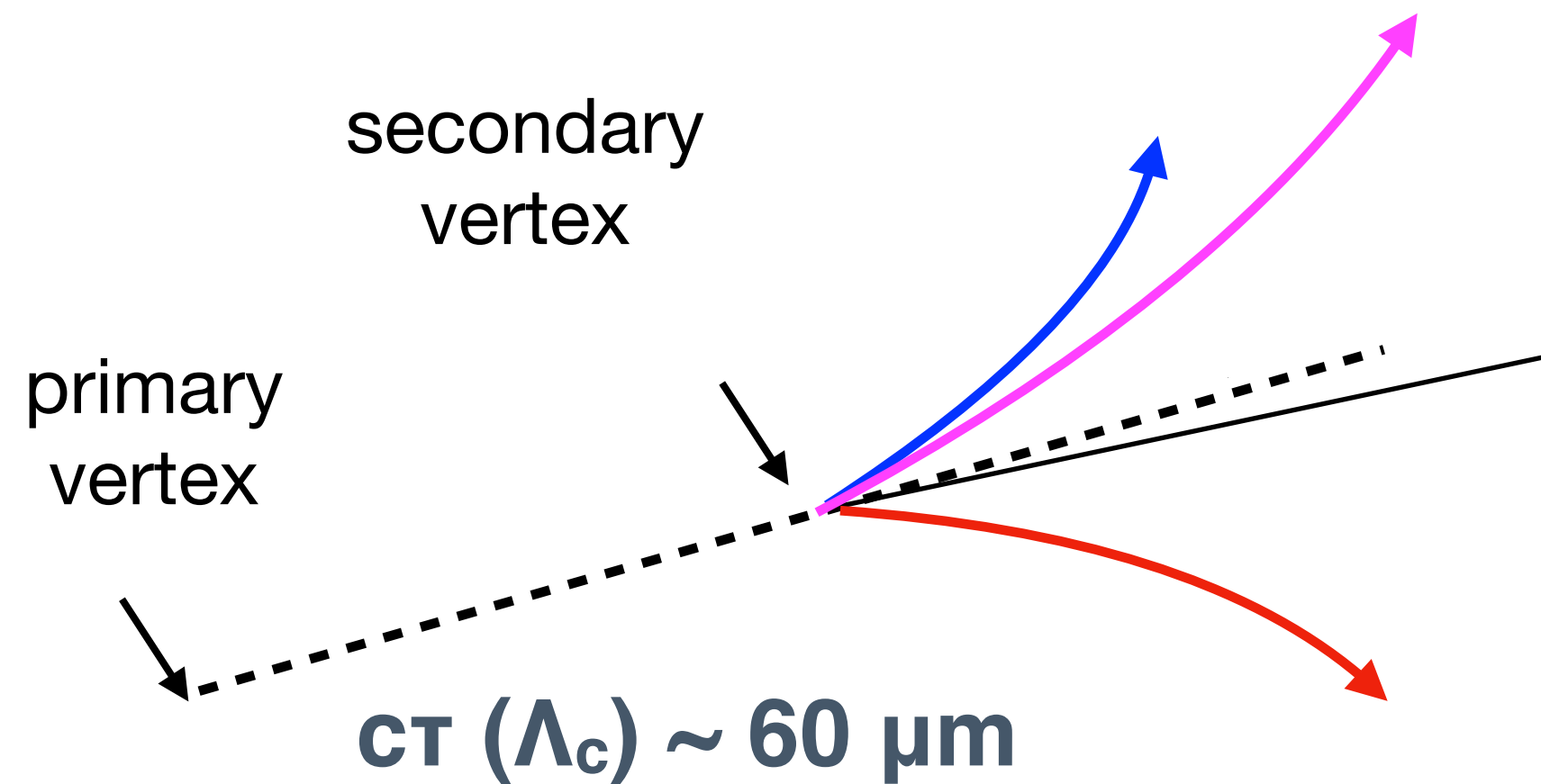
$\Lambda_c \rightarrow pK^0_s$ without secondary-vertex reconstruction

- BDT with PID and “topological” variables
- New tabular data structure + ML ([link](#)) for local processing and optimization ~ TB of data

Low p_T charmed baryons: one of the biggest challenges

→ Λ_c/D^0 ratio in PbPb and pp: **strongest sensitivity to hadronization in a high-partonic density environment**

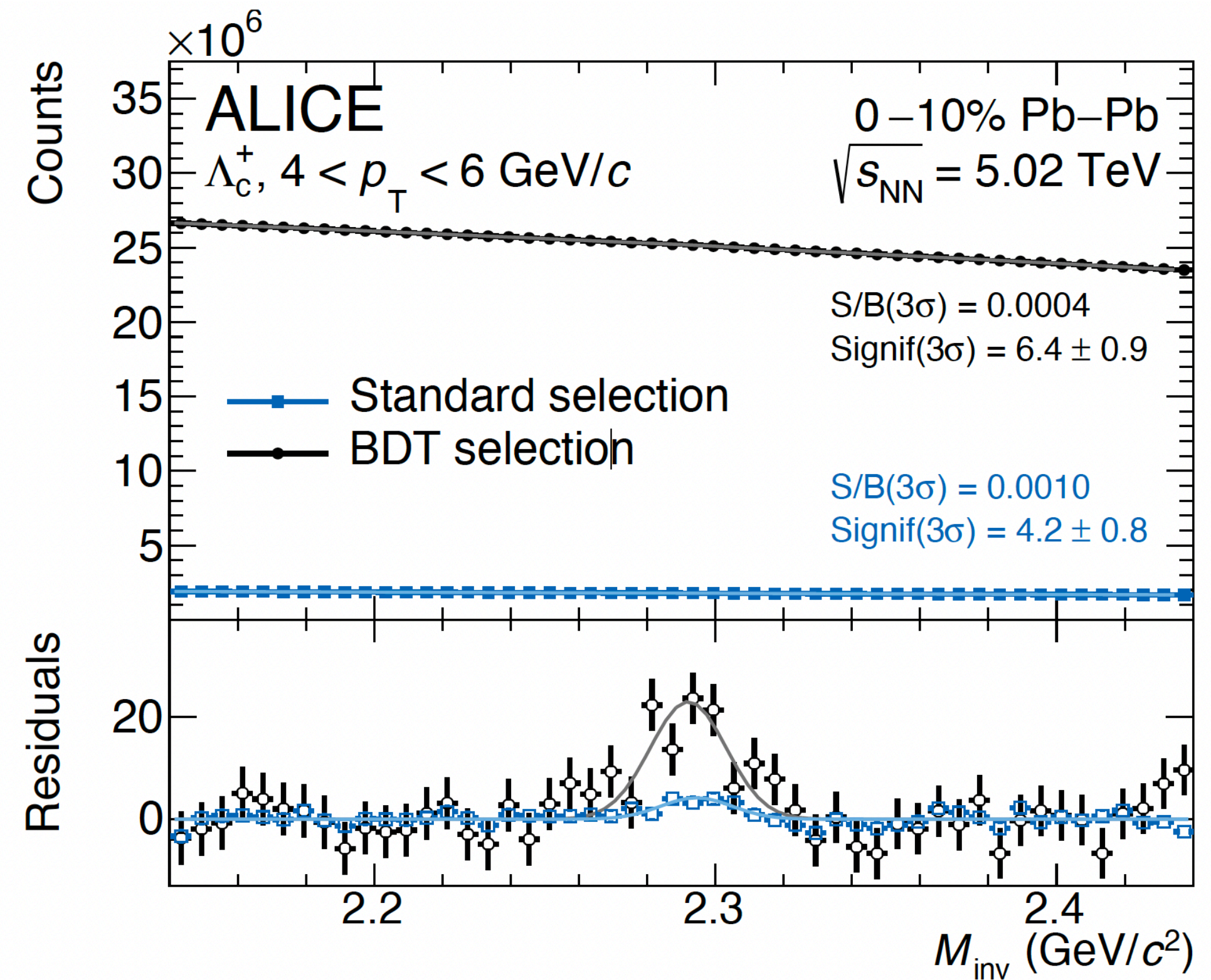
Secondary-vertex analysis not possible
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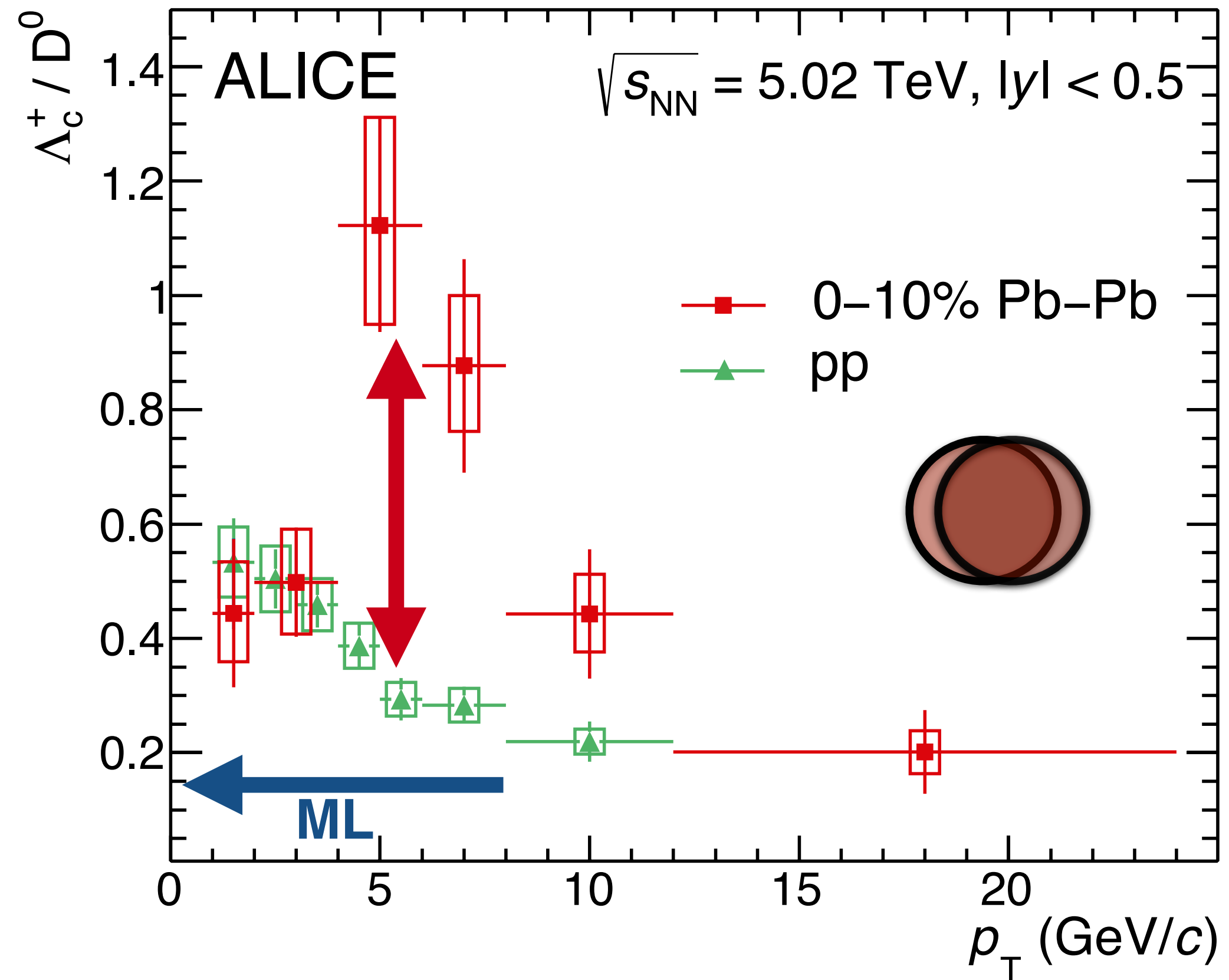
$\Lambda_c \rightarrow pK^0_s$ **without secondary-vertex reconstruction**

- BDT with PID and “topological” variables
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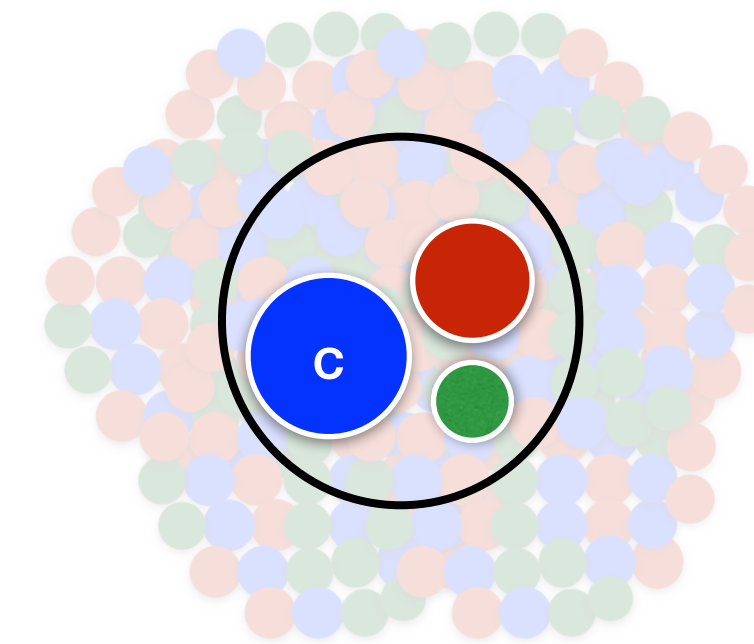
→ **With BDT, 50% increased significance at low p_T**



First Λ_c/D^0 ratio in central PbPb collisions with ALICE



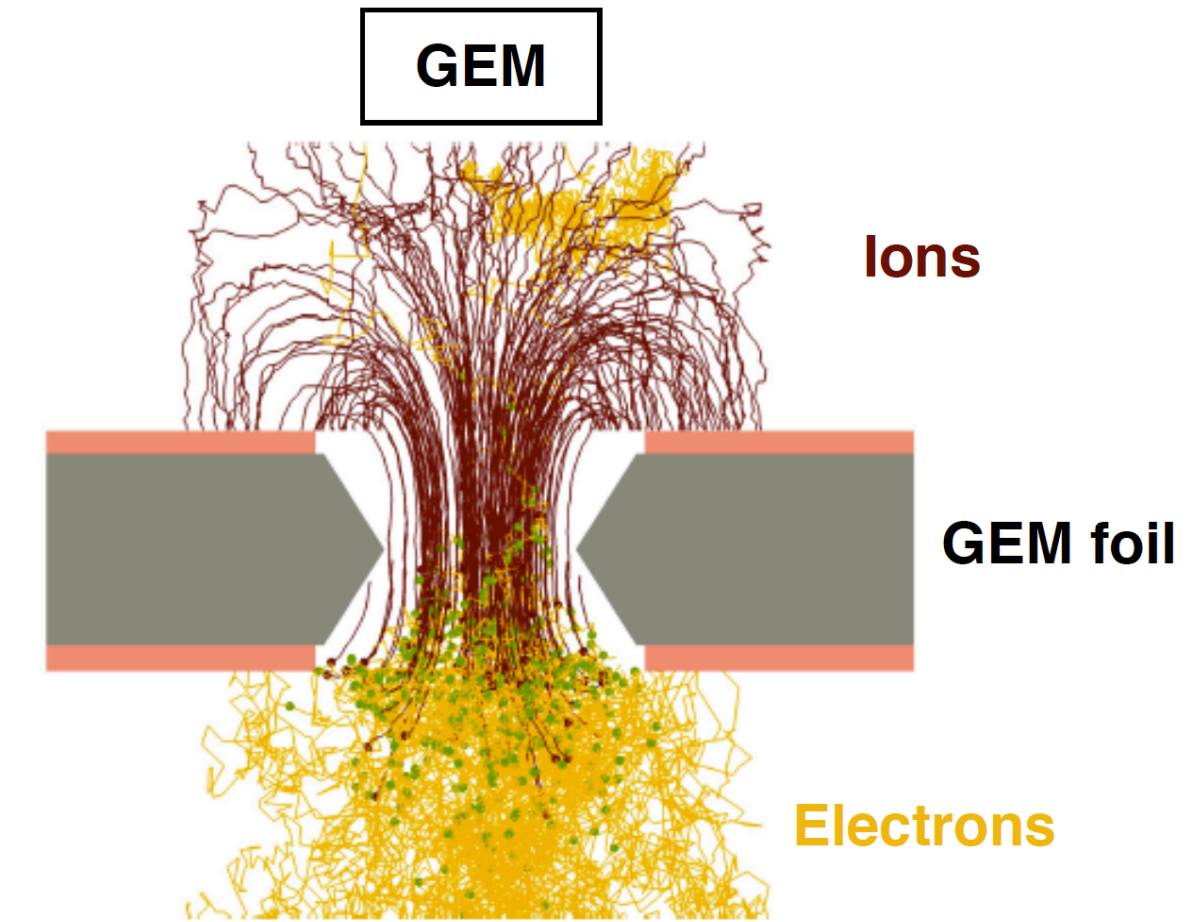
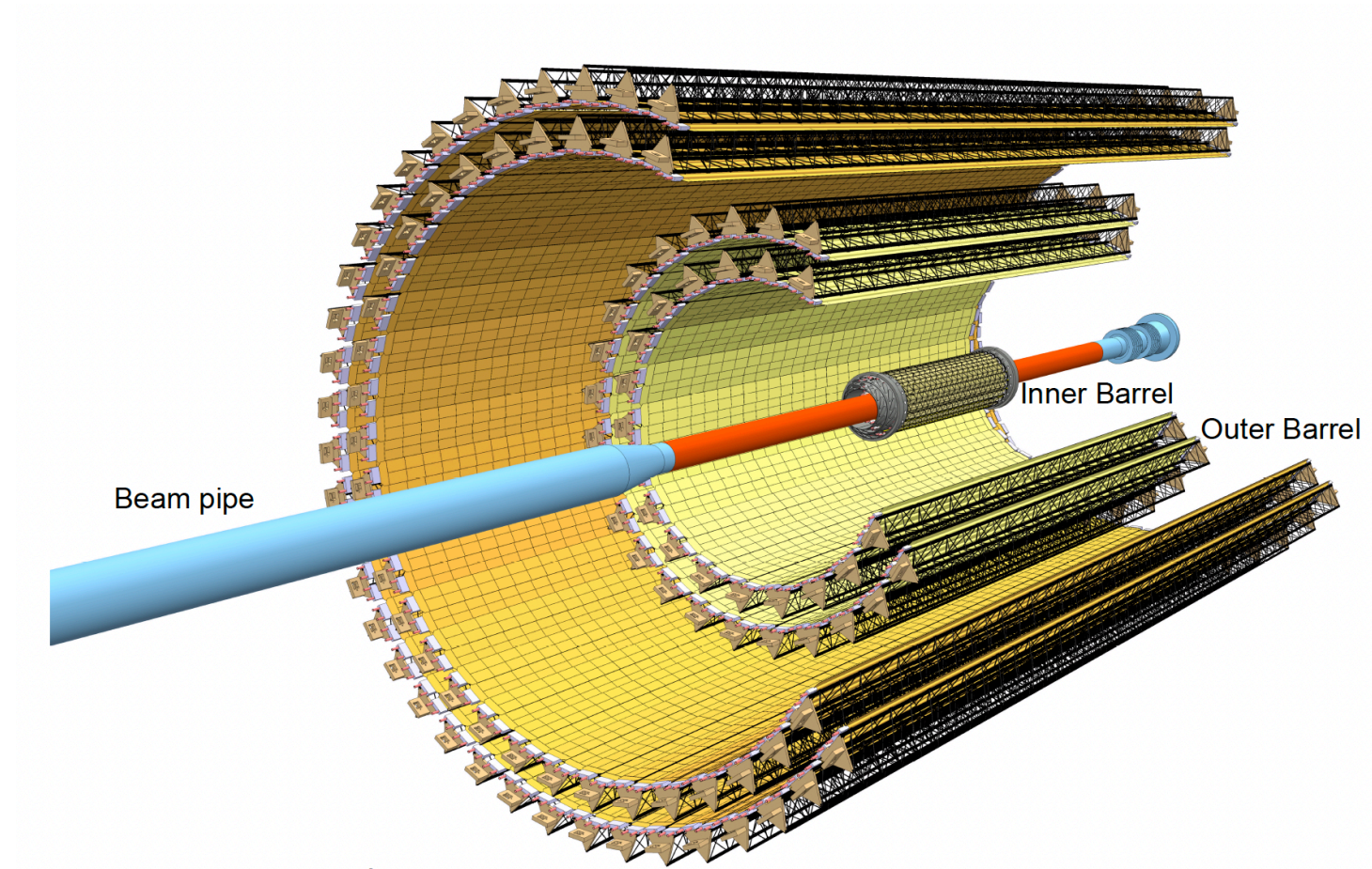
→ **constraining new hadroproduction mechanisms in PbPb**
“recombination” of quarks from independent hard scatterings?



Increase of the Λ_c / D^0 ratio

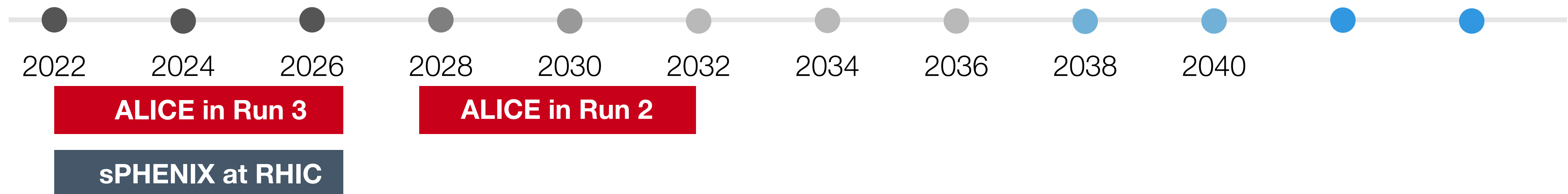
in **PbPb** vs **pp** at
intermediate p_T

“heavy-flavor” upgrades: ALICE in Run3/4 and sPHENIX



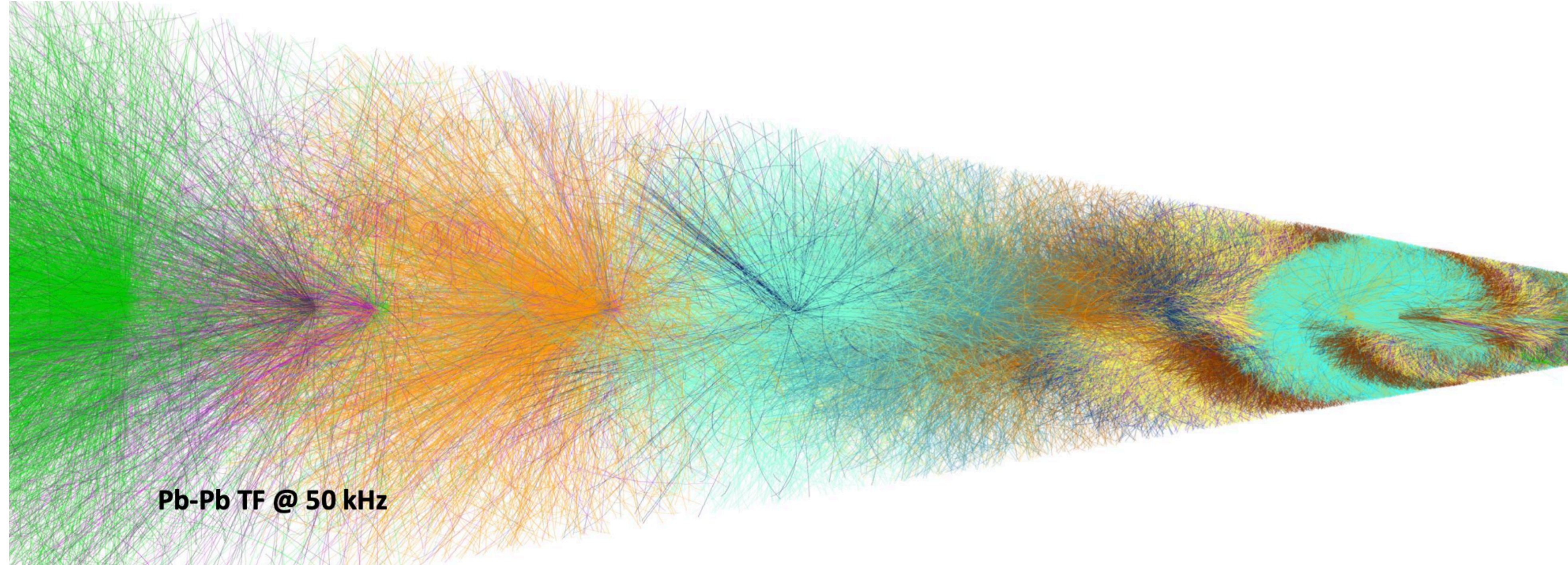
Increased low p_T impact-parameter resolution:
with the new inner tracking system (ITS2 and later ITS3)

Increased rate capabilities with the new TPC readout (GEM):
~ 50-100x more PbPb statistics in **continuous-readout** mode



(See backup slides)

Continuous-readout mode for ALICE and sPHENIX

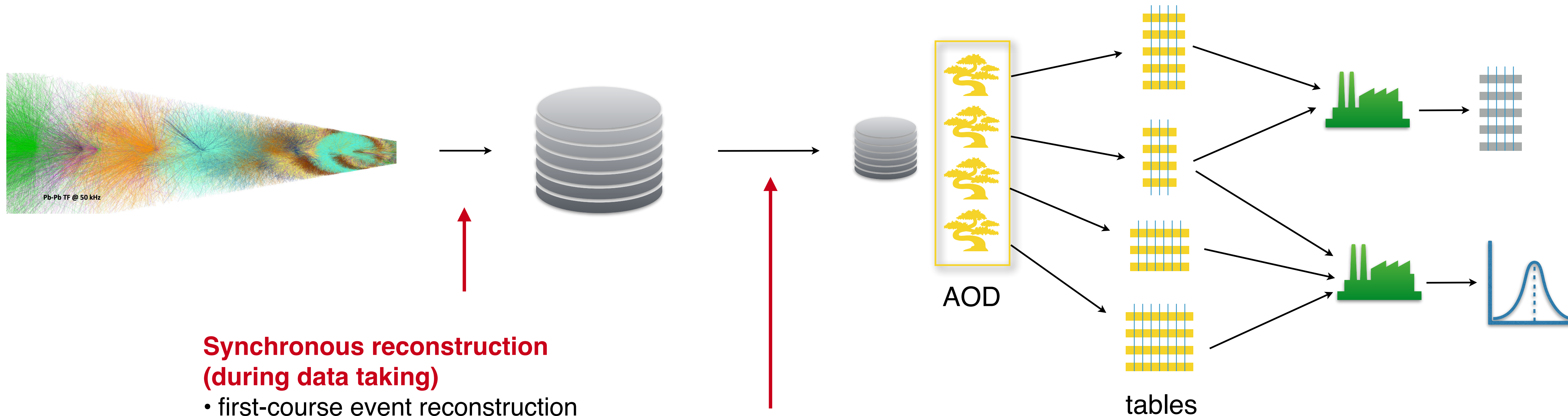


Data are not recorded event-by-event but → stream of data for fixed time intervals!

Challenges: event-track association, reduce storage needs, increase processing efficiency, ...

ALICE offline-to-Online (O²) data processing system

- **Tabular (“flat”) data format** for both reconstruction and analysis (Apache Arrow)
- **Extreme data volume reduction** (already performed while taking data)



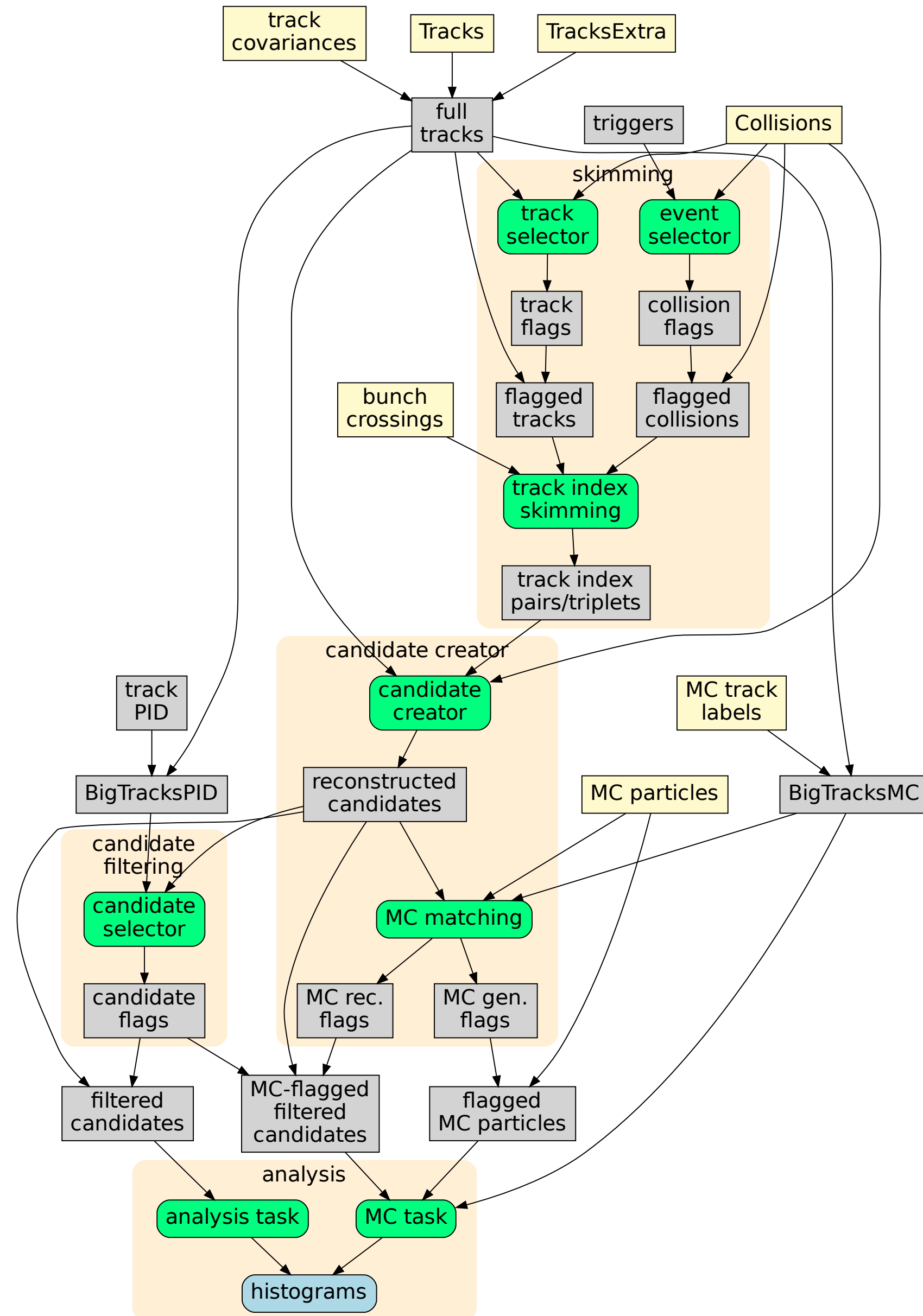
Synchronous reconstruction (during data taking)

- first-course event reconstruction and calibration
- **data-size reduction!**

Asynchronous step (after data taking)

- final calibration and vertex/track reconstruction
- **output stored in AODs**

A new analysis framework for HF analyses



- **Flat-tables as data format**
→ efficiency and **compatibility with a continuous stream of data**
- **optimized data format for minimizing storage needs**
→ only decay tracks indices saved instead of the full HF candidate
- **Suitable for both offline and online processing**
→ designed to be used for proton-proton heavy-flavor tagging
- **Optimized/ready for ML techniques**

For more detail: V. Kucera et al. [CHEP 2021 proceedings](#)

**HF physics in
“triggered” mode
up to high p_T**

Heavy-flavor physics in “triggered” mode

Challenges:

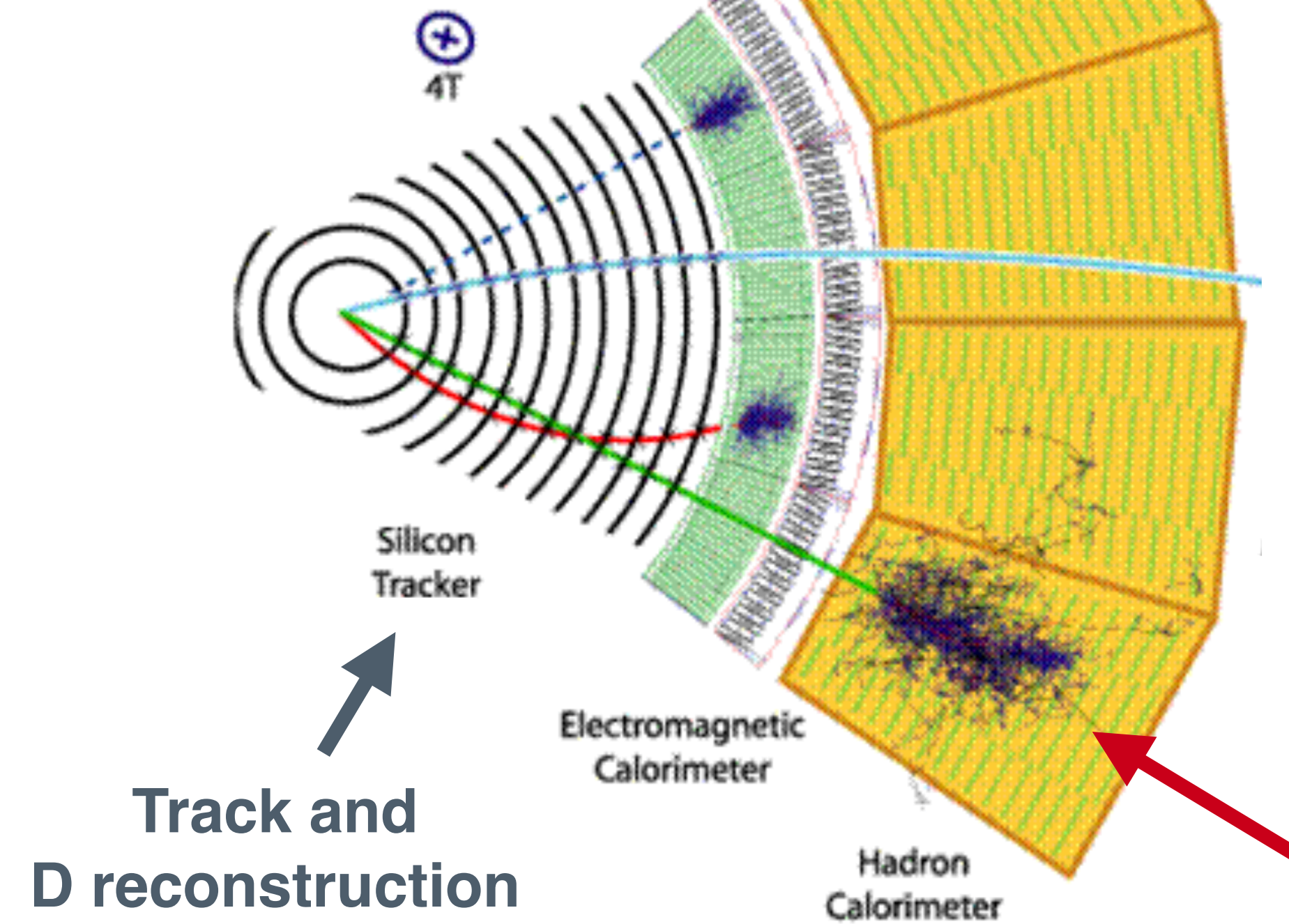
- extend high- p_T reach of HF hadrons and HF-jets
- fully reconstructed beauty hadrons

Techniques:

- exploit general-purpose HEP experiments (calorimetry)
- new triggers for heavy-flavor in heavy-ion collisions

CMS Collaboration, [Phys. Lett. B 782 \(2018\) 474](#)

— Hadron (e.g. Pion)
- - - Photon



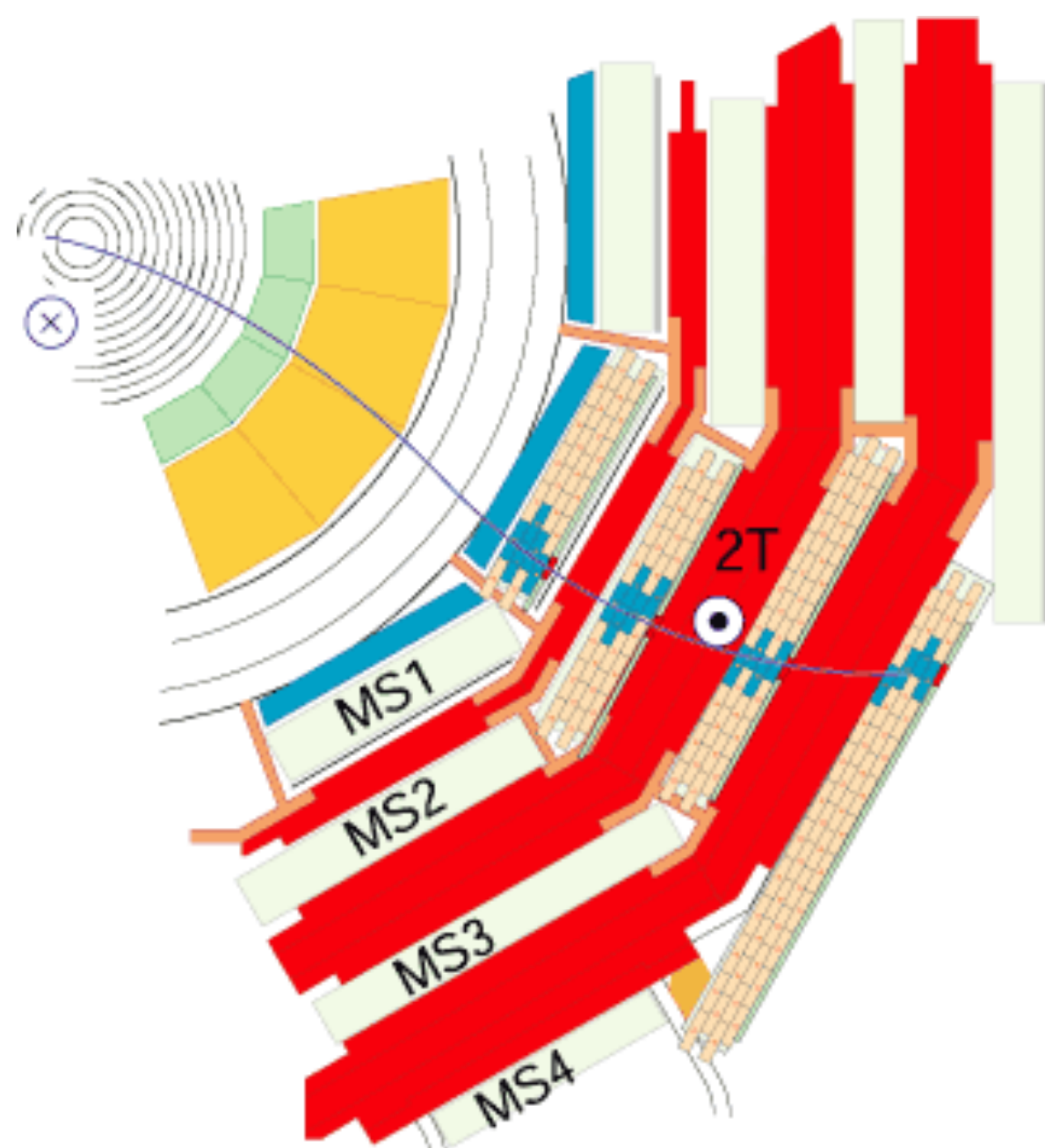
An example: HF measurements in heavy-ions with CMS

B-hadron analyses in heavy-ion collisions

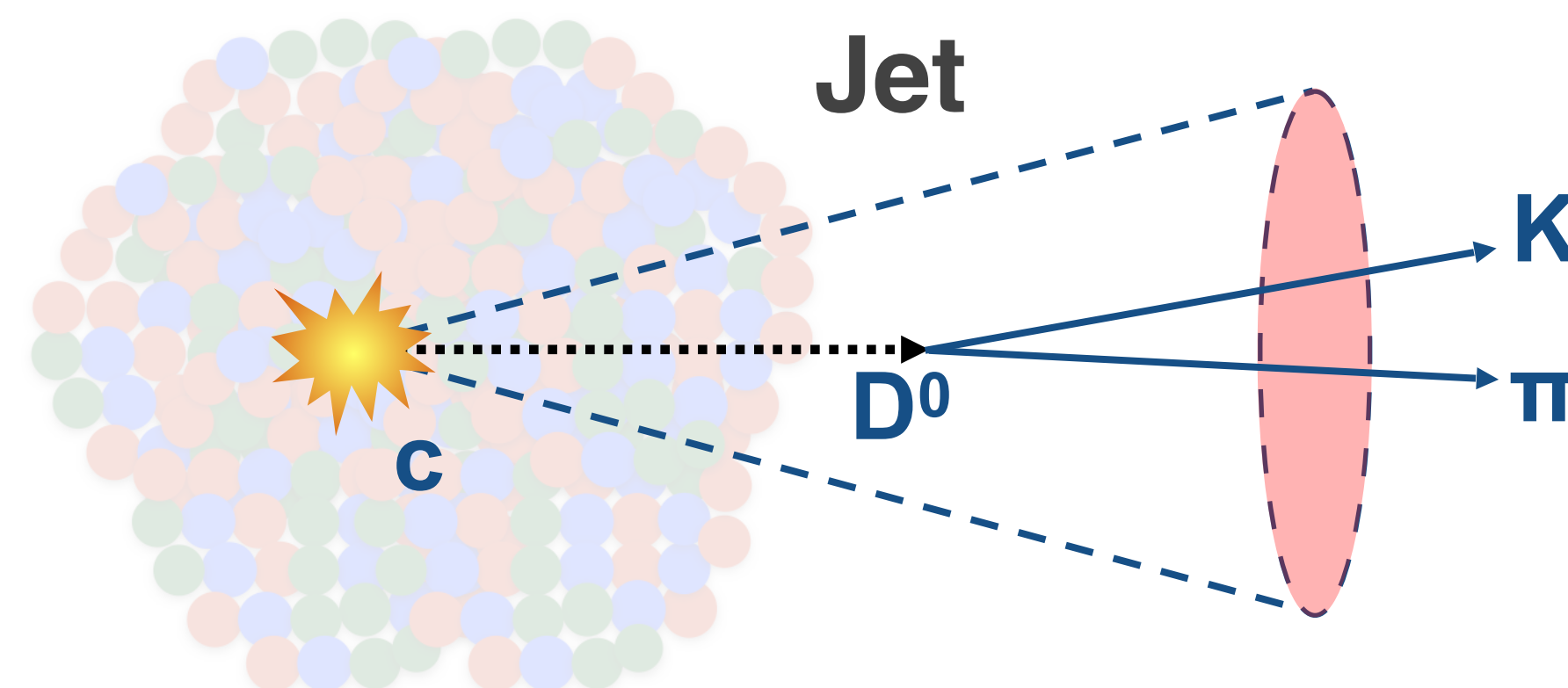
with e.g. $B^+ \rightarrow J/\psi K^+ \rightarrow \mu^+ \mu^- K^+$

→ exploit **outstanding muon capabilities** of CMS

→ **direct** access to the energy loss of b quarks



HF measurement up to high- p_T

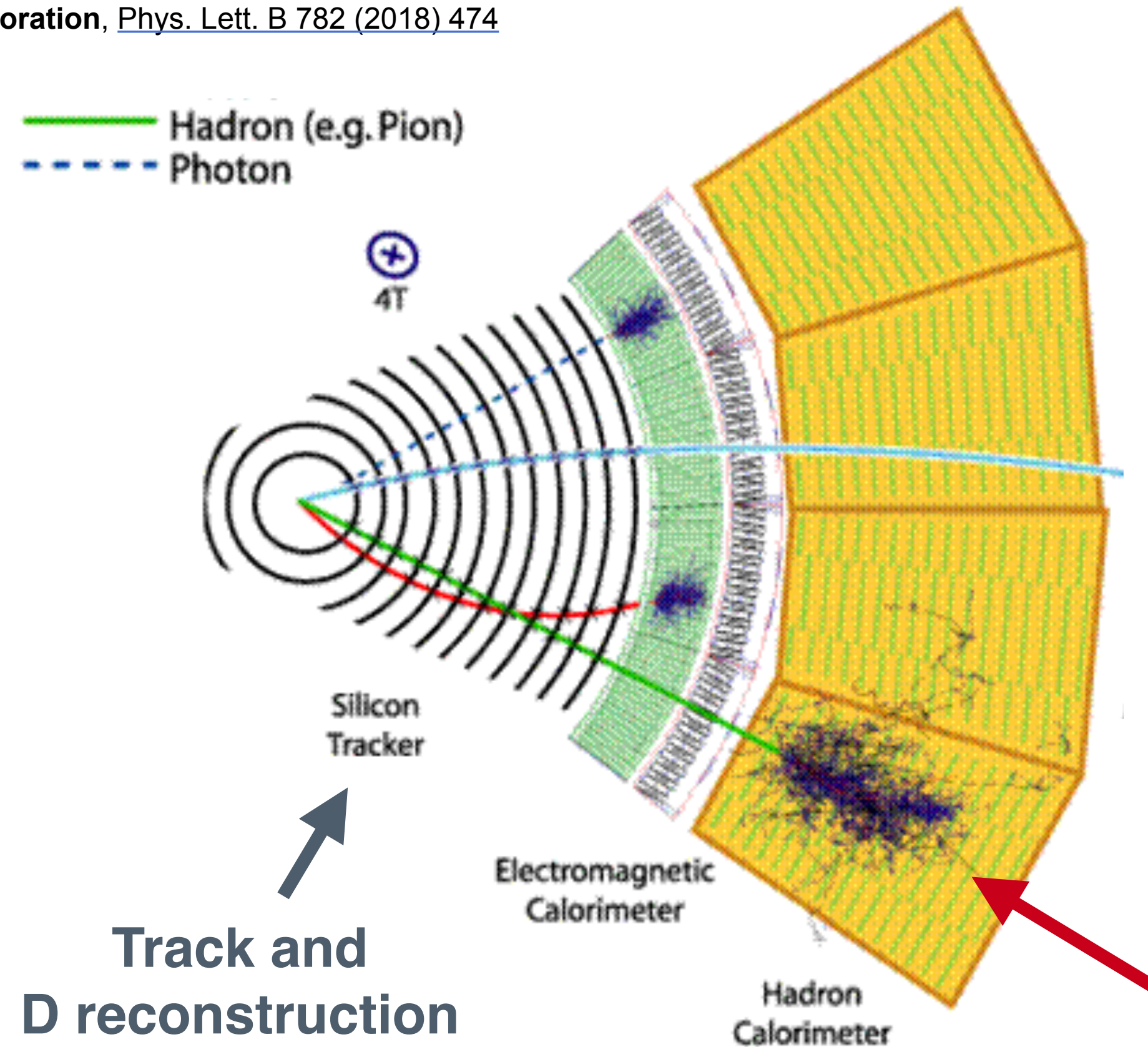


b-jet and D⁰ jet-based triggers in heavy-ion collisions

- **hardware triggers with jet-background subtraction**
 - upgrade of the Level-1 trigger system
- **“Online” HQ tagging using software (High-Level) triggers**

Online D^0 -triggers in PbPb collisions

CMS Collaboration, [Phys. Lett. B 782 \(2018\) 474](#)



First "Level-1" (hardware) background-subtracted jet triggers

↓
Track reconstruction
with optimized faster algorithms

↓
D-meson reconstruction

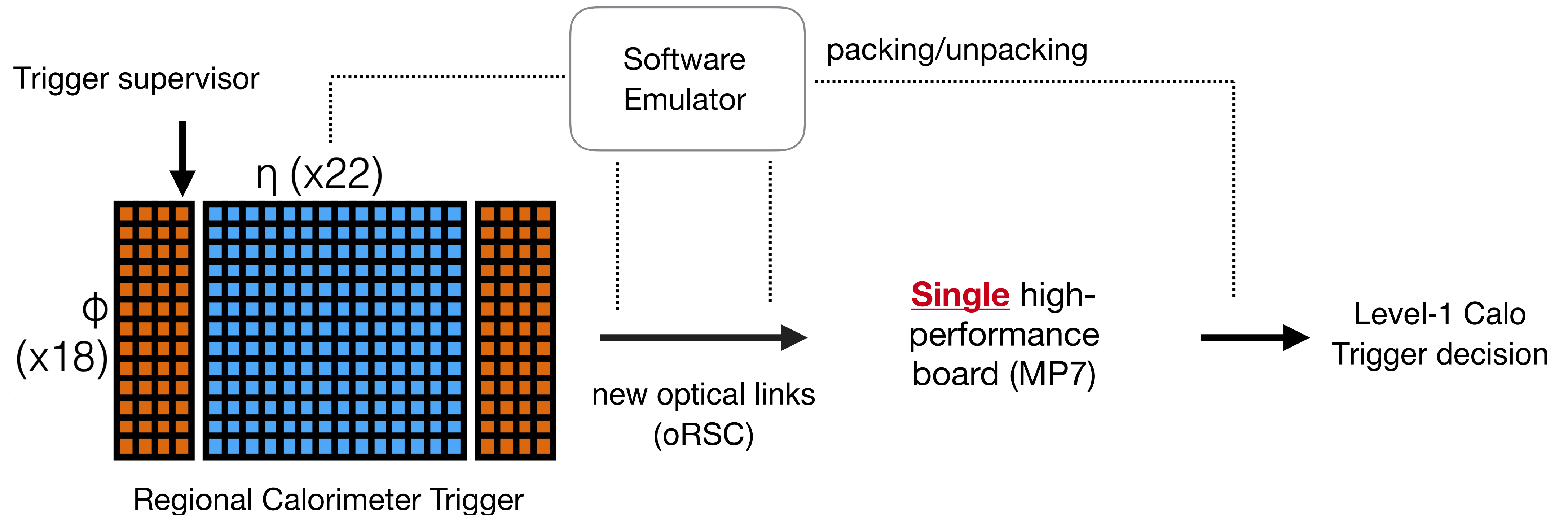
↓
D-meson selection
optimized for poor calibrations
and alignment

↓
Event acquired and stored!

→ high- p_T D^0 mesons of a factor about 100 in PbPb collisions

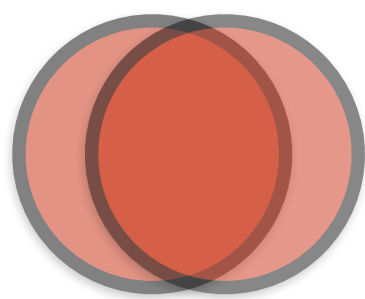
Level-1 calorimeter trigger upgrade for CMS (Stage 1)

→ A single board to process the entire calorimeter and **allow for complex algorithms (e.g. jet subtraction) at Level-1**



New insights into charm E_{loss}

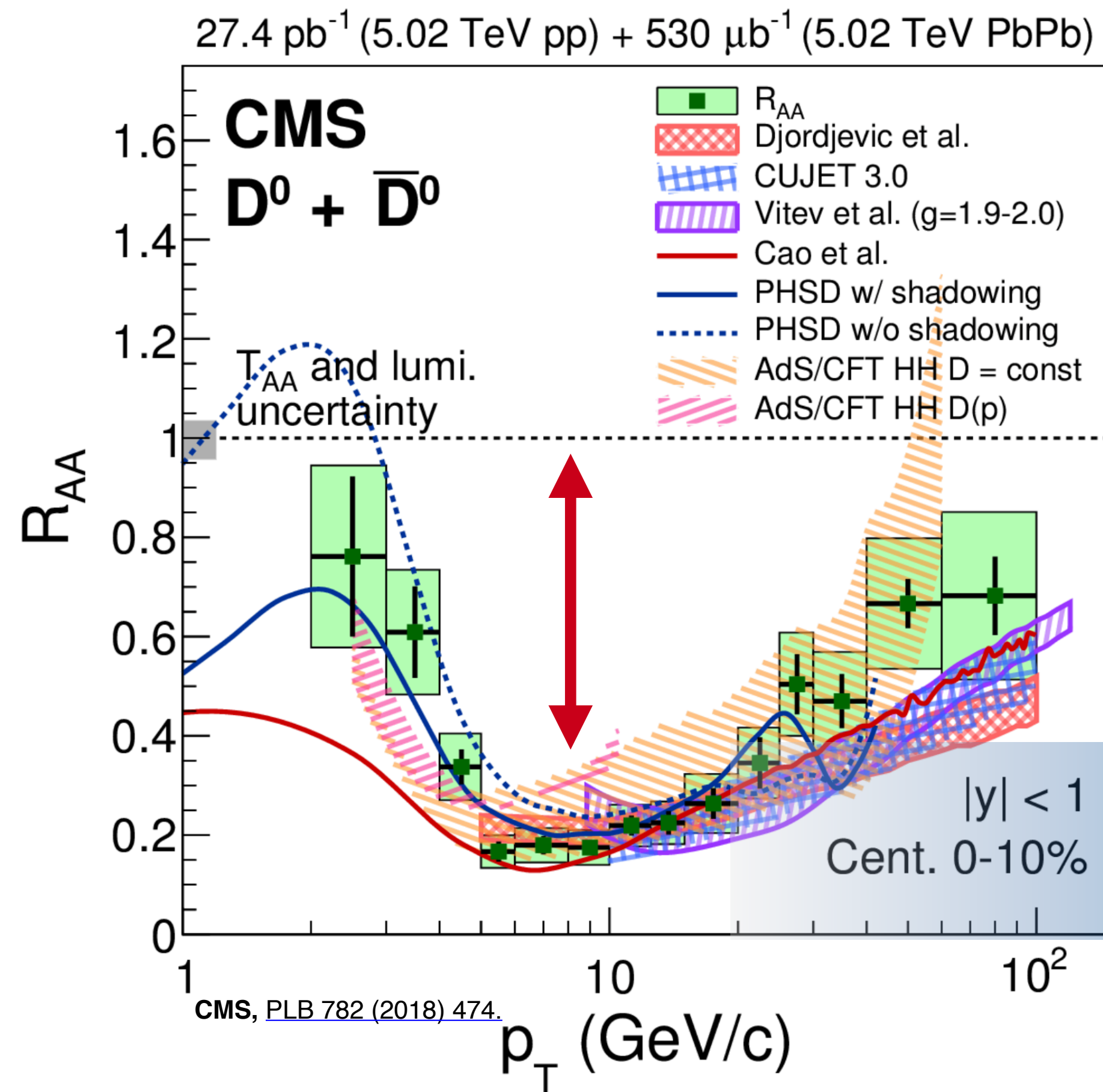
D^0 mesons



Central 0-10%

→ head-on collision!

→ larger energy density



$$R_{AA} = \frac{1}{N_{\text{coll}}} \frac{dN/dp_T(AA)}{dN/dp_T(pp)}$$

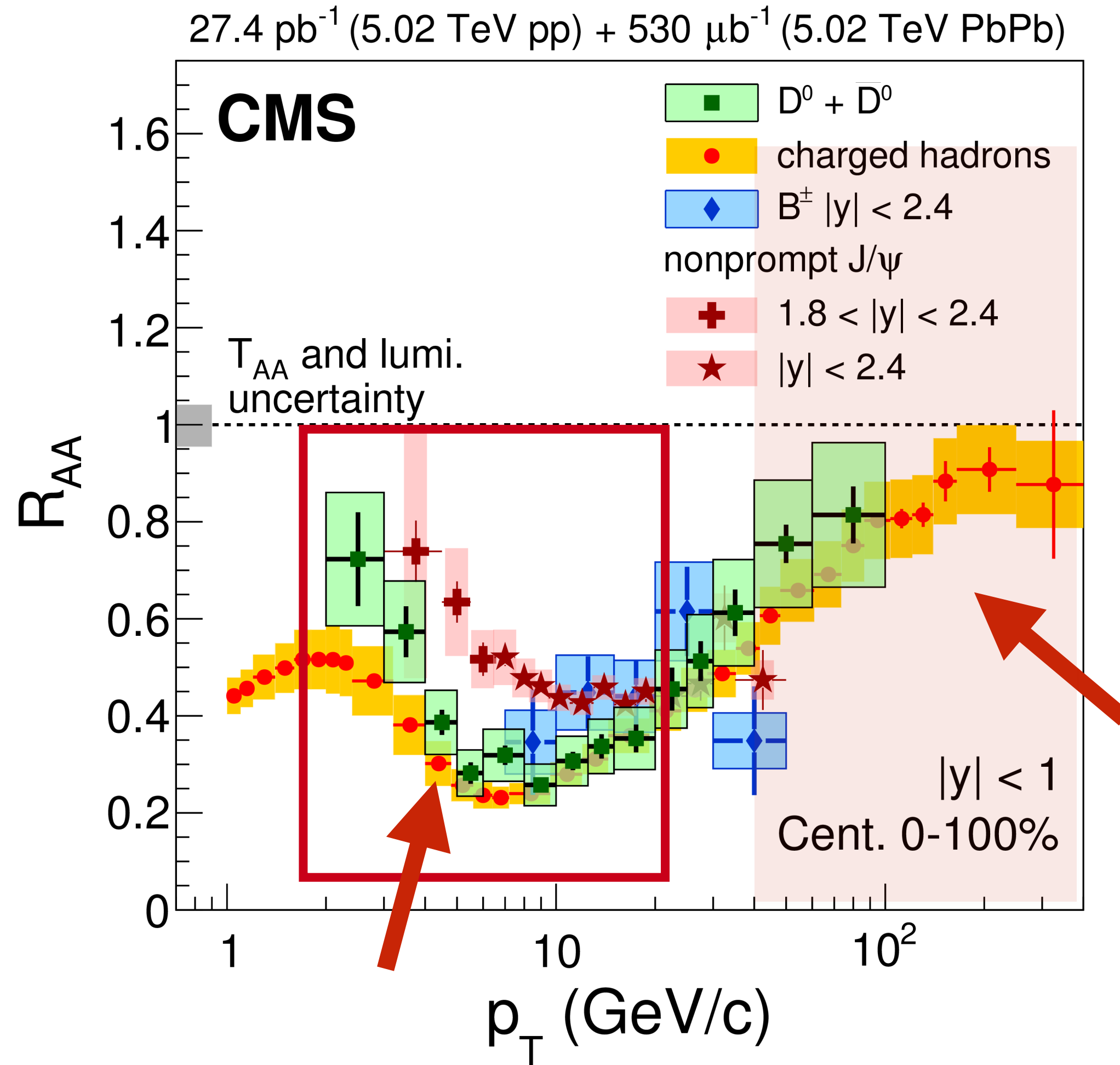
← $R_{AA}=1$: no modification

High- p_T region accessible with D^0 triggers!

$R_{AA} \ll 1$ → charm quarks strongly interact with the hot medium, and lose a sizeable amount of energy!

New constraints on flavor dependence of E_{loss}

$$R_{AA} = \frac{1}{N_{\text{coll}}} \frac{dN/dp_T(AA)}{dN/dp_T(pp)}$$



Charged hadrons

D⁰ mesons

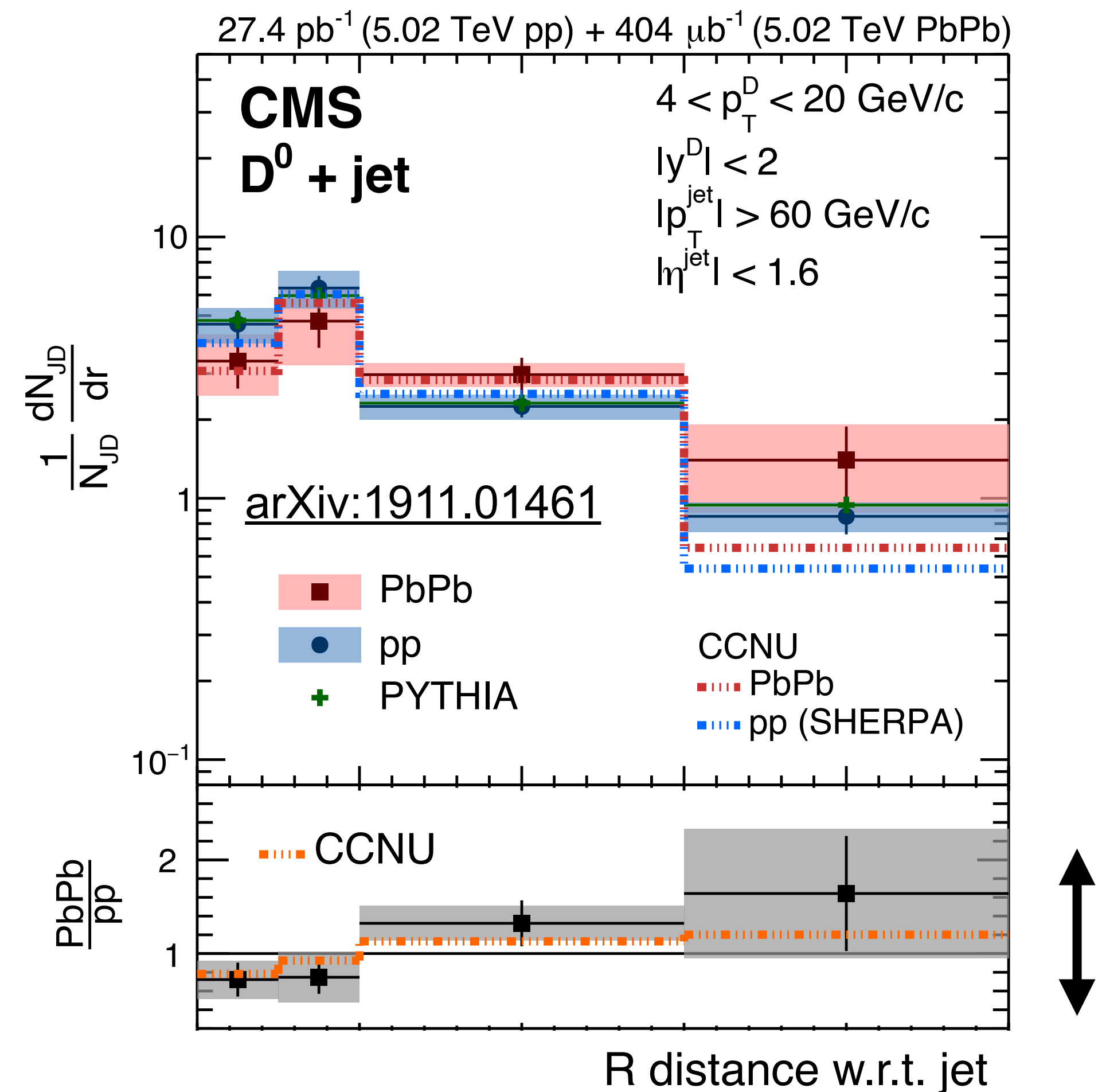
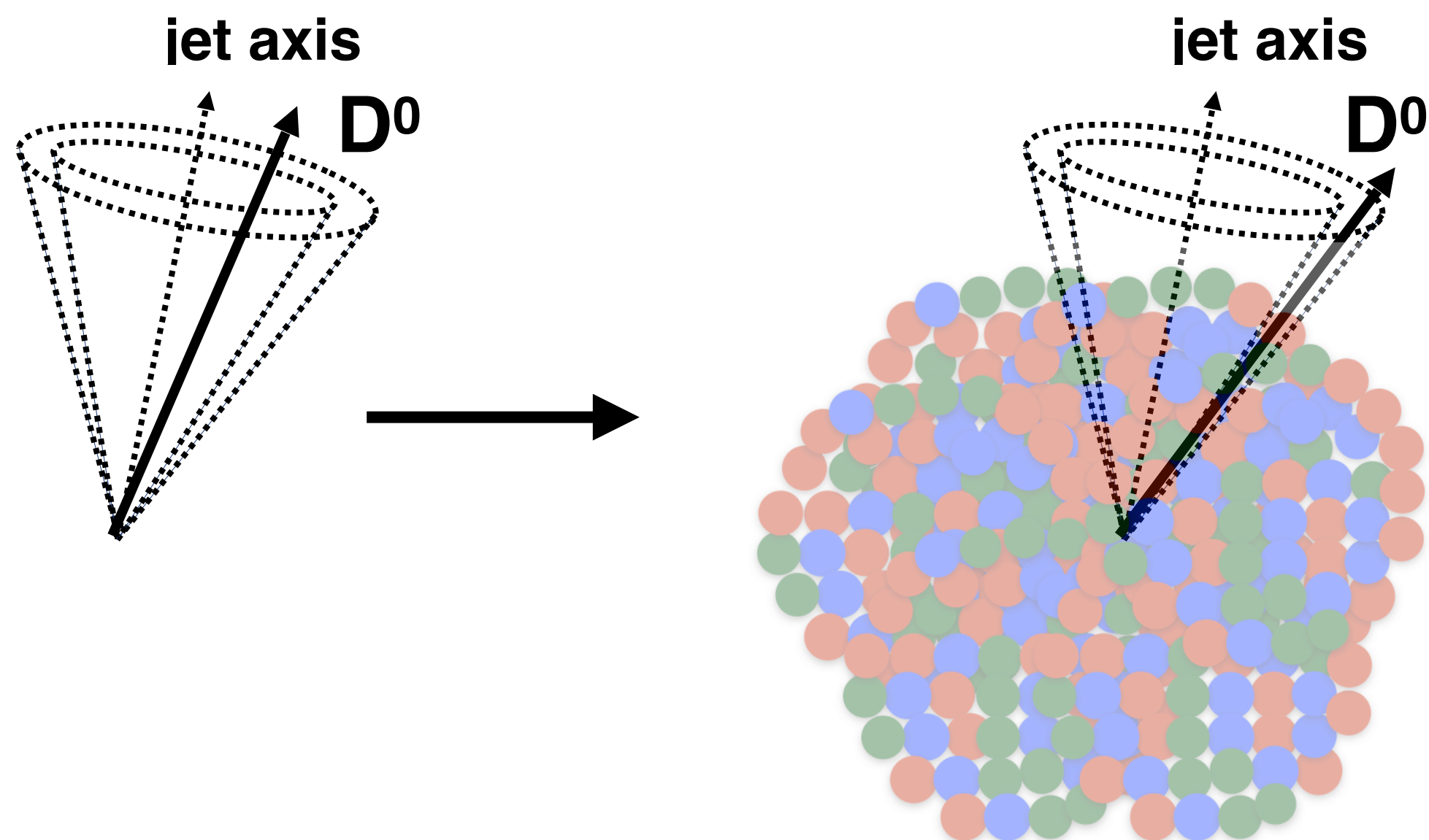
B⁺ mesons

b → J/ψ

vanishing mass-dependence at high-p_T
→ only possible with D⁰-triggers!

“Structure” of charm-jets in PbPb collisions

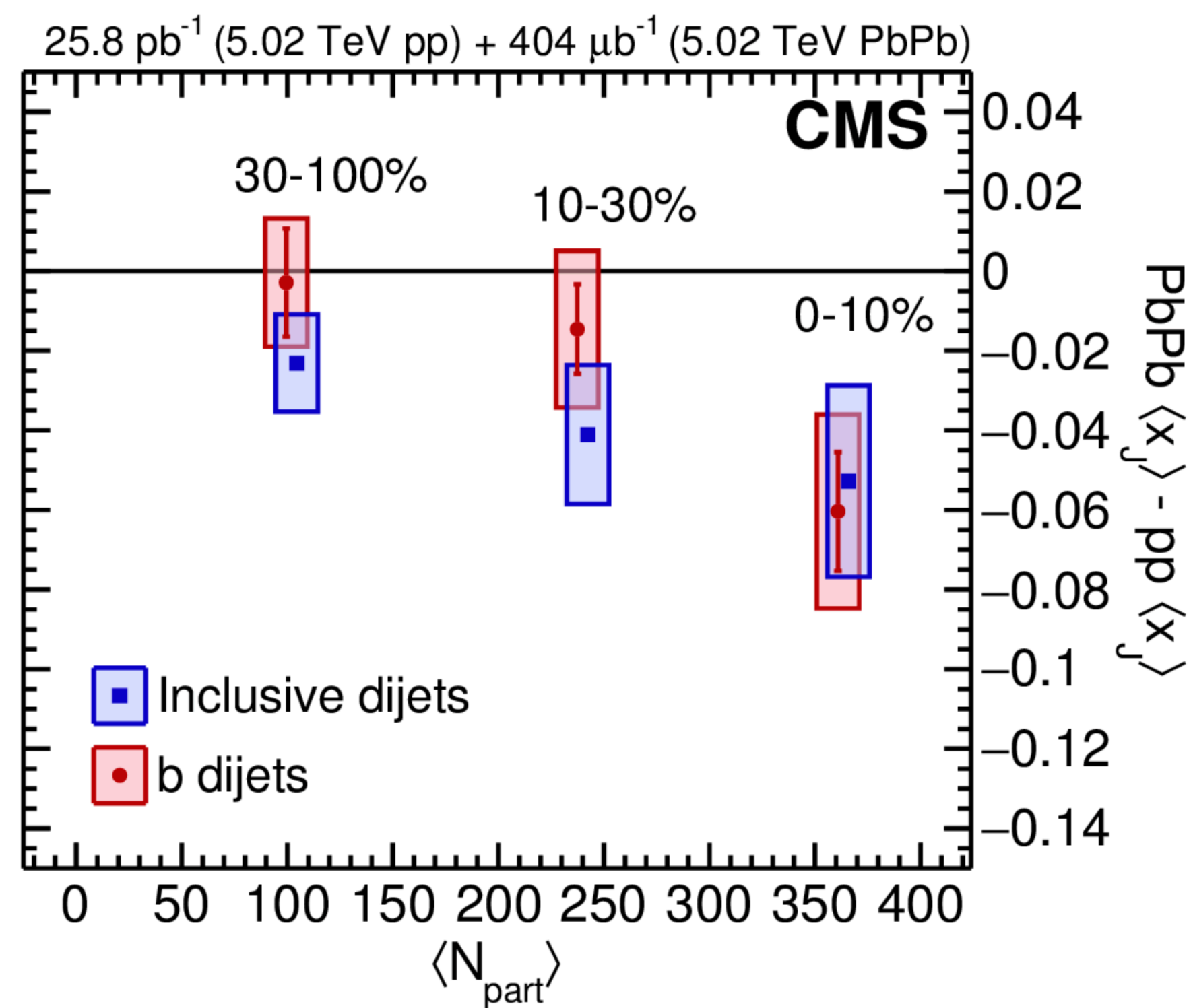
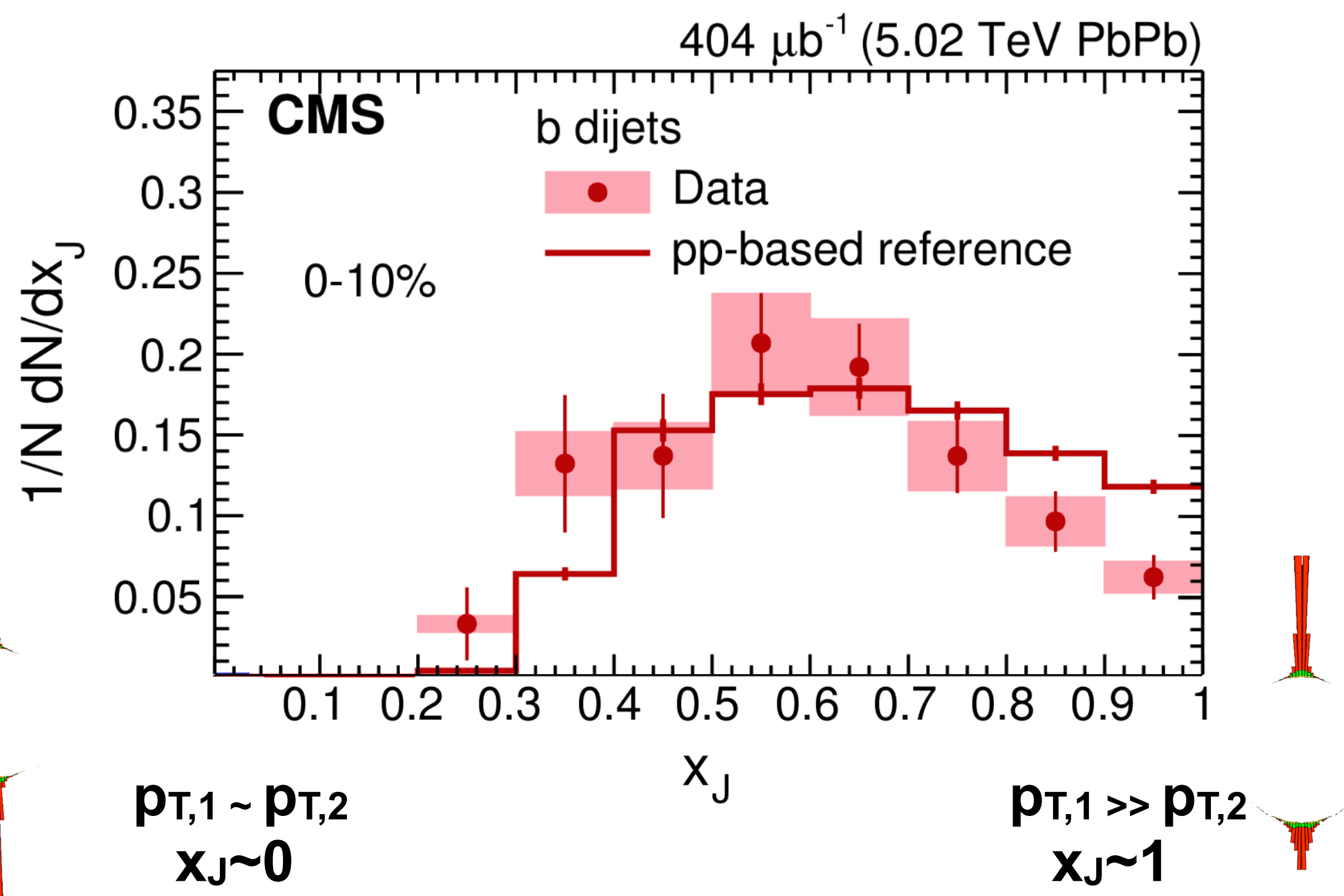
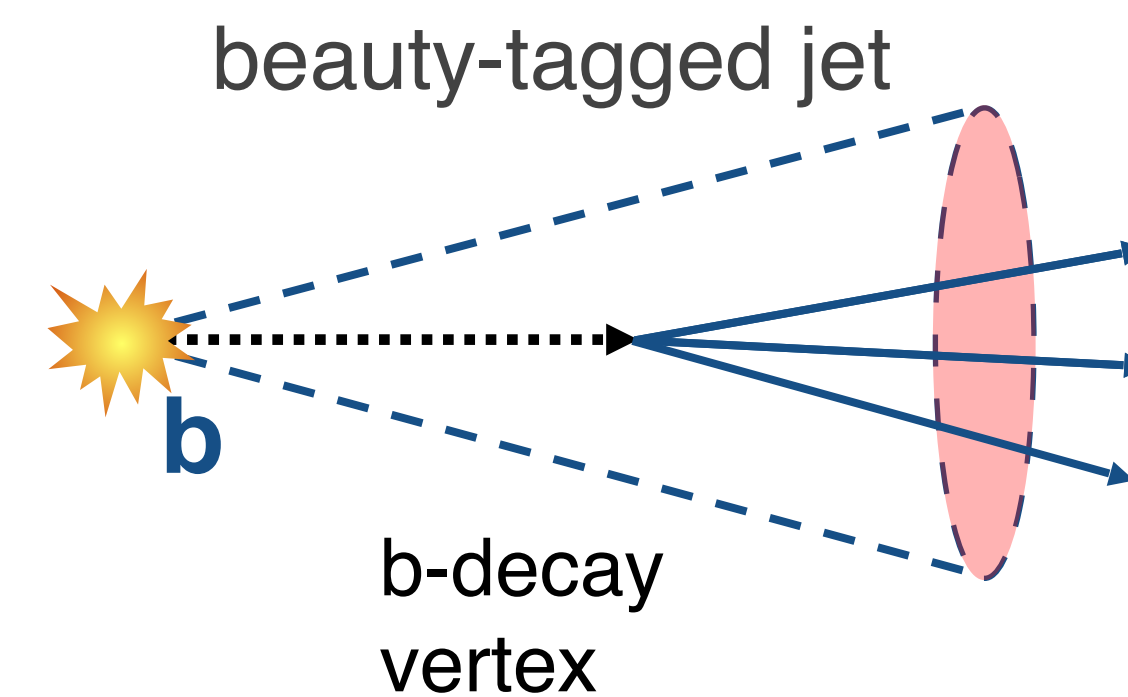
- Enabled studies of jets with heavy-flavour hadrons
- E.g. the radial distribution of D^0 inside a jet with respect to the jet axis



- Sensitive to mechanism of charm diffusion inside the QGP medium
- **First insights into the inner structure of HF jets**

- In PbPb D^0 “pushed” far from the jet cone
→ to be confirmed by future measurement

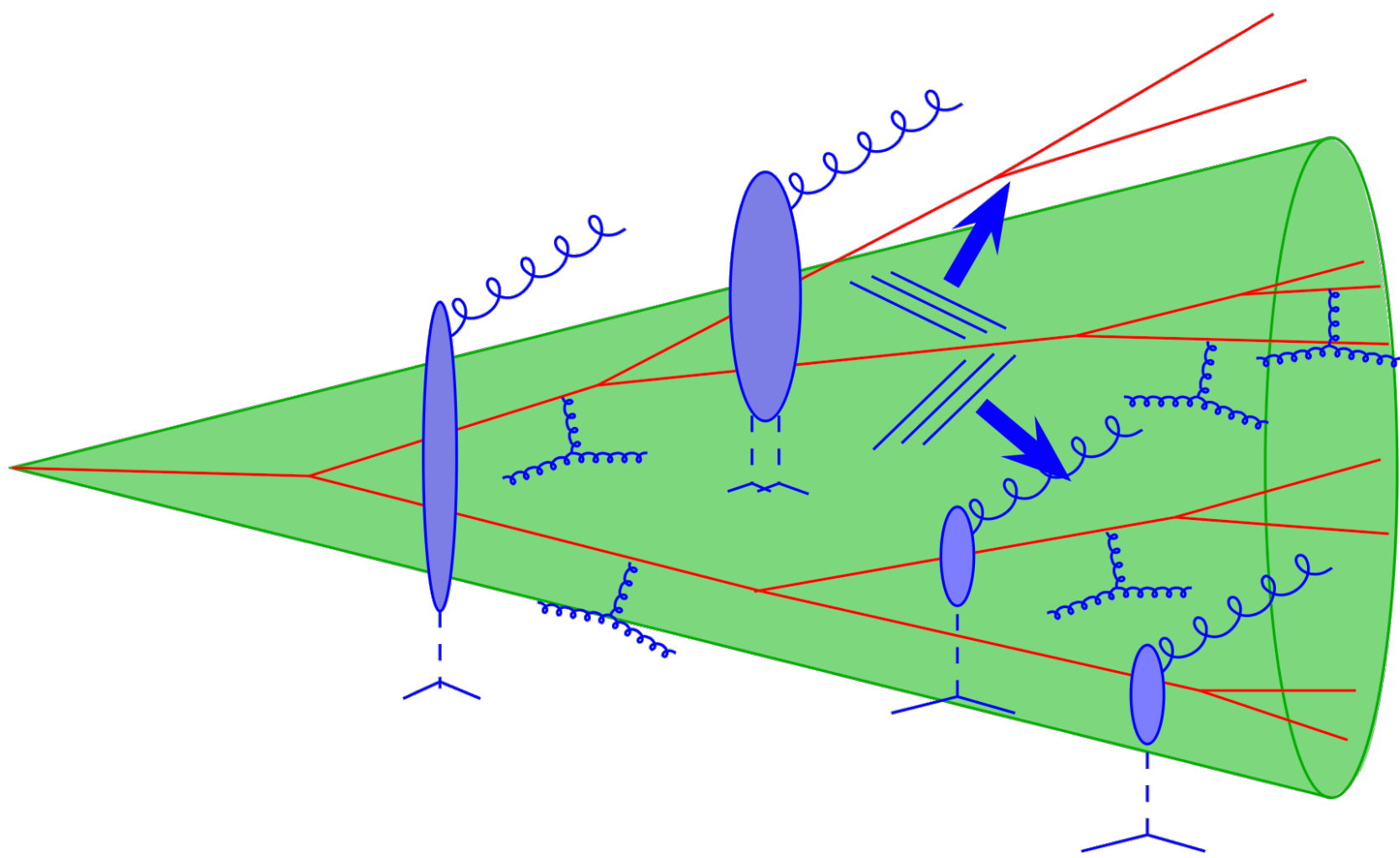
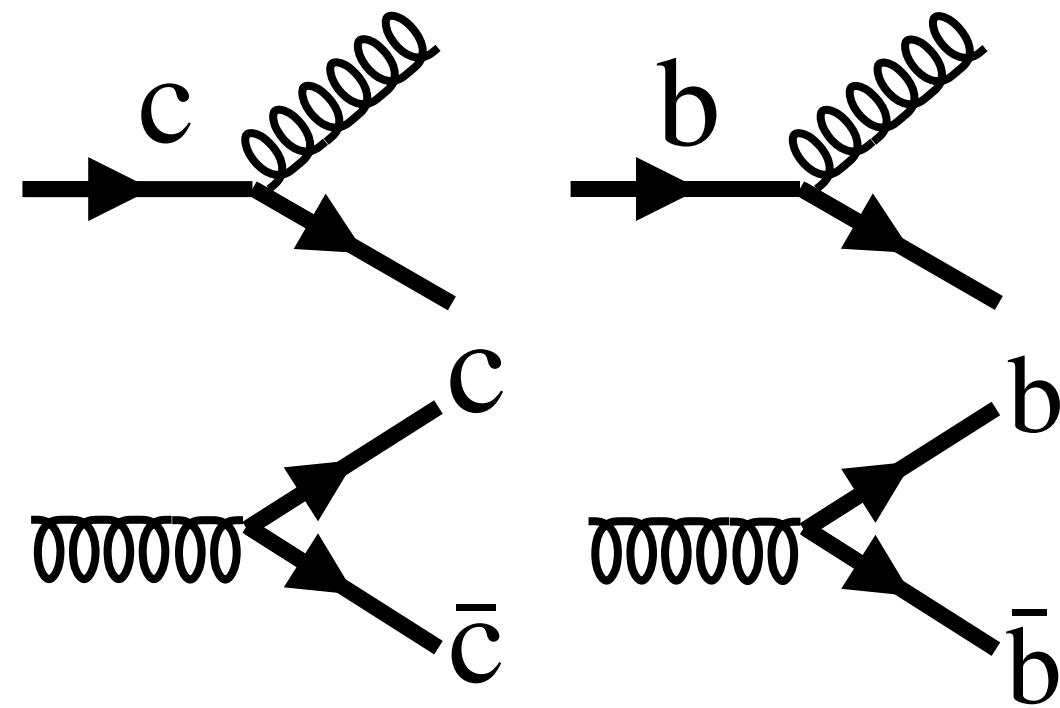
Transverse momentum balance of b jet pairs



b-jets show an increased p_T -asymmetry in PbPb
consistent with in-medium E_{loss}

Magnitude of the effect is similar for b jets and inclusive jets

Heavy-flavor jets: a new territory for heavy-ion physics

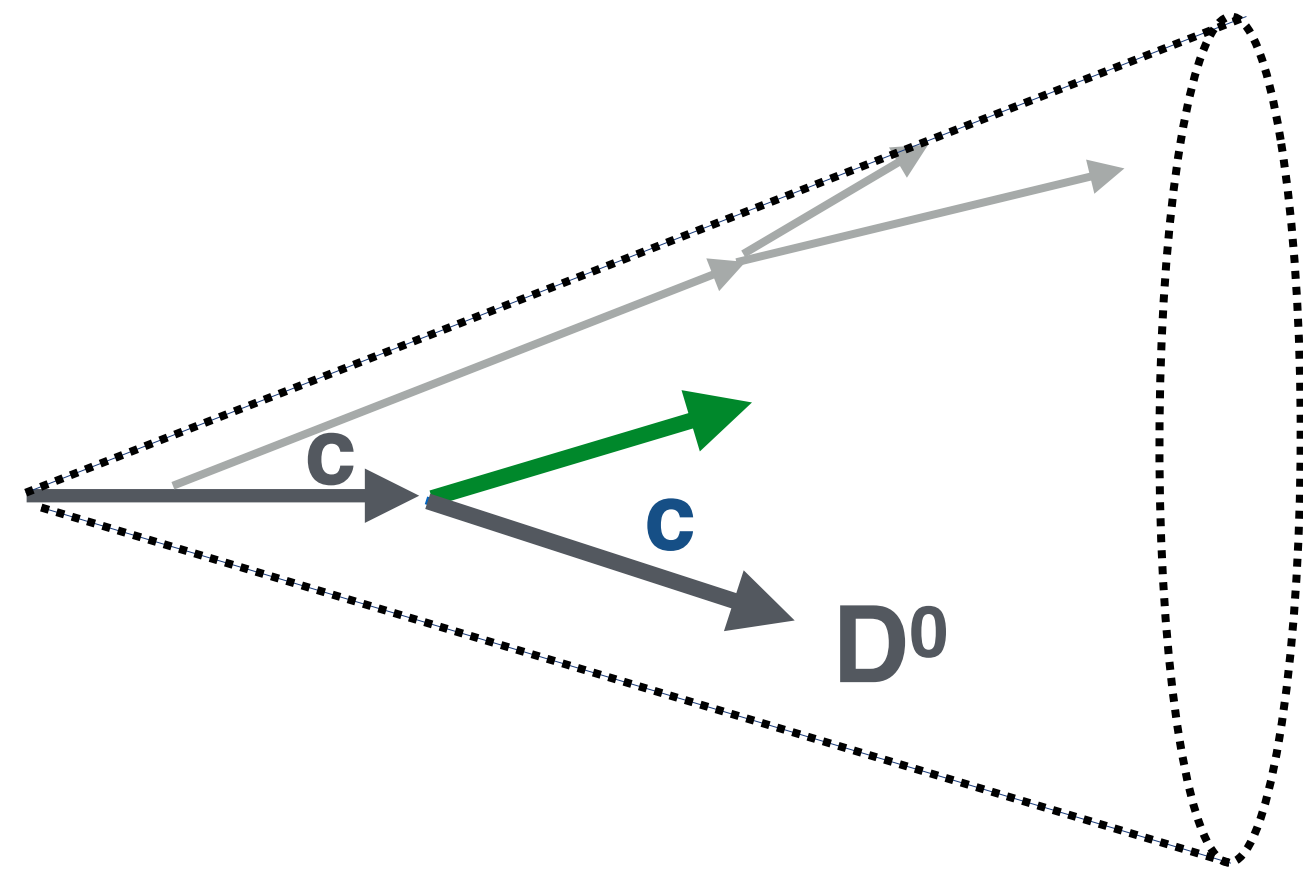


- Textbook-grade characterization of in-medium splitting functions?
- Time-space evolution of jet quenching?
- New tools for characterizing hadronization mechanisms?

Fully-reconstructed D^0 mesons as proxy for c quarks

Exploiting recent reclustering and “grooming” techniques

→ First study of the p_T -balance (z_g) of the first splitting of the c-quark



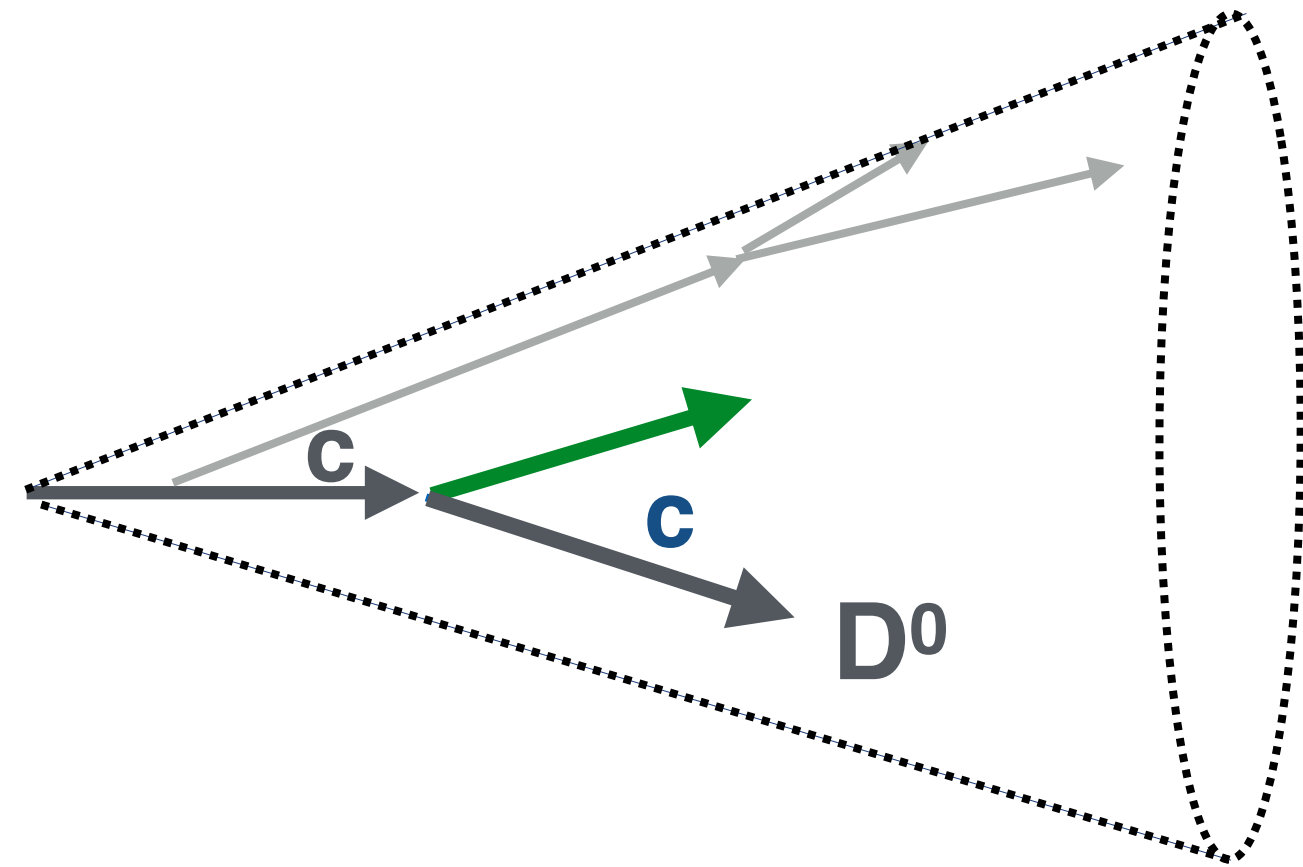
p_T balance
between prongs

$$z_g = \frac{p_{T,2}}{p_{T,1} + p_{T,2}}$$

First measurement of the $c \rightarrow cg$ splitting function in vacuum

Exploiting recent reclustering and “grooming” techniques

→ First study of the p_T -balance (z_g) of the first splitting of the c -quark



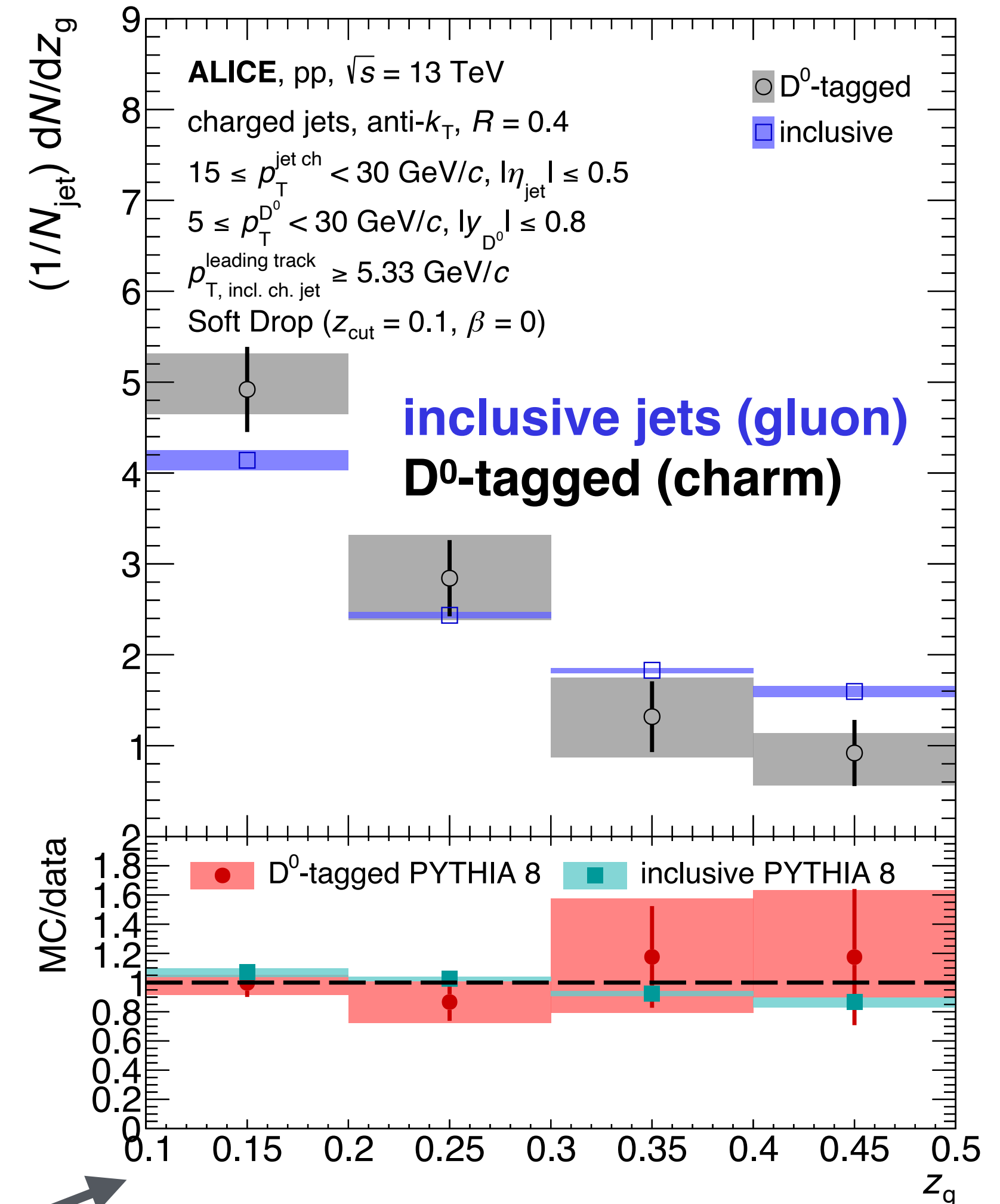
p_T balance
between prongs

$$z_g = \frac{p_{T,2}}{p_{T,1} + p_{T,2}}$$

→ fewer “ p_T ”-symmetric splittings for c -quarks than gluons
as expected in the presence of dead-cone effect

**First constraints on the $c \rightarrow cg$ splitting function in pp collisions
and benchmark for future heavy-ion measurements**

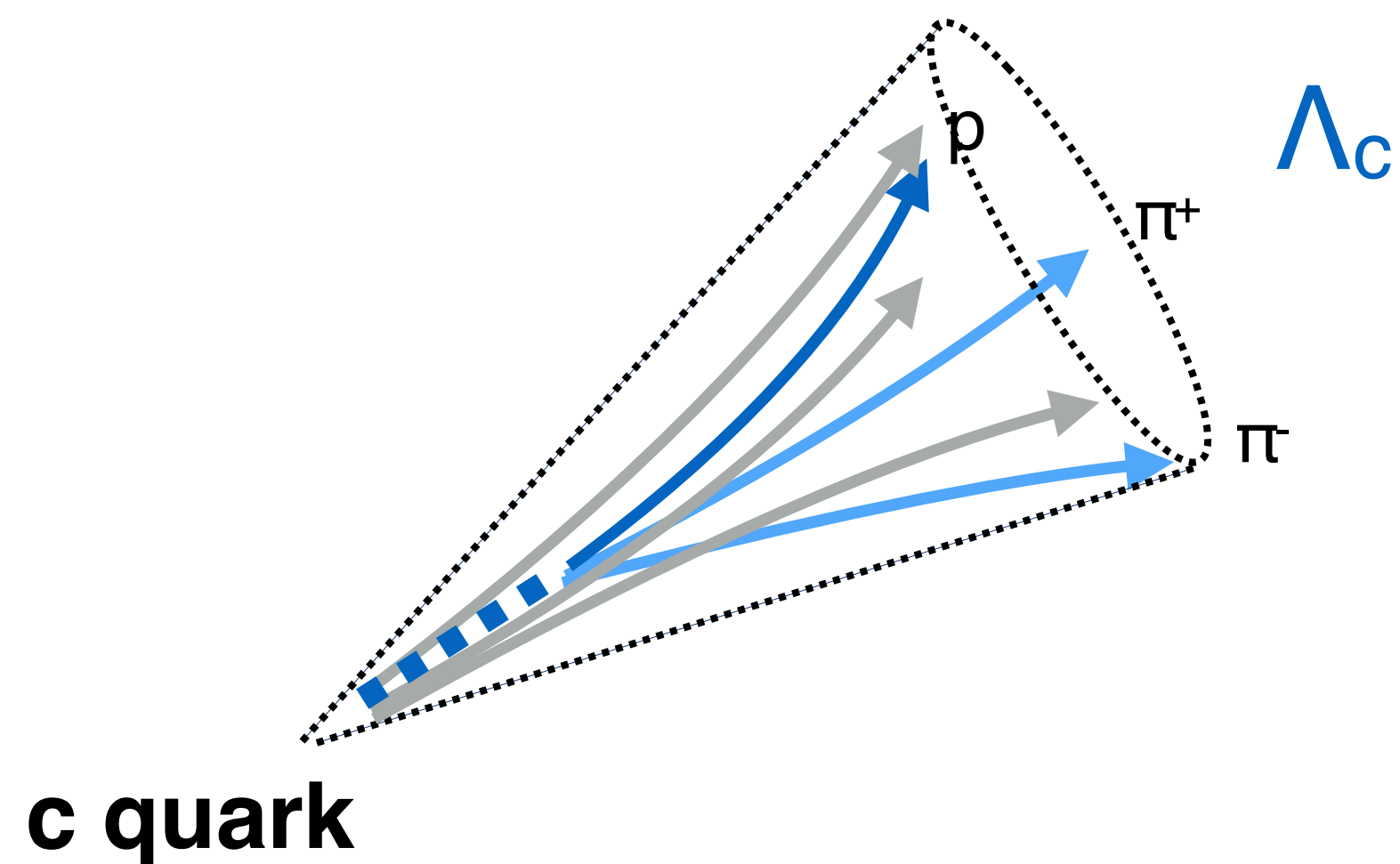
P. Ilten, N. L. Rodd, J. Thaler, M. Williams, *Phys. Rev. D* 96, 054019 (2017)
L. Cunqueiro, M. Ploskon, *Phys. Rev. D* 99, 074027 (2019)



ALICE, arXiv:2208.04857, accepted by PRL

Searches for “new” hadronization in pp collisions with HF jets

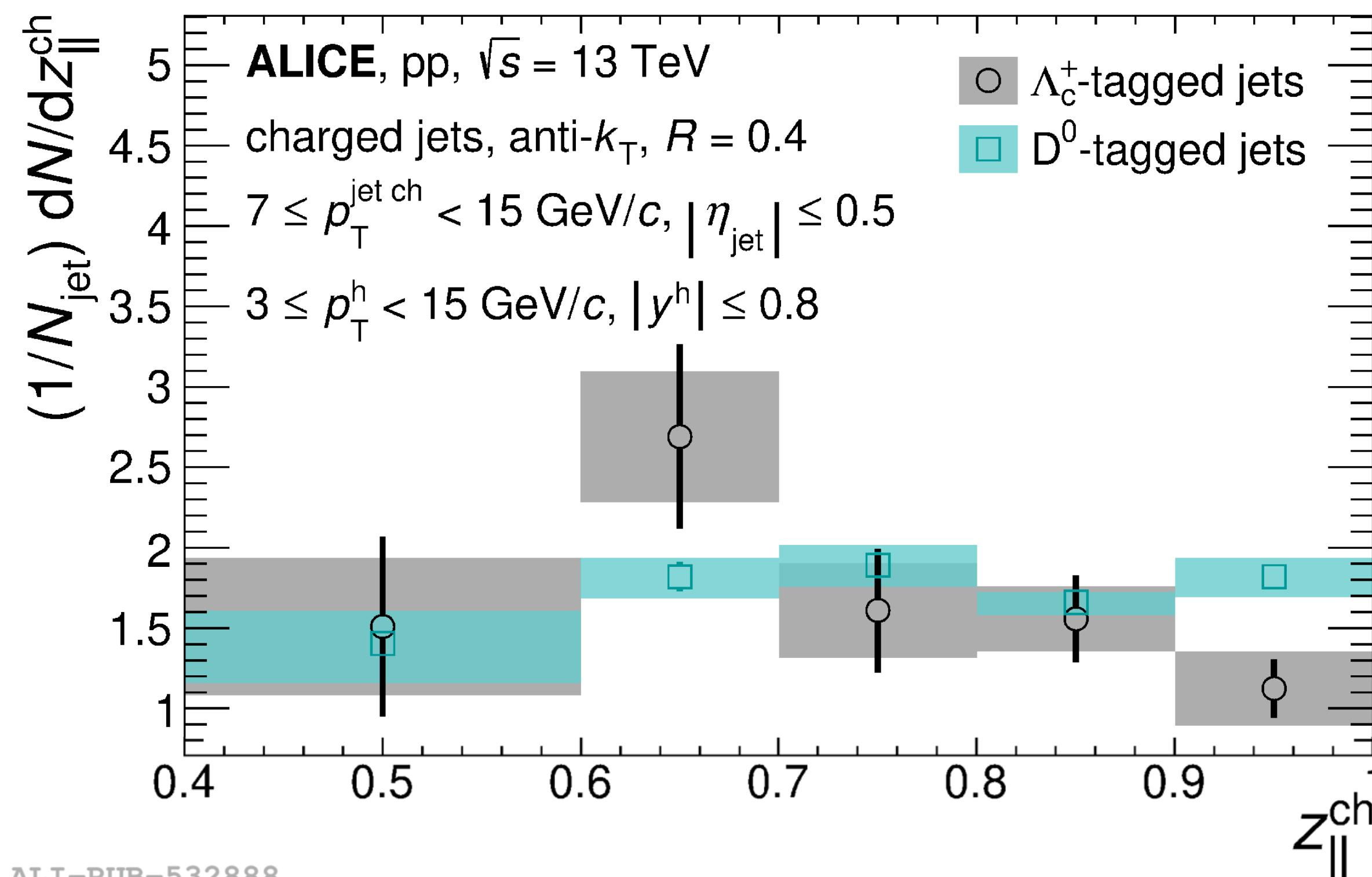
Longitudinal momentum fraction carried by the Λ_c



→ Hint of softer fragmentation for Λ_c (baryon) w.r.t. D^0 (meson)

→ **Not consistent with in-vacuum fragmentation**

ALICE collaboration, [arXiv.2301.13798](https://arxiv.org/abs/2301.13798)



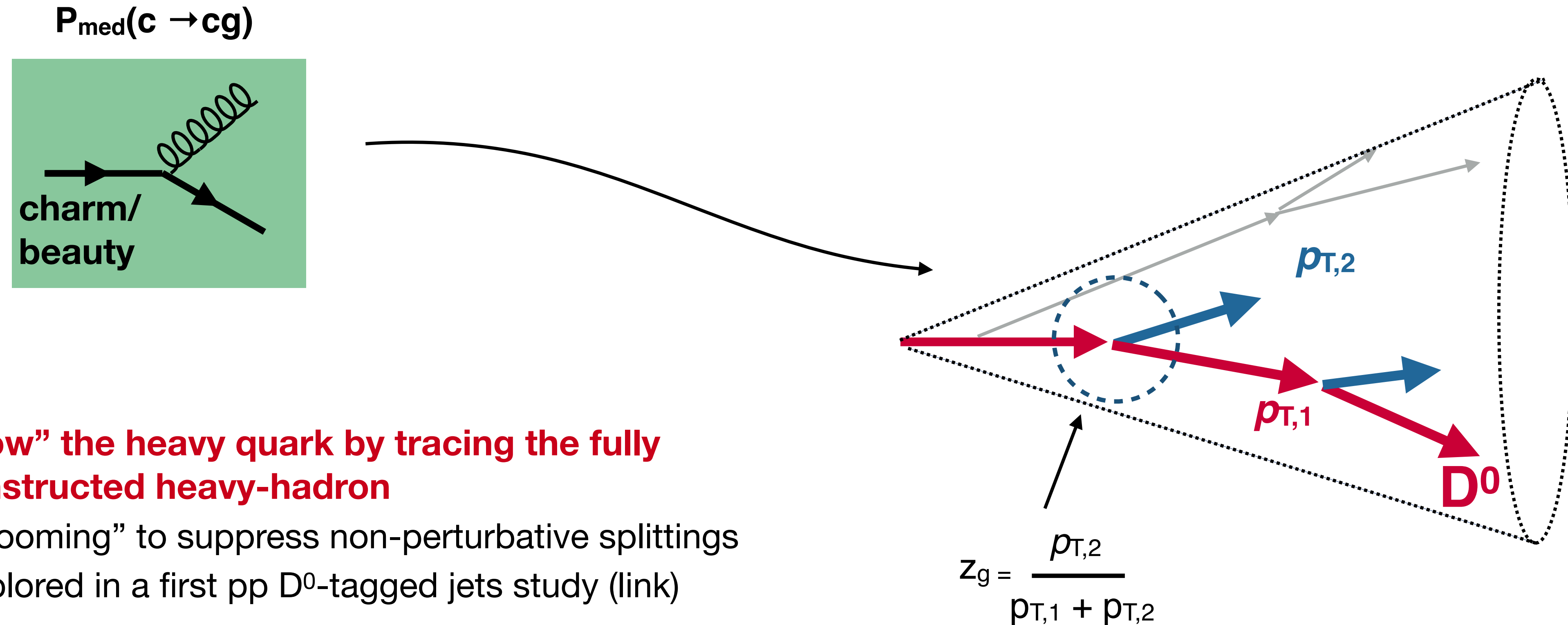
ALI-PUB-532888

Hadronization universality is broken already in pp!

$$\sigma(pp \rightarrow H_Q X) = \text{PDF} \otimes \sigma(\text{pQCD}) \otimes \mathbf{D^{\text{vacuum}}(z, Q^2)}$$

$$z_{\parallel}^{\text{ch}} = \frac{p^{\text{jet ch}} \cdot p^{\text{HF}}}{p^{\text{jet ch}} \cdot p^{\text{jet ch}}}$$

Future: characterization of $c \rightarrow cg$ splittings in the medium



“Follow” the heavy quark by tracing the fully reconstructed heavy-hadron

- “grooming” to suppress non-perturbative splittings
- explored in a first pp D^0 -tagged jets study ([link](#))

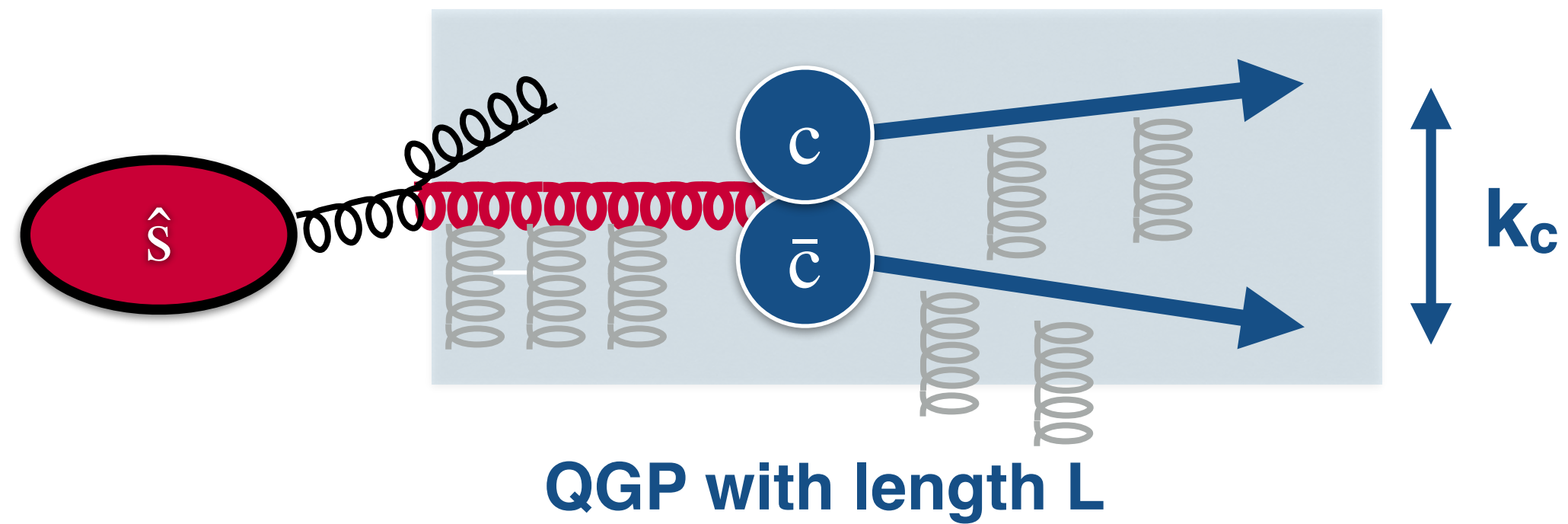
Measurements of z_g (and other substructure variables) for D^0 tagged, B^+ tagged jets in pp and heavy-ions:

→ First direct constraints on $P_{\text{med}}(c \rightarrow cg)$ and $P_{\text{med}}(b \rightarrow bg)$

Future: “Boosted” $g \rightarrow c\bar{c}$: a new probe for quenching studies

Only heavy quarks \rightarrow **fully traceable, stronger theoretical control**
 \rightarrow **Boosted** (time-delayed) \rightarrow **splitting occurs in the medium**

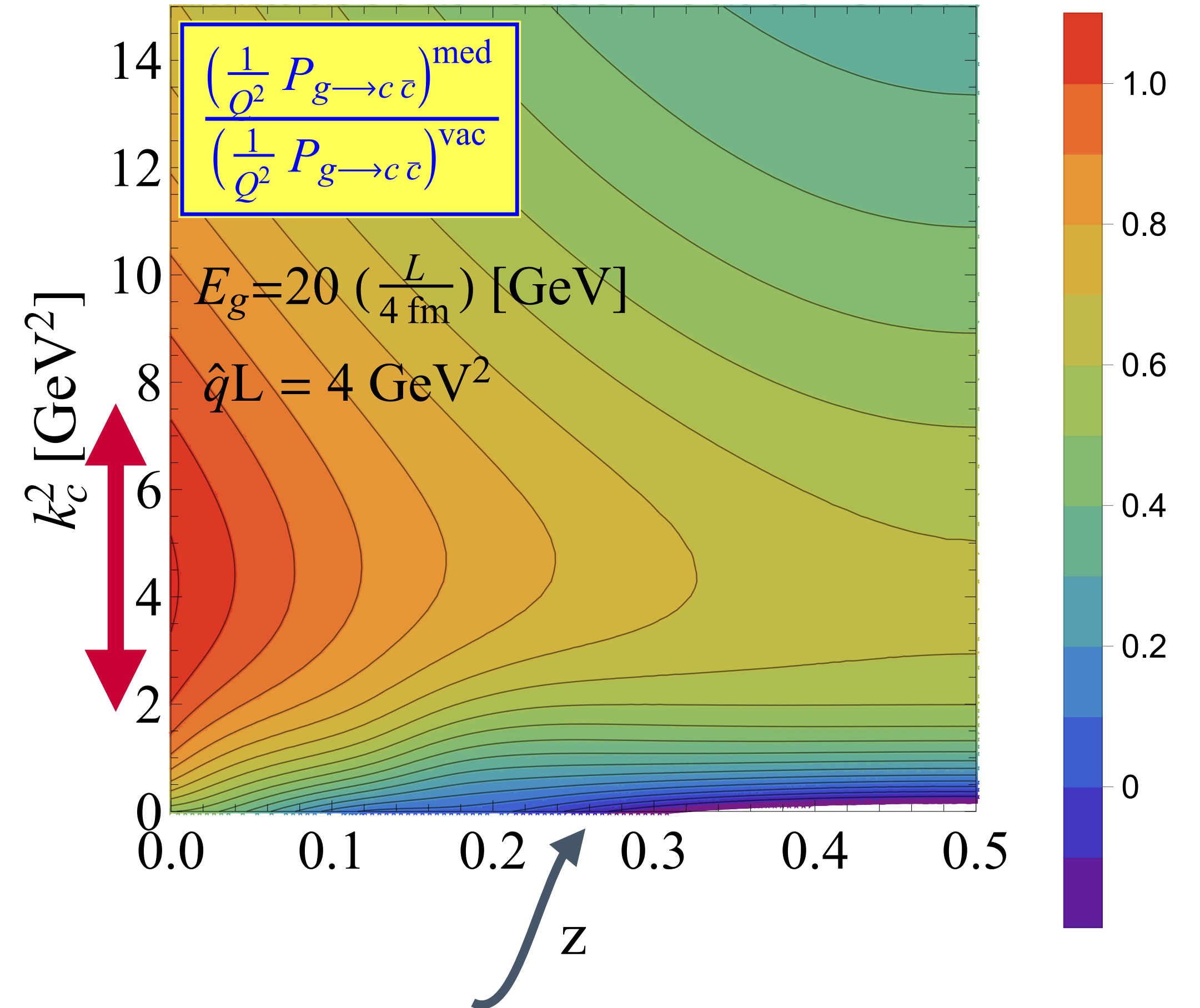
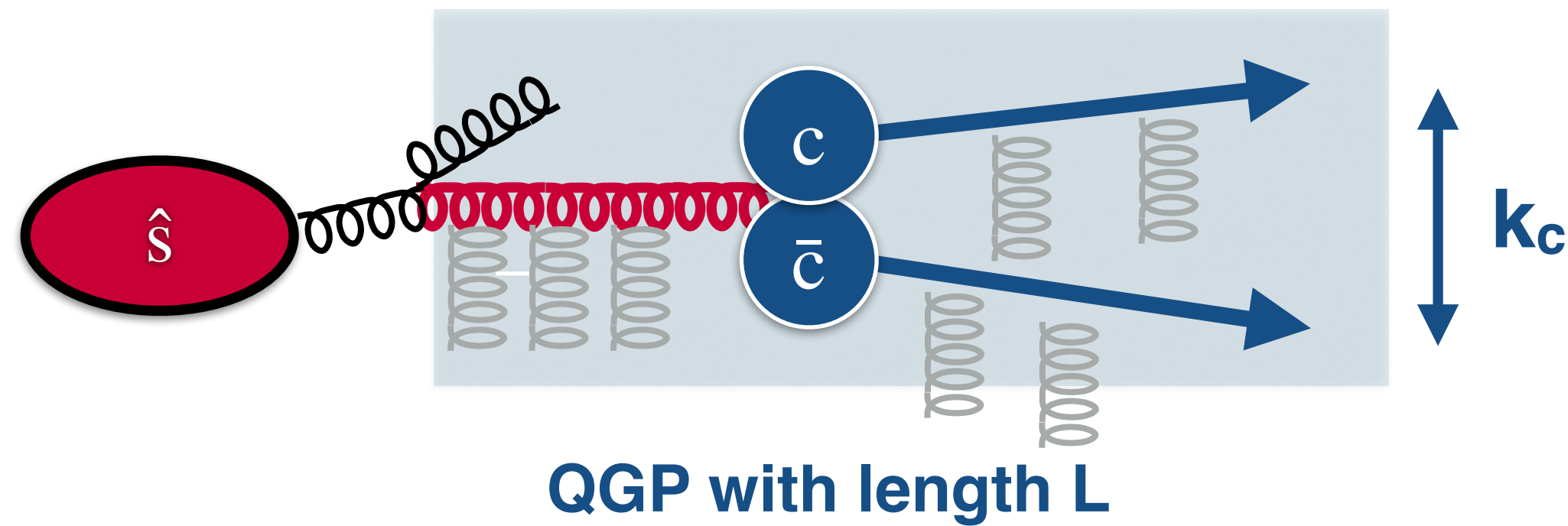
$$\tau_{g \rightarrow c\bar{c}}^{\text{lab}} \sim \frac{1}{Q} \frac{E_g}{Q} = \frac{E_g}{Q^2}$$



\rightarrow developed with the CERN theory group led by Dr. Urs Wiedemann

“Boosted” $g \rightarrow c\bar{c}$: a new probe for quenching studies

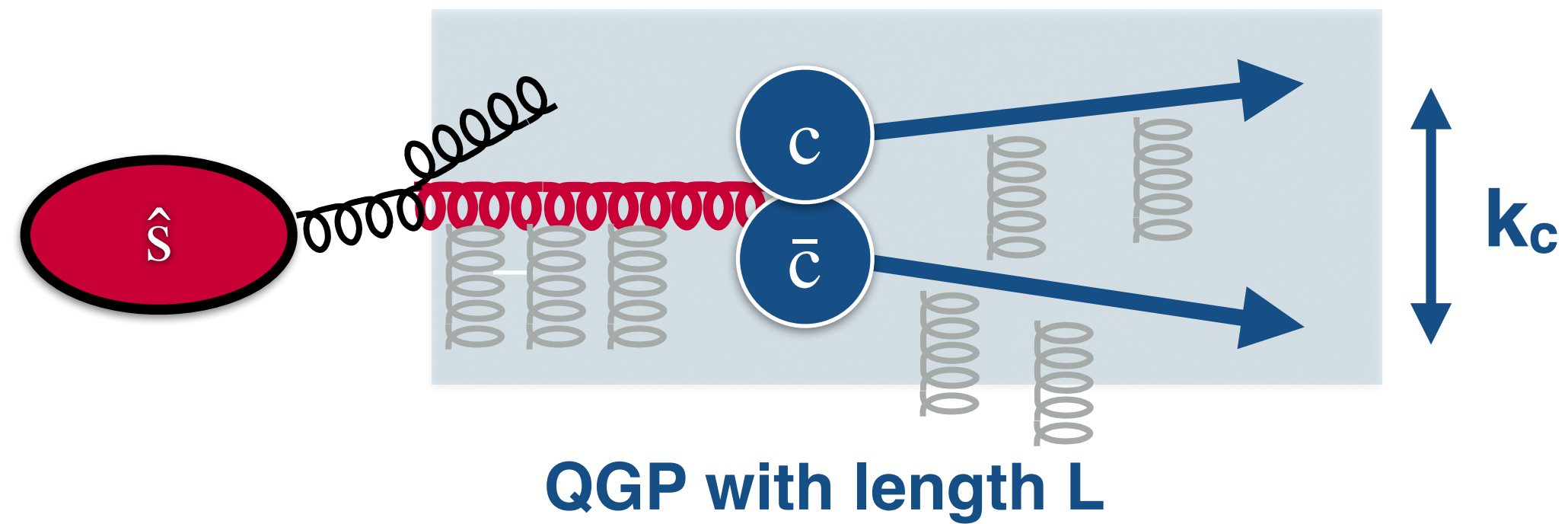
→ pQCD formalism (BDMPS-Z) to calculate $P_{g \rightarrow c\bar{c}}^{\text{med}}$



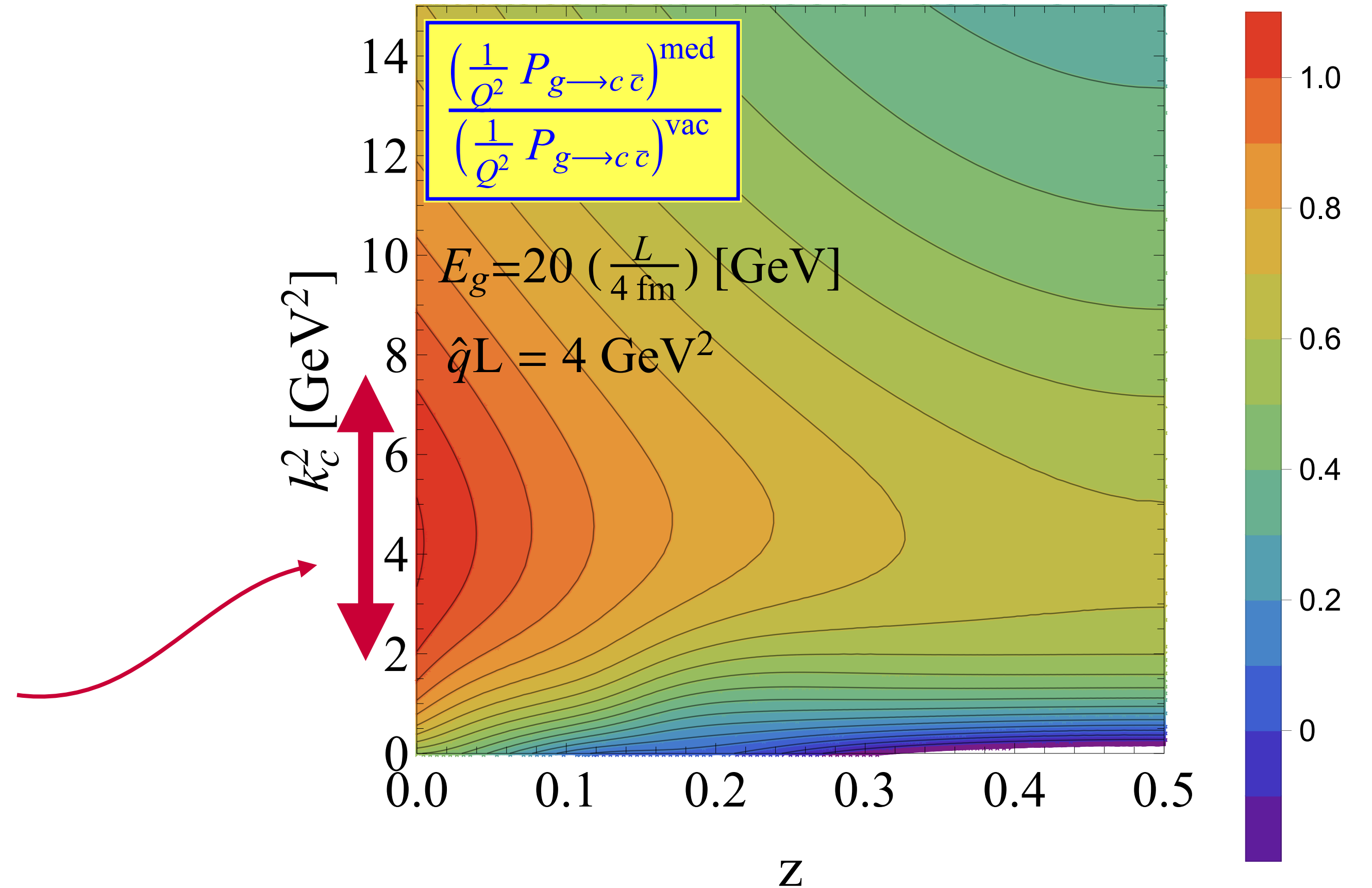
k_c^2 increases due to transverse momentum broadening on the individual quarks

“Boosted” $g \rightarrow c\bar{c}$: a new probe for quenching studies

→ pQCD formalism (BDMPS-Z) to calculate $P_{g \rightarrow c\bar{c}}^{\text{med}}$



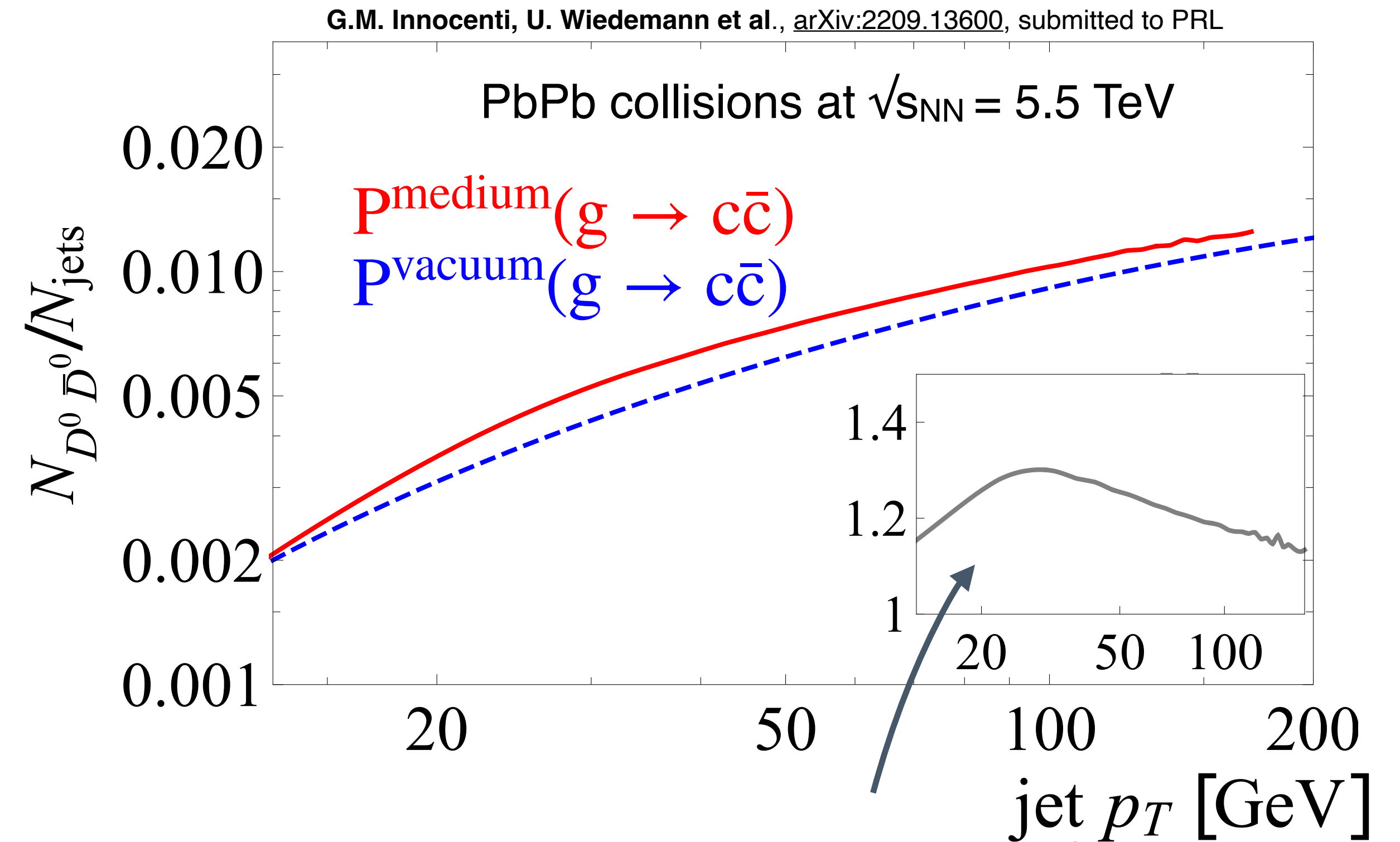
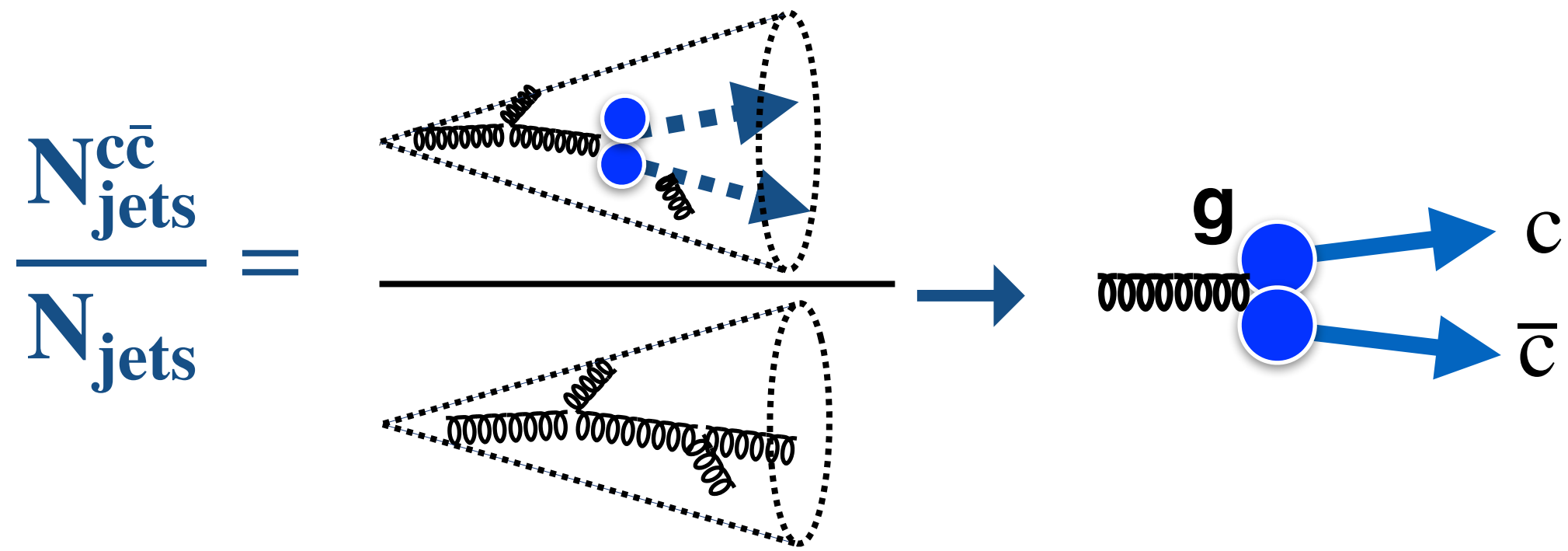
Net enhancement of $g \rightarrow c\bar{c}$ splittings:
 → Gluons that would not split in the vacuum, can split due to the interaction with the QGP



Toward measurements of $g \rightarrow c\bar{c}$ enhancement in HI collisions

Experimental strategy:

- $c\bar{c}$ -tagged jets \rightarrow almost pure source of $g \rightarrow c\bar{c}$
- $N_{\text{jets}}^{c\bar{c}}/N_{\text{jets}} \propto P_{g \rightarrow c\bar{c}}^{\text{med}}$

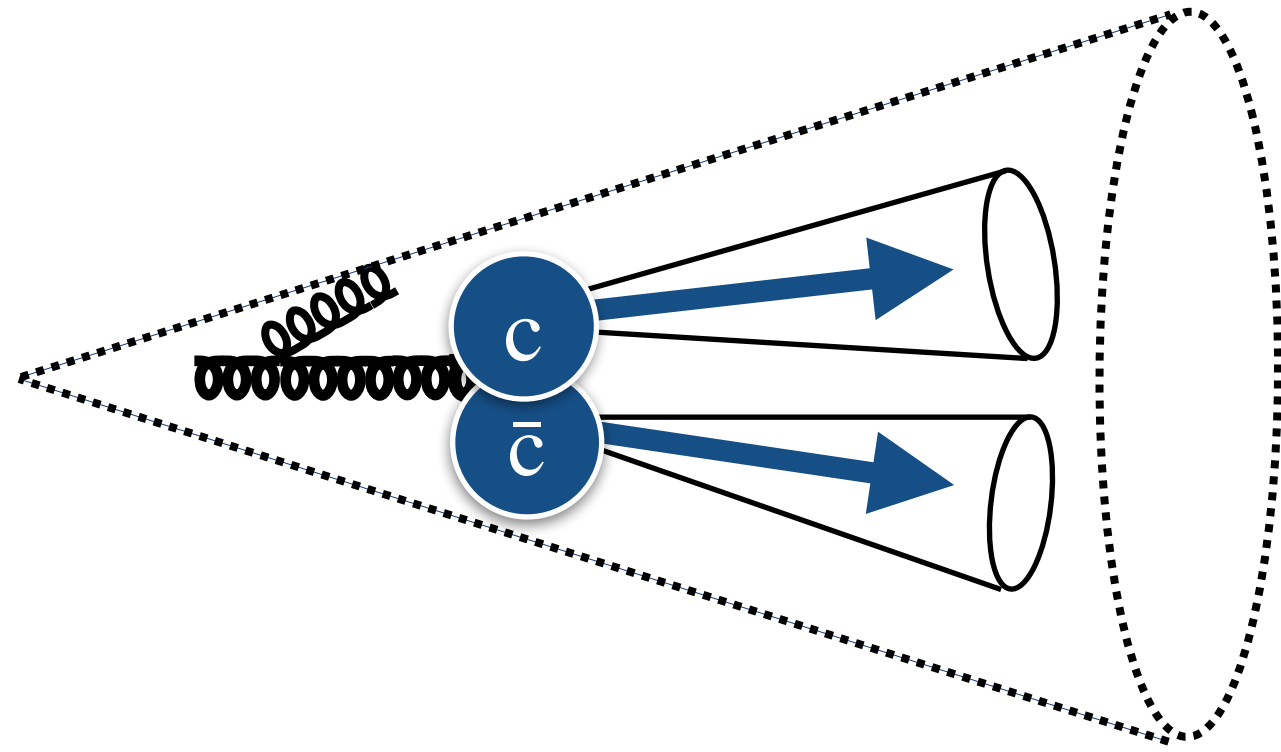


Up to **~30% increase** as a consequence of modified $g \rightarrow c\bar{c}$ splitting function

Measurements of $N_{\text{jets}}^{c\bar{c}}/N_{\text{jets}}$ in PbPb/AuAu and pp collisions:

\rightarrow by observing this new signature, **a crucial test for our theoretical understanding of jet quenching**

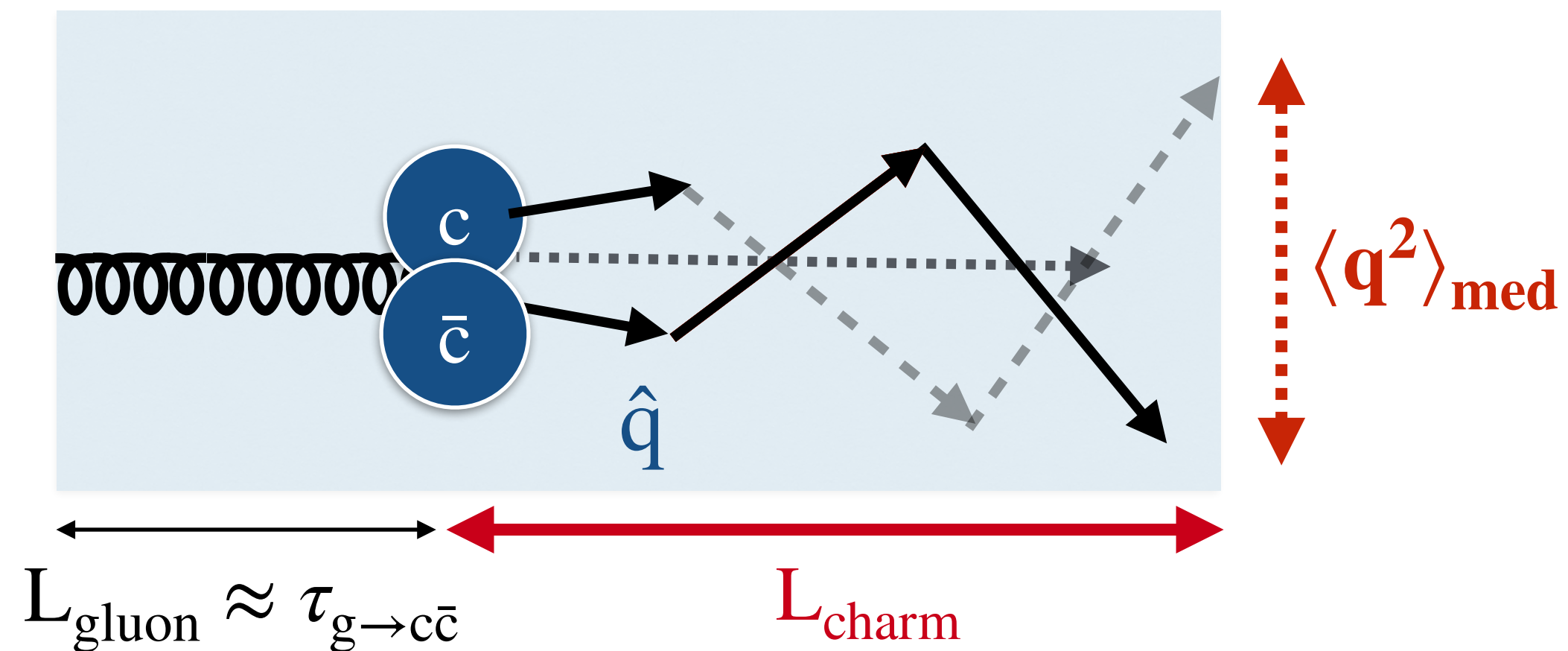
More differential studies of the $g \rightarrow c\bar{c}$ and $g \rightarrow b\bar{b}$ splittings



Measurements of the substructure properties of the two HQ-tagged subjects in pp, PbPb, and AuAu:

→ characterization of $P_{g \rightarrow c\bar{c}}^{\text{medium}}$ and $P_{g \rightarrow b\bar{b}}^{\text{medium}}$

QGP length L



Using gluon formation time as a time/space ruler:

→ test the predicted $\langle k_{\text{T}}^2 \rangle$ broadening of high- p_{T} partons in the hot medium

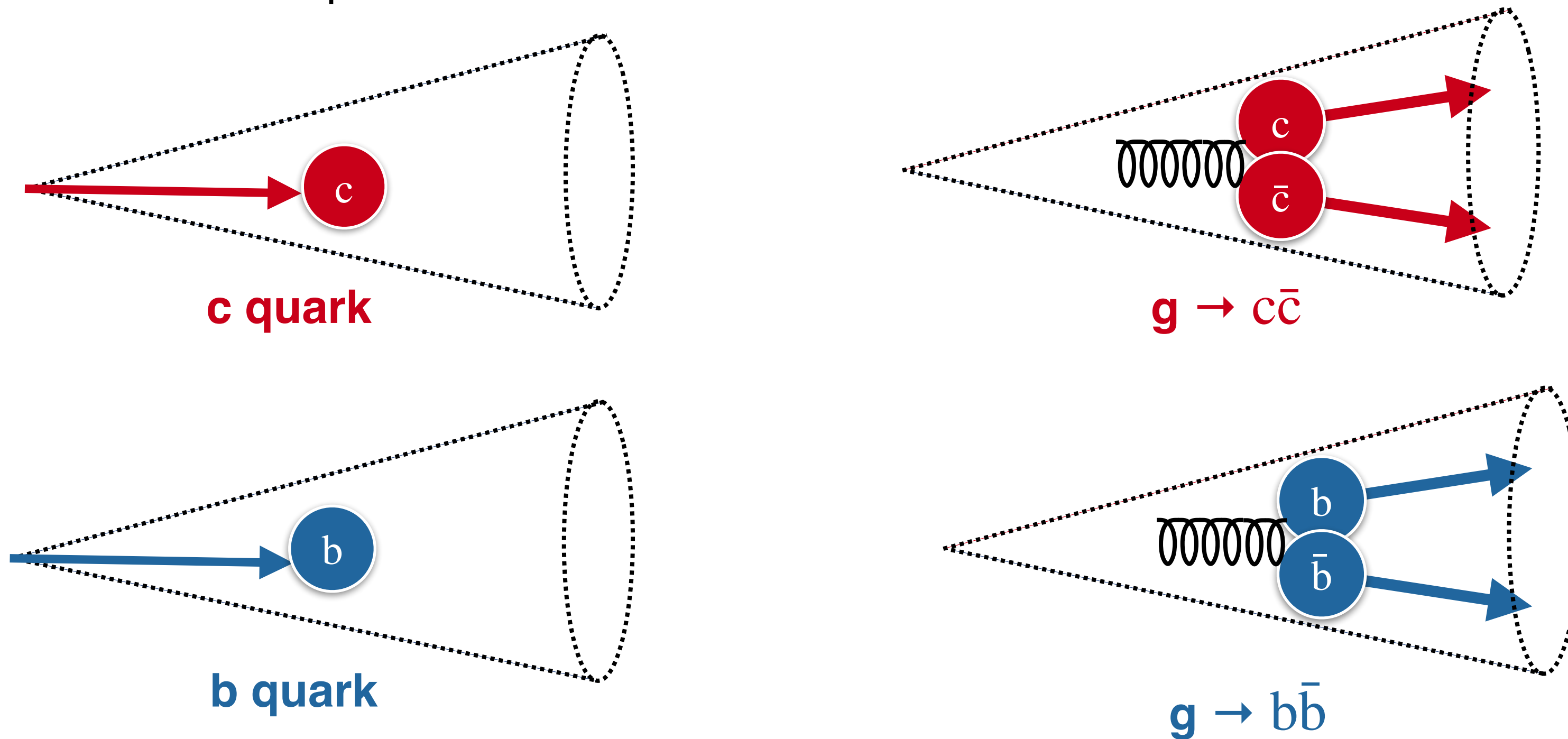
$$\langle q^2 \rangle_{\text{med}} \sim \hat{q} L_{\text{charm}}$$

→ we need accurate simulations that can model the parton shower modifications of heavy quarks in the QGP

Future tools: DNN techniques for flavor tagging in HI

Multi-label classification algorithms for tagging of:

- c-quark, b-quark, $g \rightarrow c\bar{c}$ and $g \rightarrow b\bar{b}$
- based on DNN and BDT techniques



- O(1000) signal increase w.r.t. $D^0\bar{D}^0$ -tagging technique
- new opportunities for c-jet correlation measurements in HI

Conclusions and outlook

Over the last decade, we witnessed a revolution in the techniques of HF reconstruction and analysis:

- HF techniques boost the theoretical and experimental control of most high-density QCD studies
- **How can we maximize the impact of heavy-flavor observables in the future?**

One of the key elements is the availability of accurate phenomenological models and simulations:

- good description of both soft (e.g. diffusion) and hard heavy-quark interactions (in-medium splitting modifications)
- capable of producing predictions for HF jet, HF jet-substructure observables, HF-jet correlations with isolated photons...

Conclusions and outlook

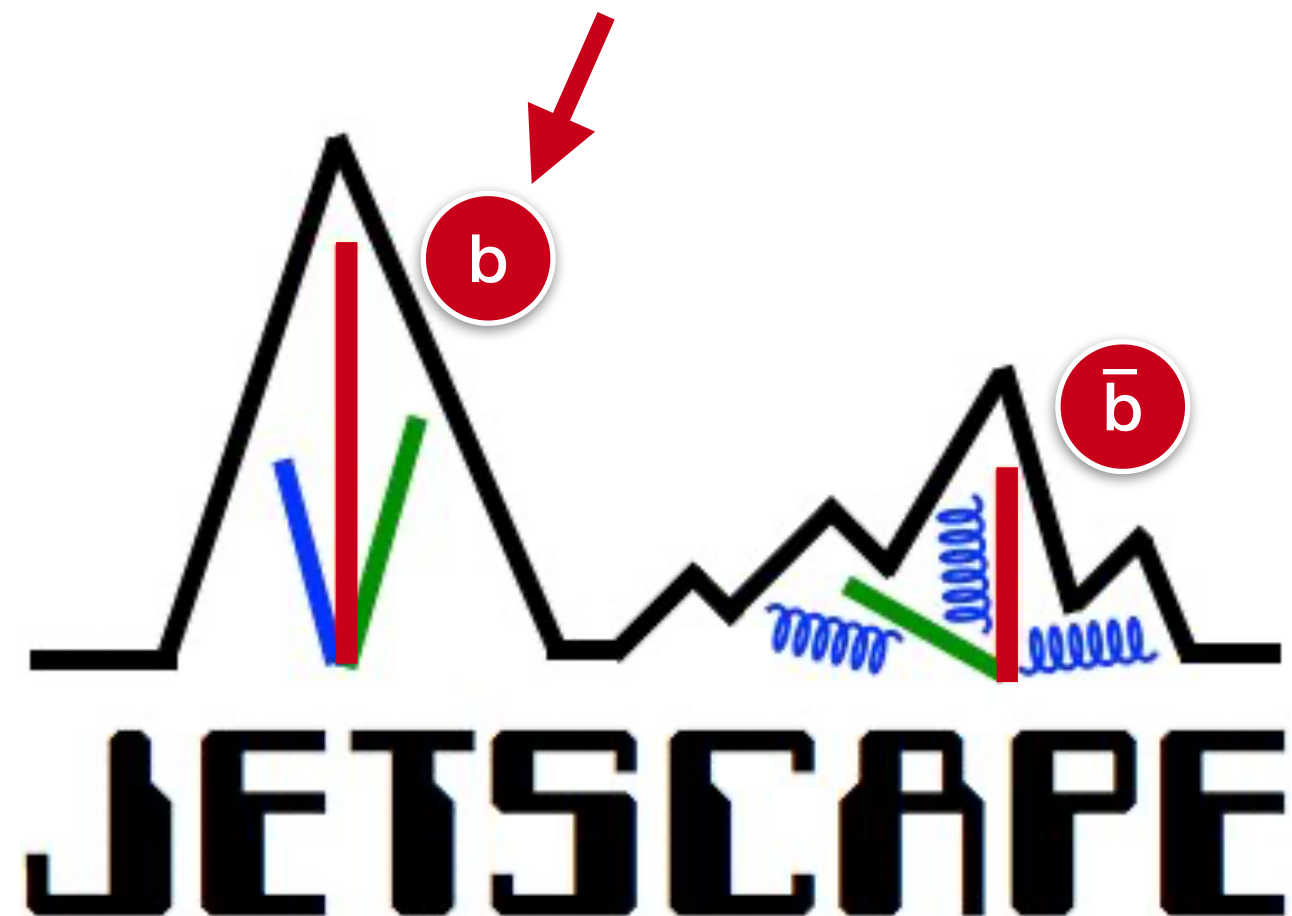
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One of the key elements is the availability of accurate phenomenological models and simulations:

- good description of both soft (e.g. diffusion) and hard heavy-quark interactions (in-medium splitting modifications)
- capable of producing predictions for HF jet, HF jet-substructure observables, HF-jet correlations with isolated photons...

JETSCAPE can play a crucial role in supporting future jets and HF-jet measurements!



thank you for your attention!

**BACKUP
SLIDES**

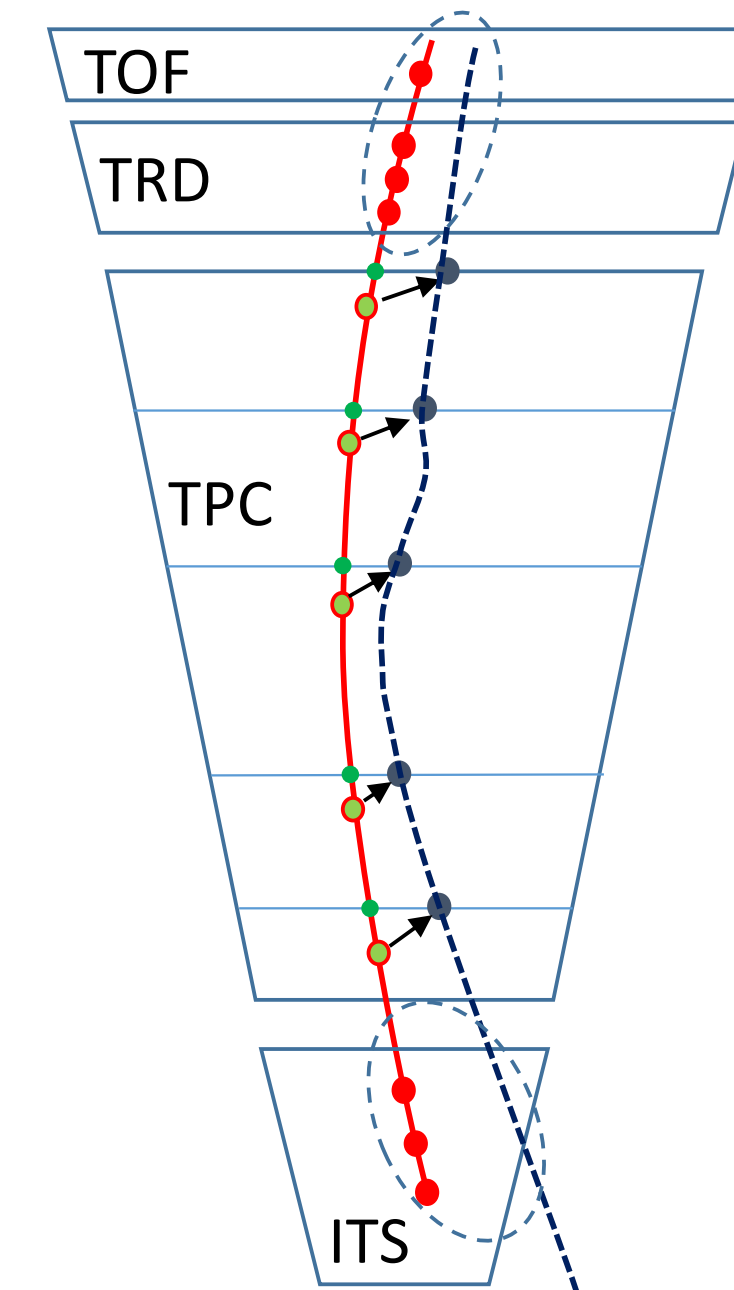
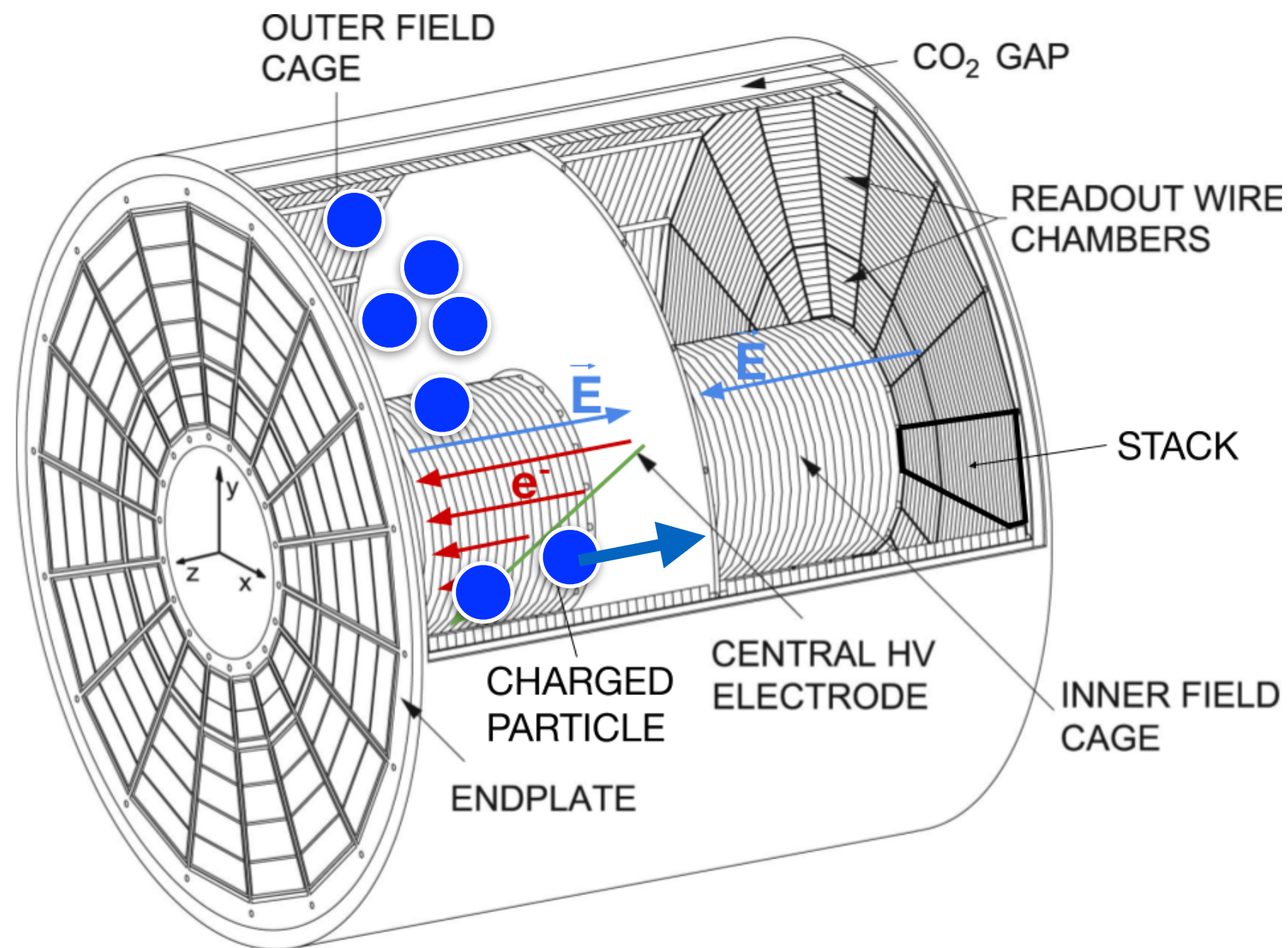
**BACKUP:
ALICE Run3**

Distortion fluctuations in the ALICE TPC

GEMs release slow ions (backflow) in the TPC:
(from up to 8000 PbPb collisions)

→ **distort the EM fields** inside the drift region

→ **time-dependent** deviations (\sim mm/cm) from the ideal electron trajectories (“distortion fluctuations”)



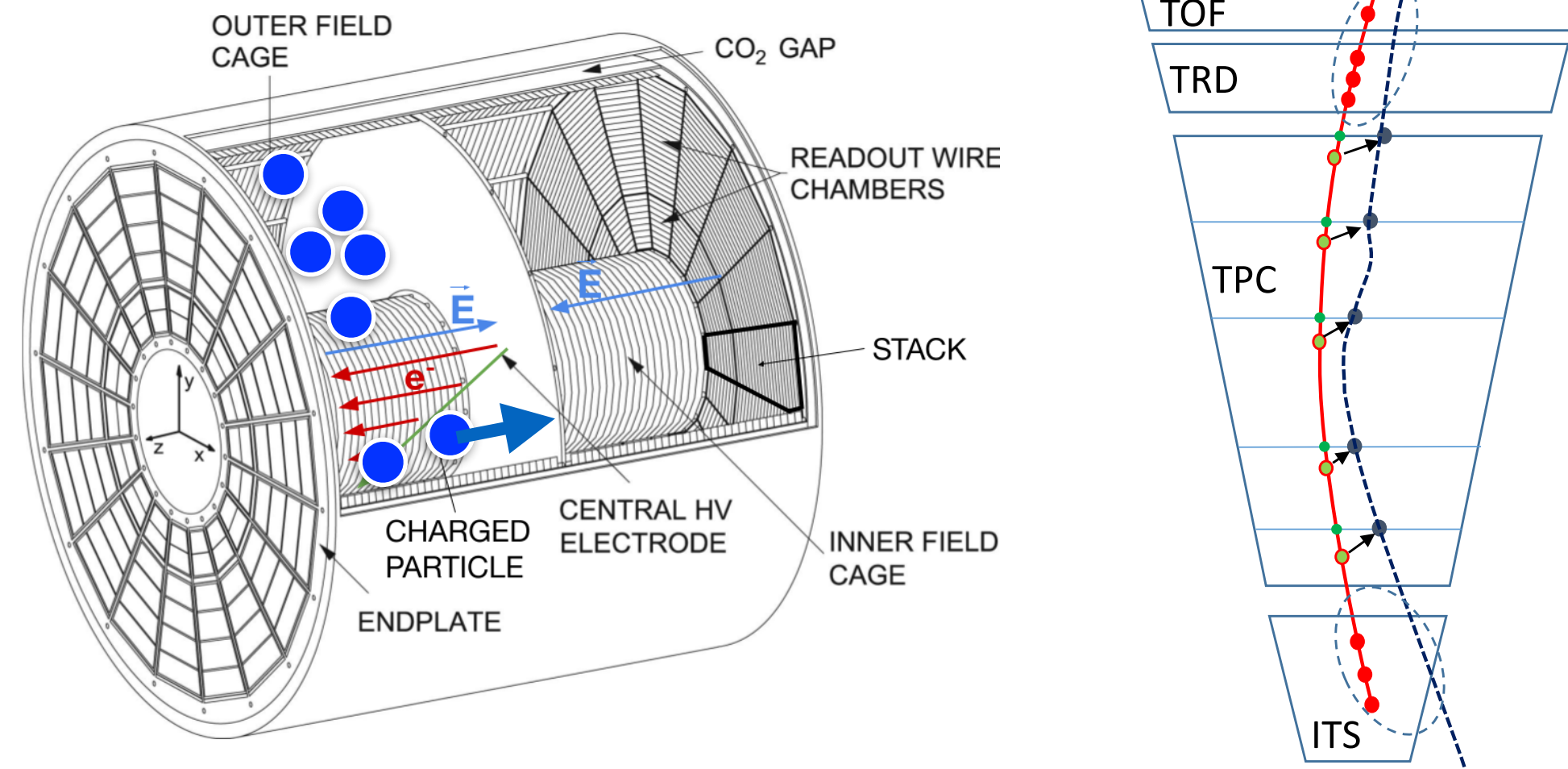
→ **A multi-dimensional time-dependent regression problem** (\sim video recognition) not solvable with traditional techniques

A big challenge: distortion fluctuations in the ALICE TPC

GEMs release slow ions (backflow) in the TPC:

(from up to 8000 PbPb collisions)

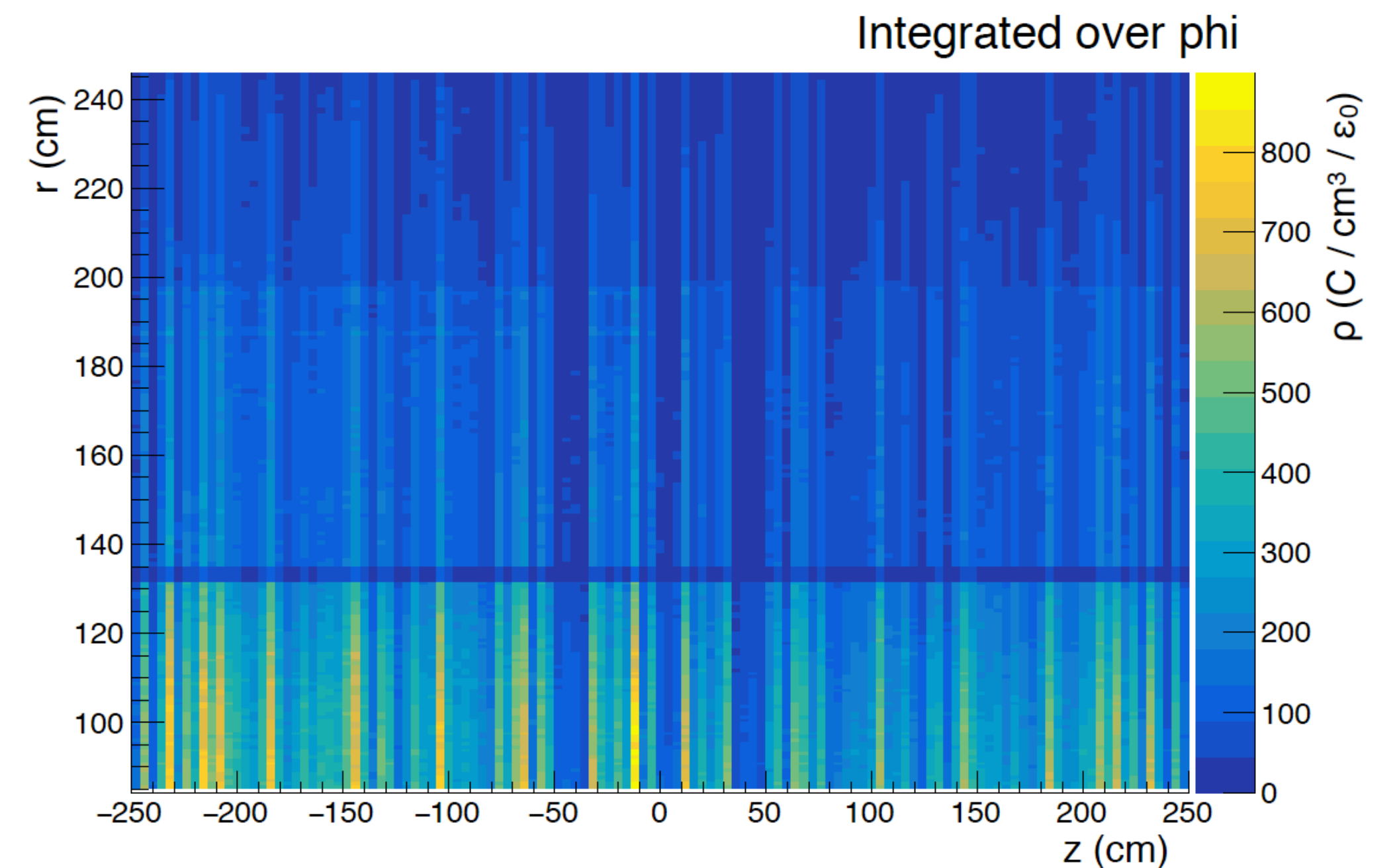
→ **distort the EM fields** inside the drift region



→ ~ **cm deviations** from the **ideal** electron trajectories (“distortions”)

Distortions are time-dependent (“fluctuations”)

e.g. fluctuations in the multiplicity of PbPb events:



High-multiplicity event (**yellow**)

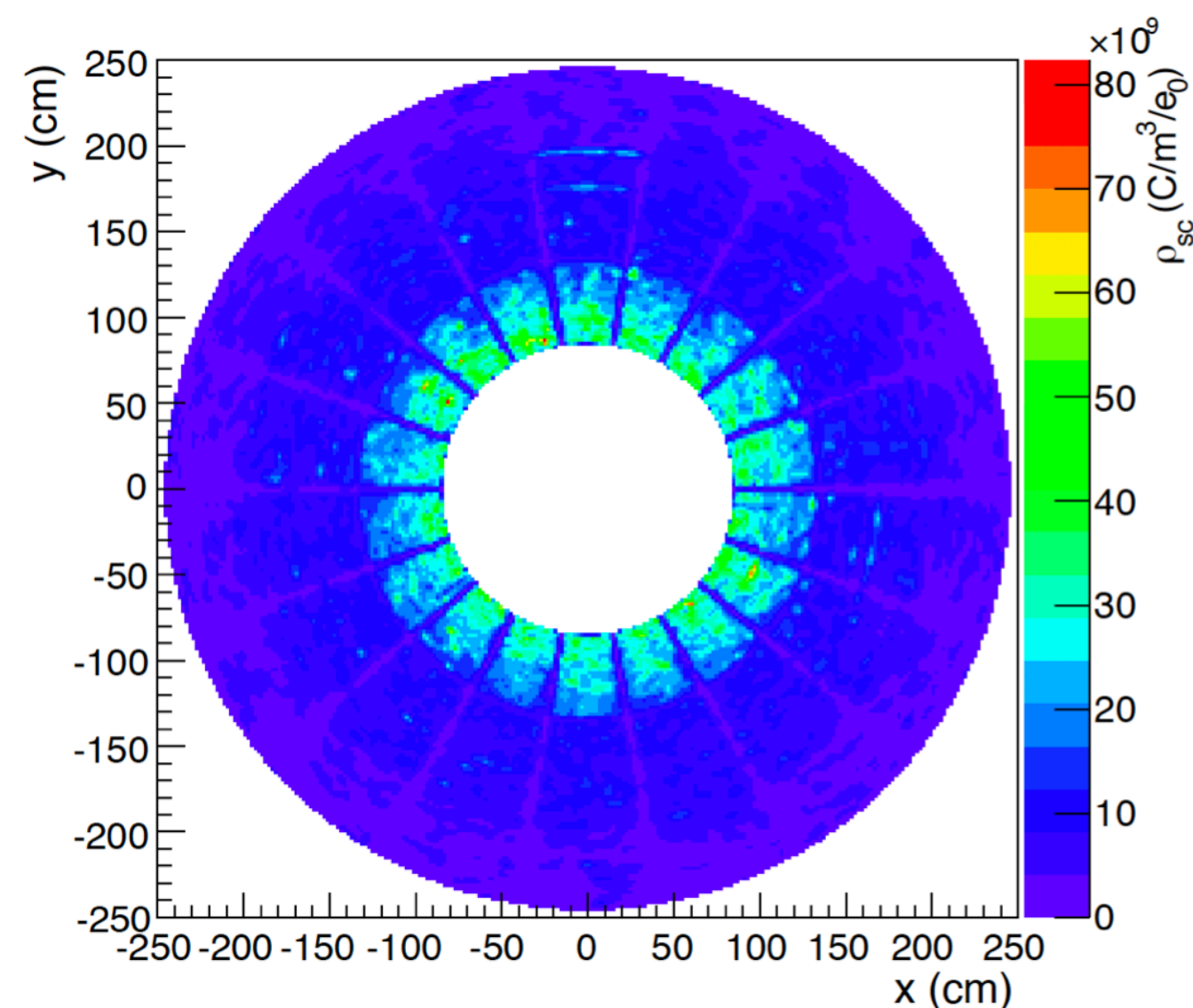
Low-multiplicity event (**blue**)

→ **A multi-dimensional time-dependent regression problem** (~video recognition) not solvable with traditional techniques

First working calibration for distortion fluctuations with DNNs

Training inputs:

4D (time+space) ion charge densities in each TPC point

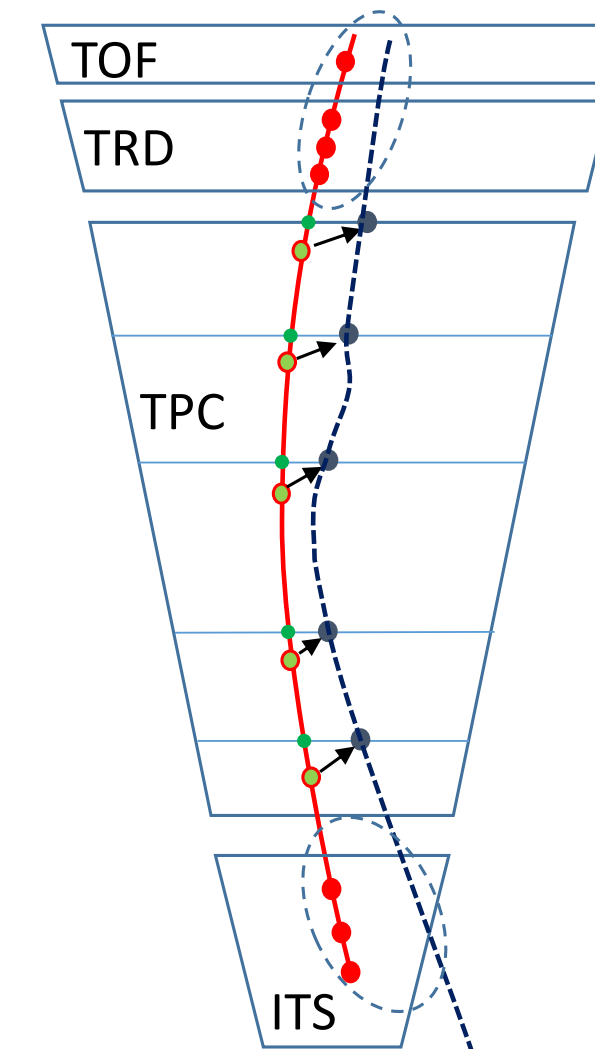
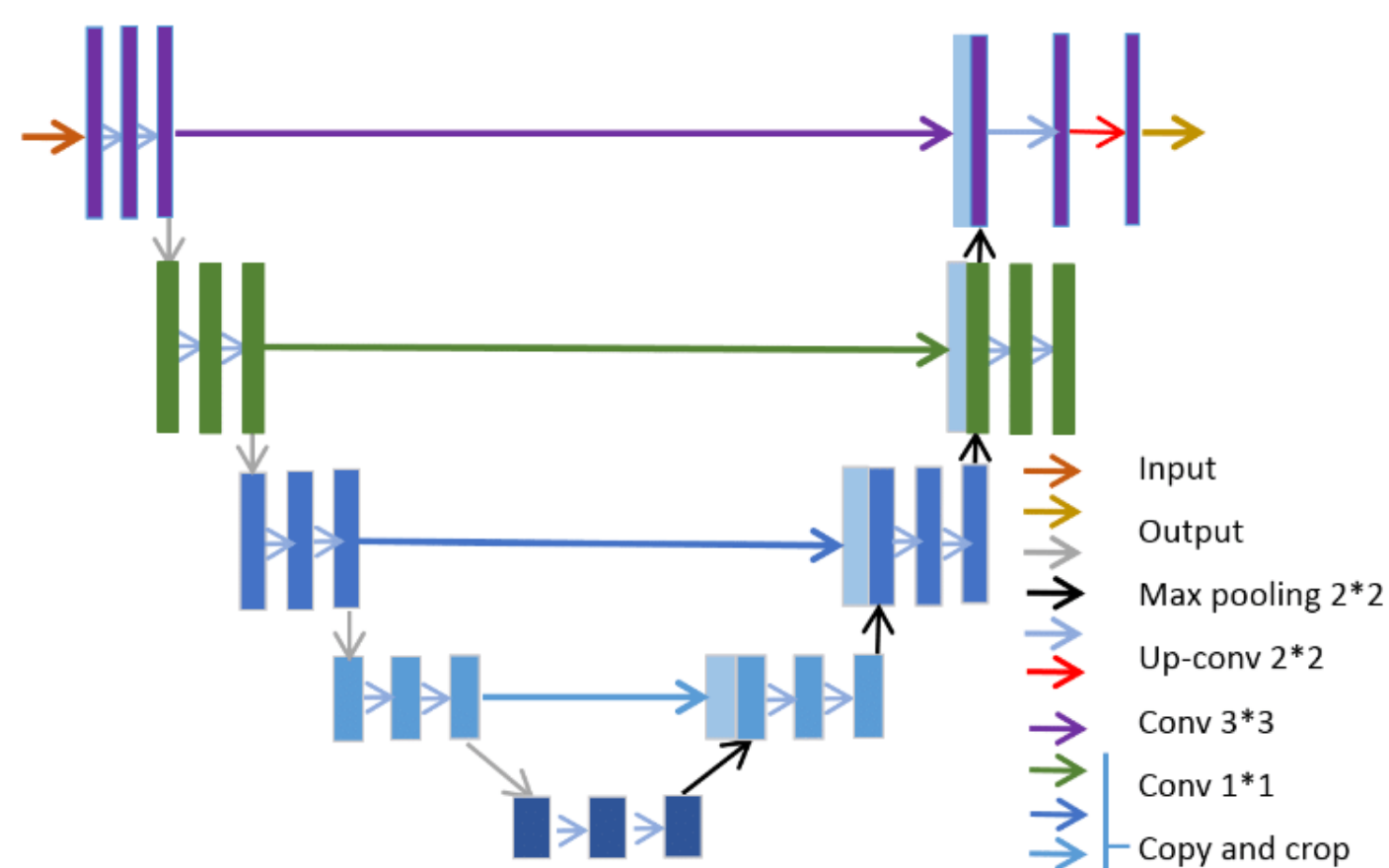


UNets trained on GPUs



Predicted quantities:

4D (time+space) dependent distortions in each point of the TPC



E. Hellbär, **G.M. Innocenti**, Maja Kabus et al., [CHEP 2021 Proceedings](#)

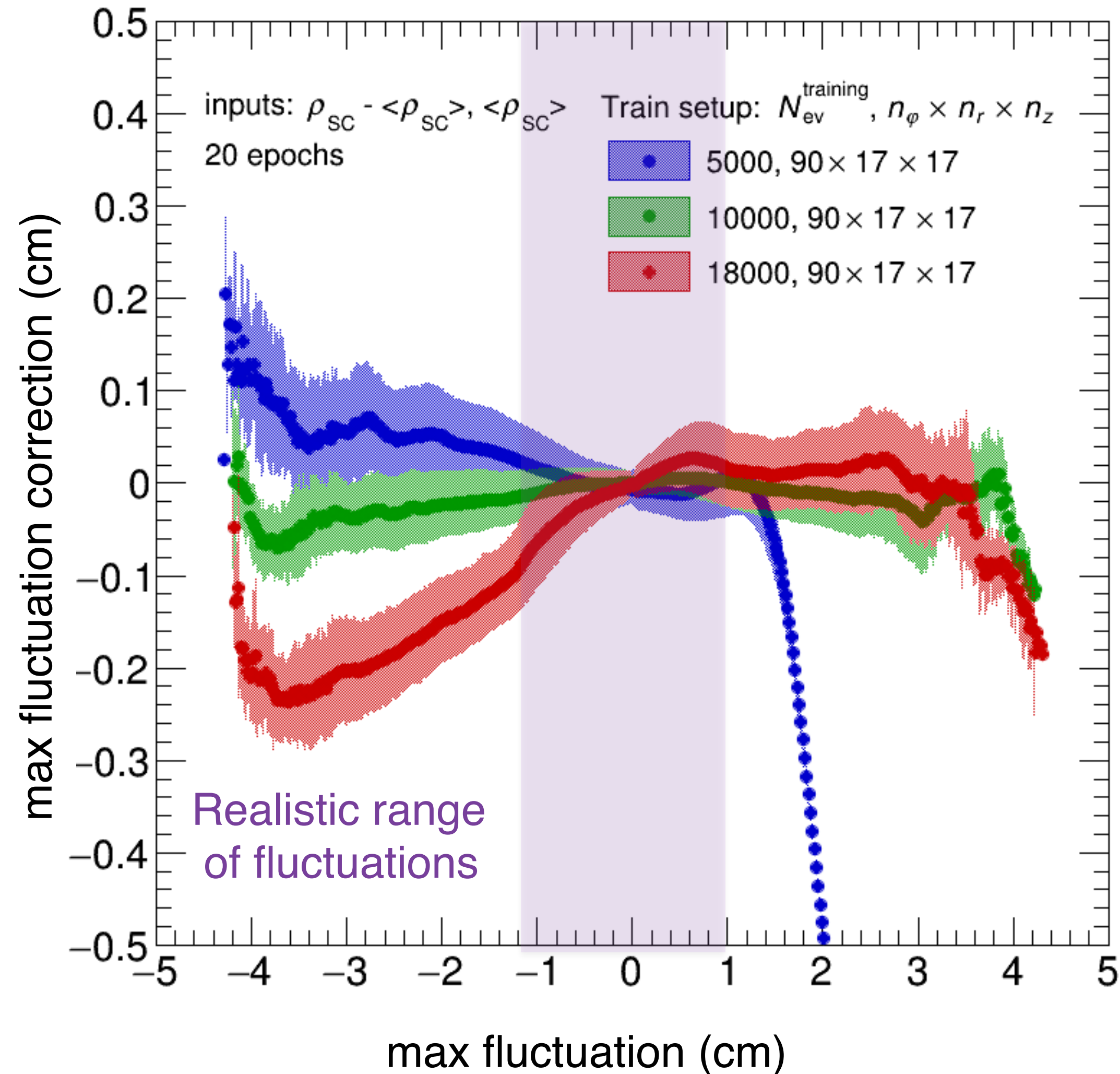
Accuracy achieved $\sim 200\mu\text{m}$, comparable to TPC detector resolution!

- default strategy for Run 3 heavy-ion data taking
- applicable to sPHENIX TPC

Supported by:

- Polish Ministry + CERN grant (DN-WFM.92.56.2022.SB), PI: **G.M. Innocenti**, L. K. Graczykowski
- First Cloud Broker Pilot proposal. PI: **G.M. Innocenti** et al.

Prototype for a DNN-based correction for the TPC distortions



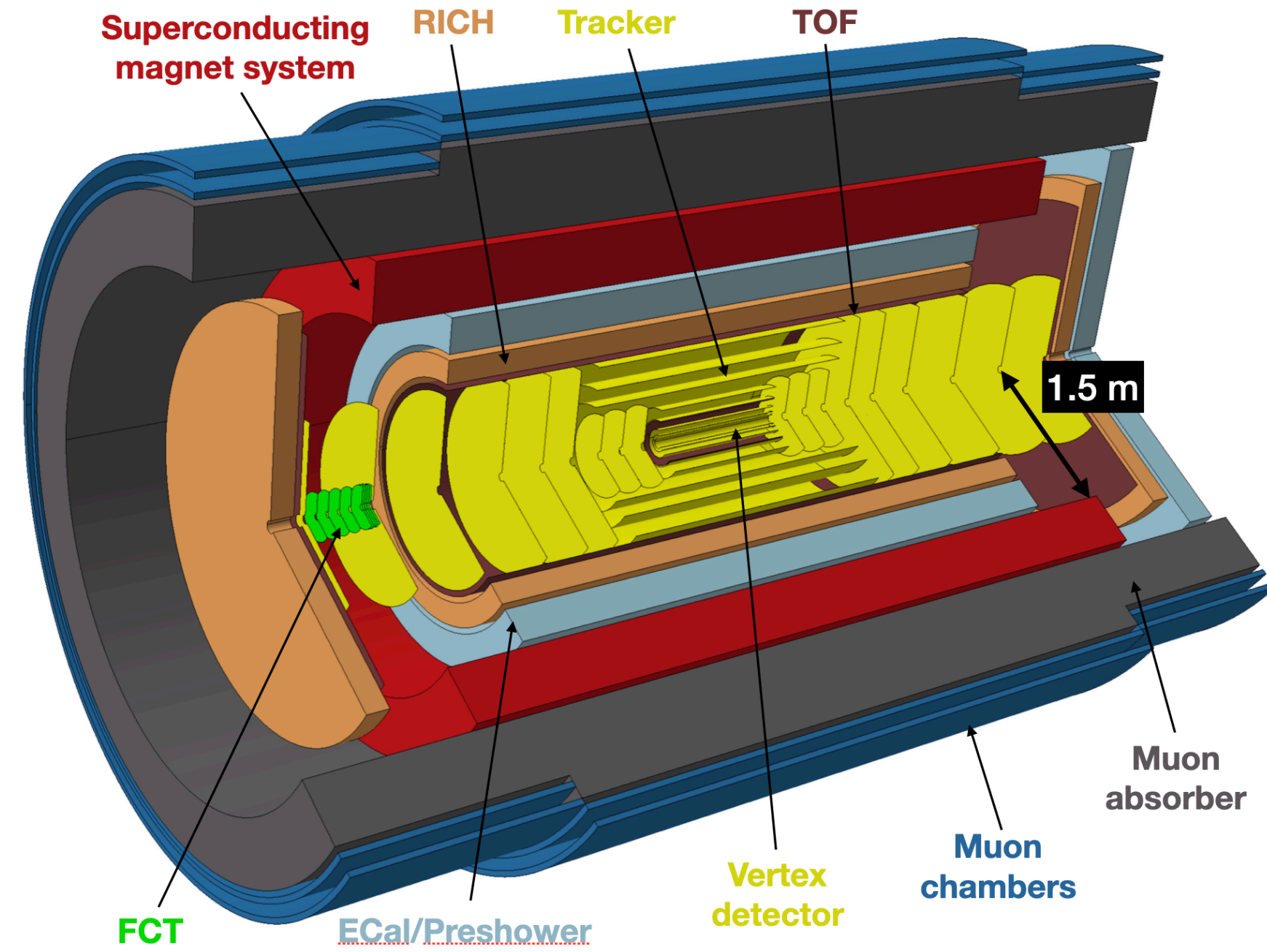
Correction accuracy \sim detector resolution ($\sim 200\mu\text{m}$)
 \rightarrow DNNs can be effectively used to correct this effect!

\rightarrow The same strategy could be applied in sPHENIX, which will also suffer from distortion fluctuations!

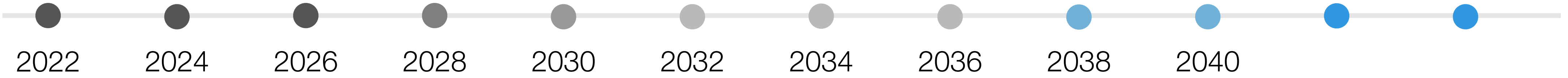
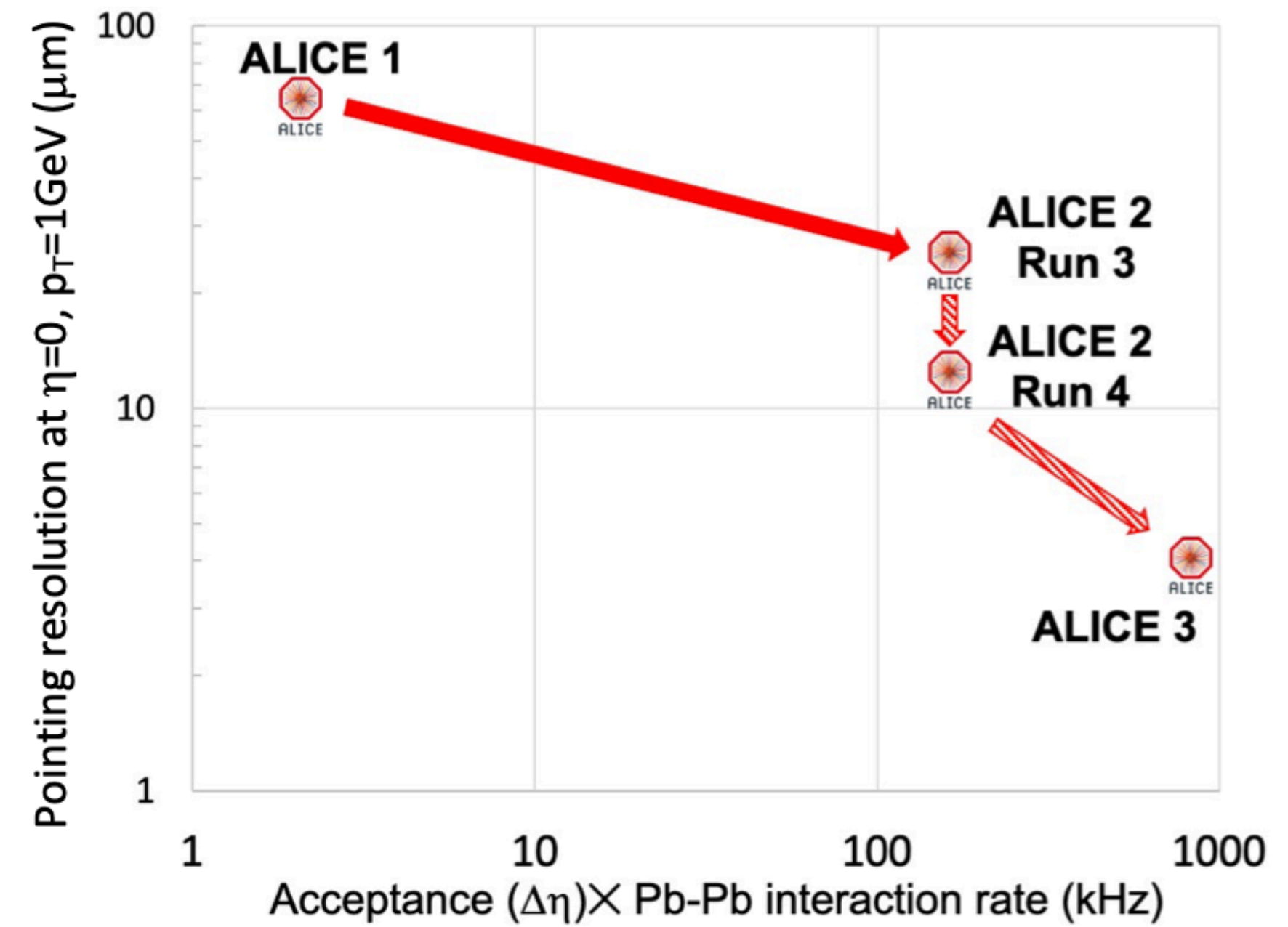
**BACKUP:
ALICE 3 in
Run5/6**

A new heavy-ion experiment for the '30

→ Shaped the physics program and the detector design of ALICE 3 at the LHC



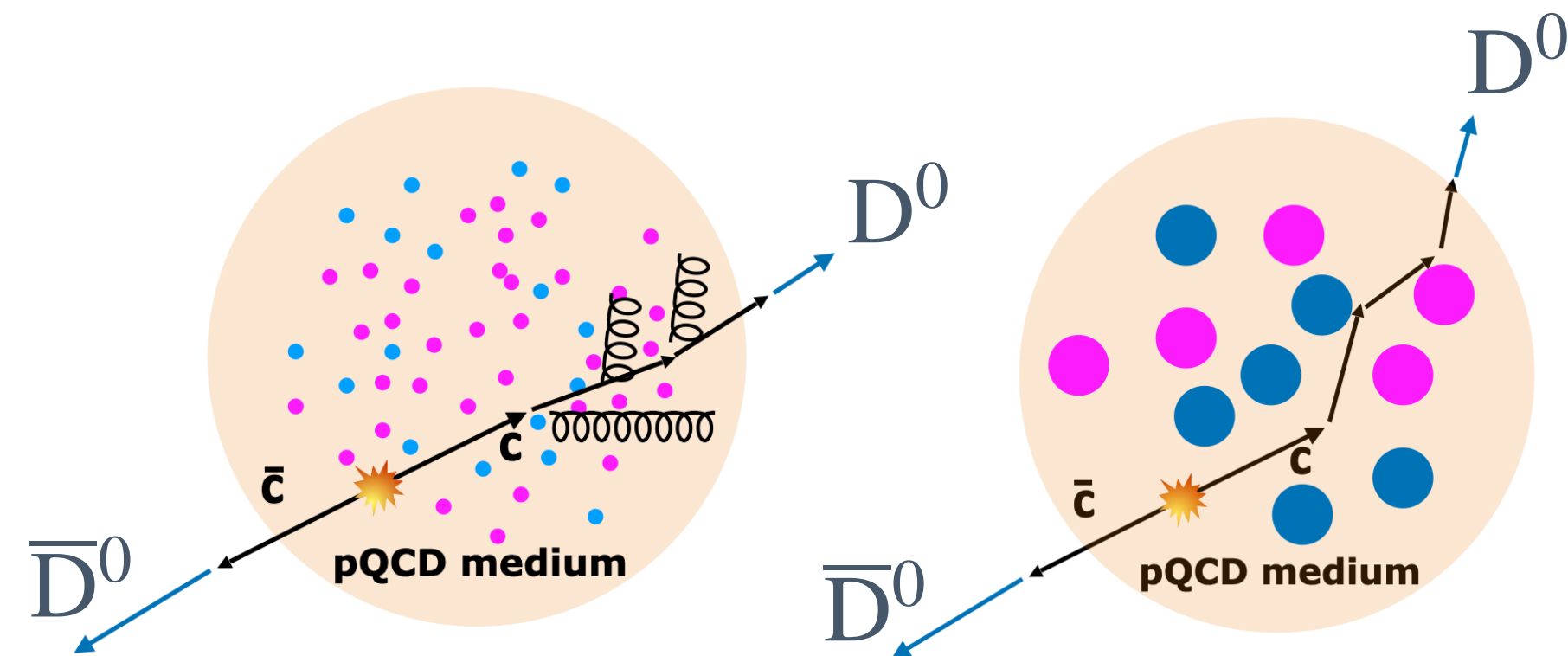
ALICE 3: a high-rate, high-resolution experiment $|\eta| < 4$ for rare heavy-flavor probes in light and heavy ions



ALICE 3 for Run 5 and 6

One highlight from a broad physics program

“Rutherford-like” experiment with $D^0\bar{D}^0$ correlations

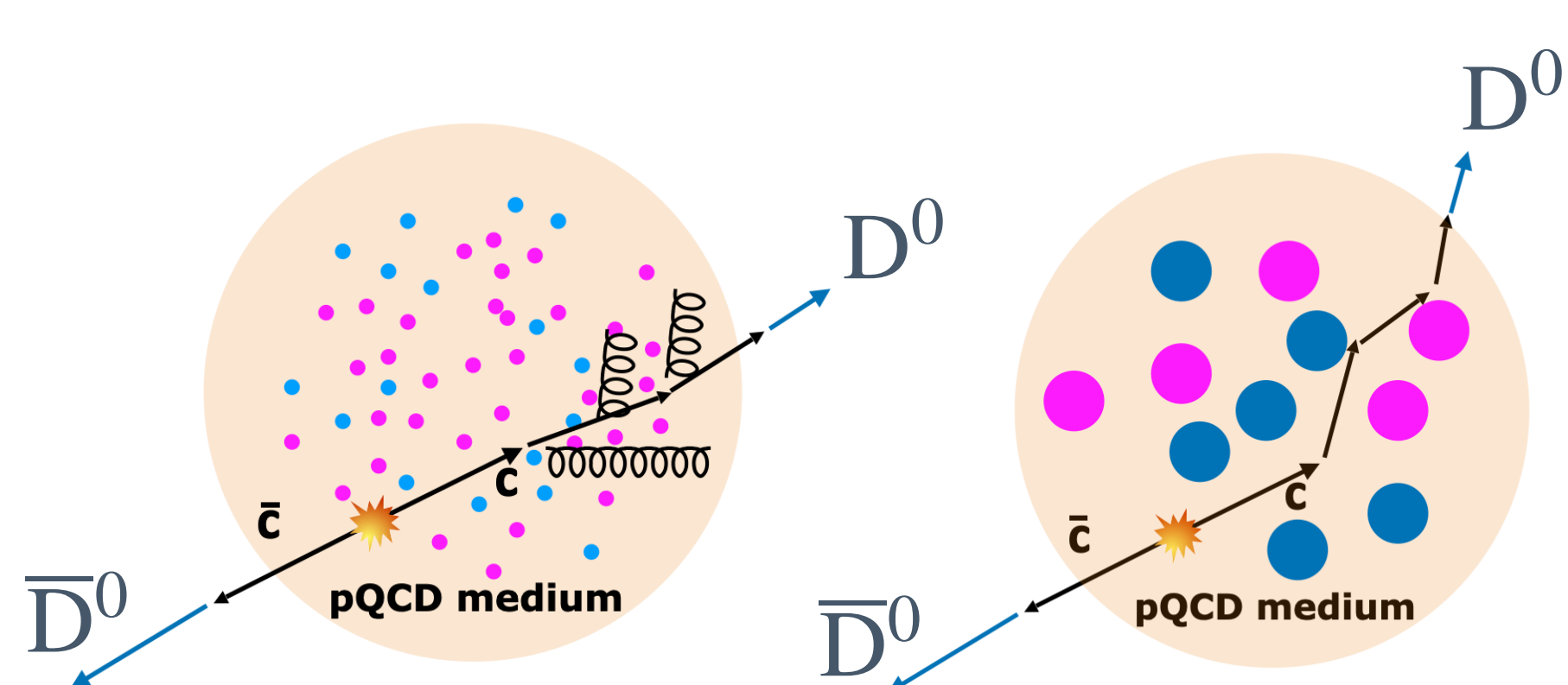


→ partonic “structure” of the hot medium

- Tracking and vertexing with μm -accuracy over $|\eta| < 4$
- superconducting magnet with forward dipoles
- Hadron PID from low (TOF) to high p_T (Cherenkov)

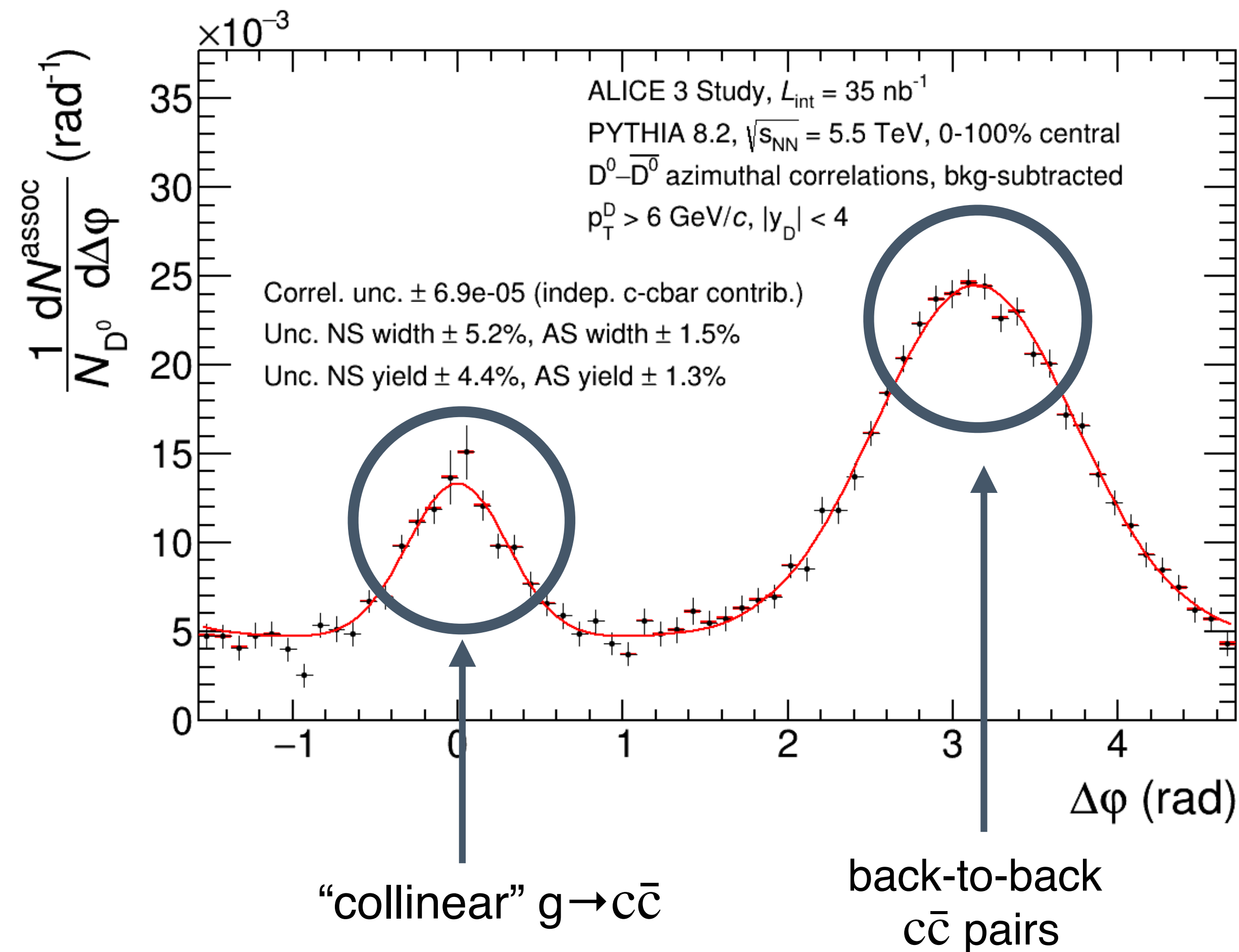
One highlight from a broad physics program

“Rutherford-like” experiment with $D^0\bar{D}^0$ correlations

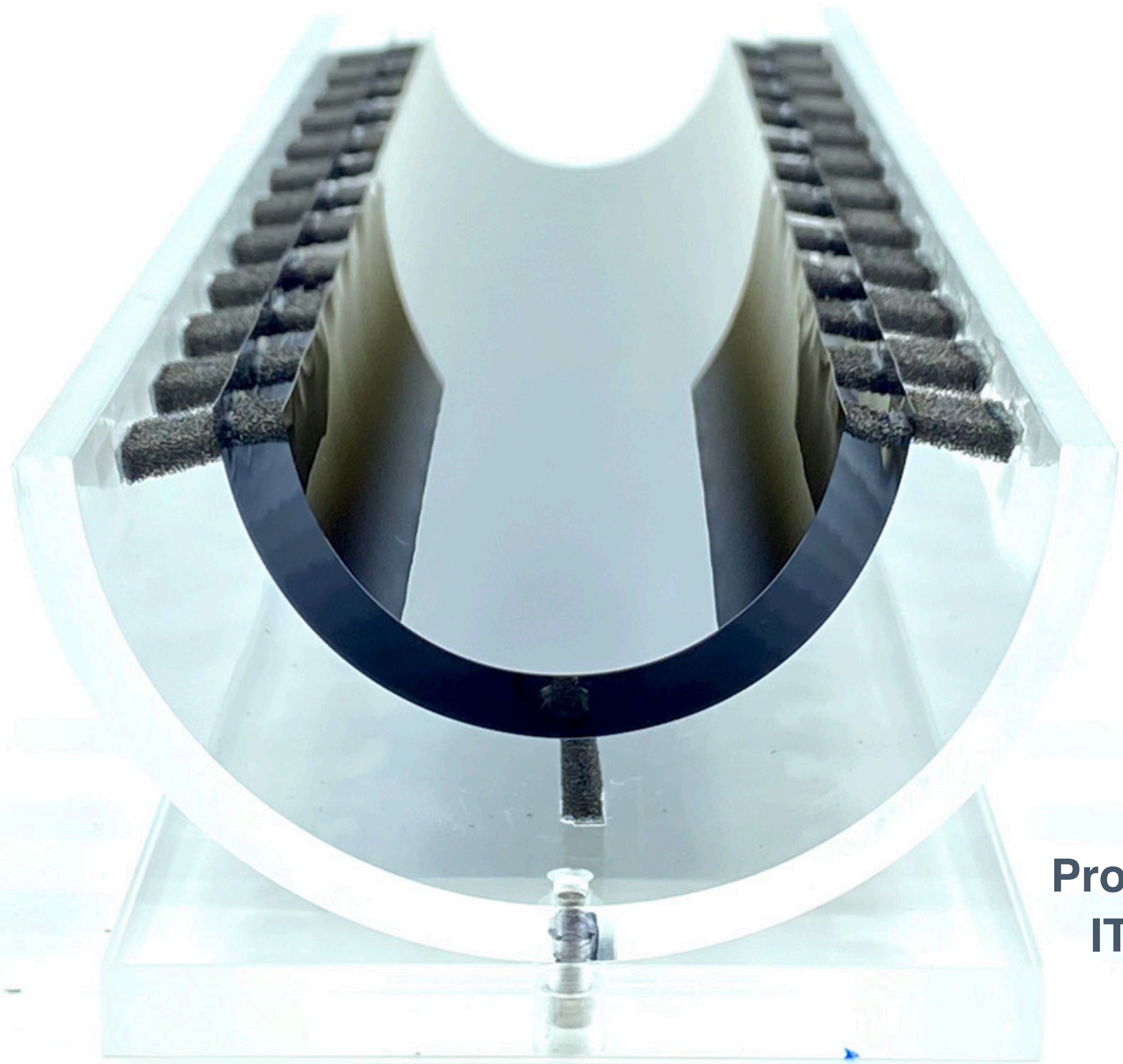


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The new (bending) pixel technology at the core of ALICE 3



Prototype for the
ITS3 upgrade

Ultra-light (“massless”) sensors with $<0.05 X_0$

- large sensors with “stitching” techniques
- “bendable” when thinned below $\sim 20\text{-}40 \mu\text{m}$



Impact parameter resolutions for
tracks of about 1 GeV of a few μm !

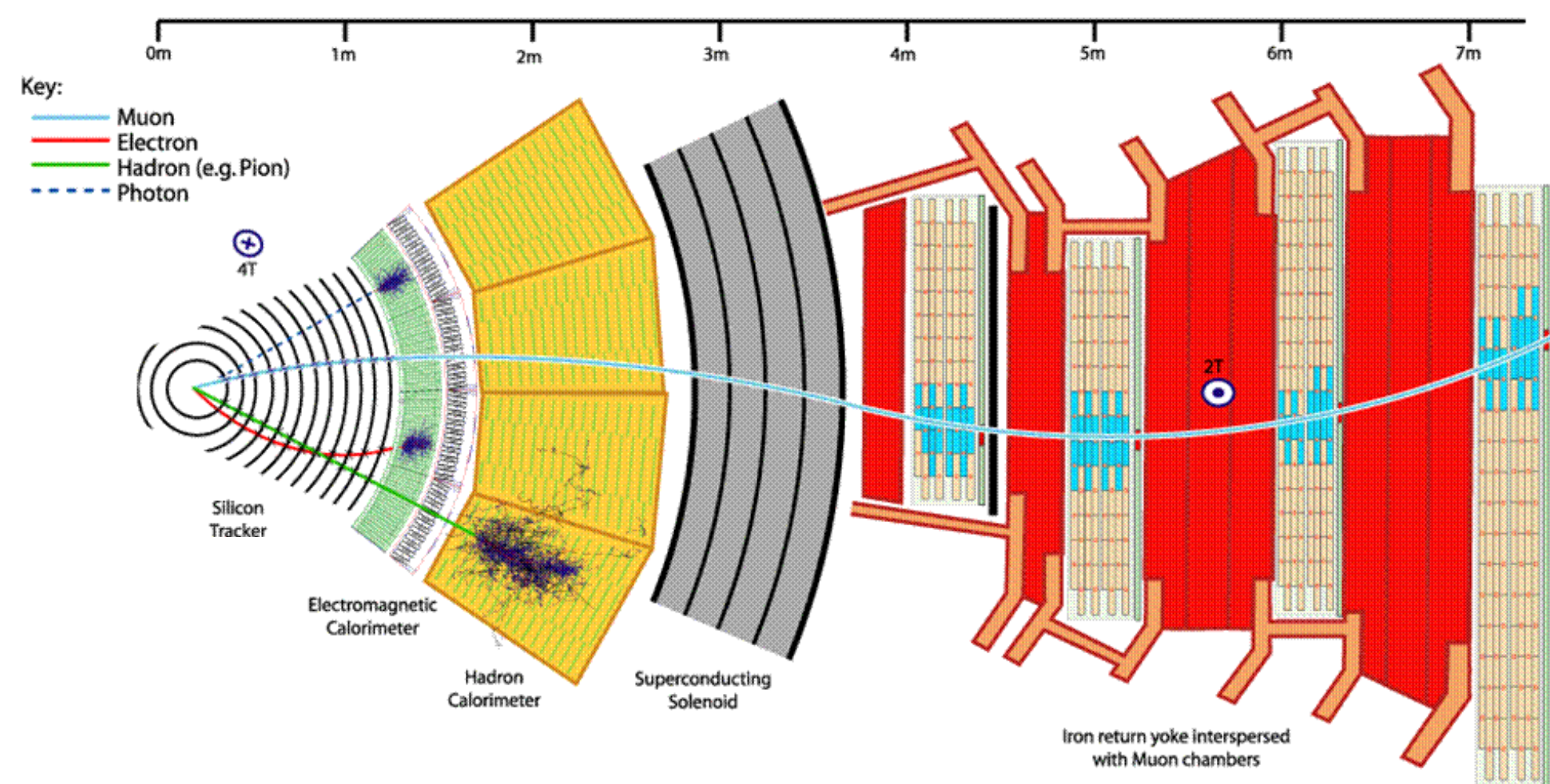
And it works! as proven by dedicated test beams
after irradiation (ITS3 prototype)

ALICE ITS3 Letter of Intent: [ALICE-PUBLIC-2018-013](#)
ALICE ITS3, [arXiv.2105.13000](#)
ALICE ITS3, [arXiv.2212.08621](#)

**BACKUP:
HF analyses**

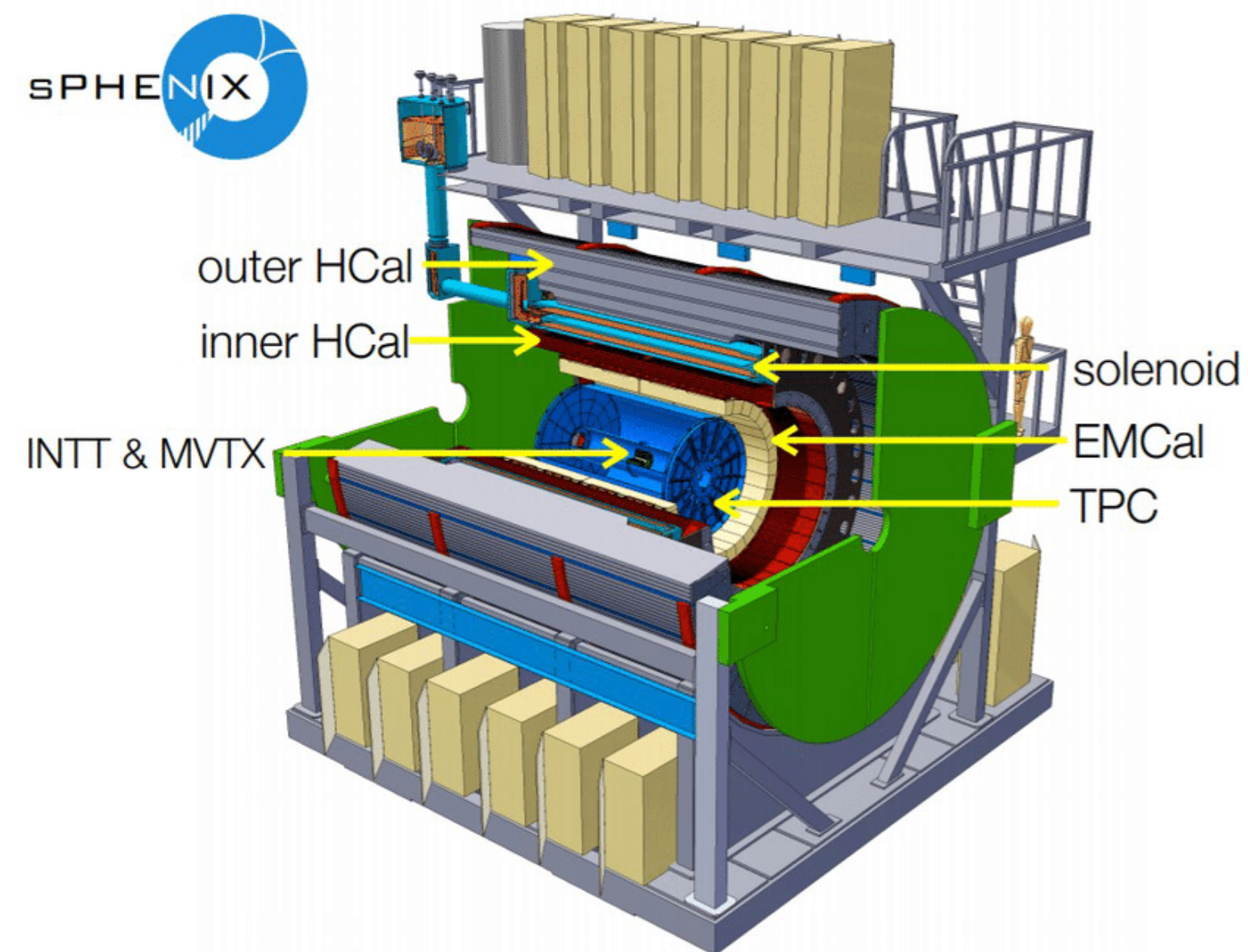
CMS in Run 3 at the LHC and sPHENIX at RHIC

- **Most complete detectors** for jets, photons, heavy-flavour hadrons
- access to **heavy-ion collisions at very different energies** (5.5 TeV vs 200 GeV)



CMS at the Large Hadron Collider:

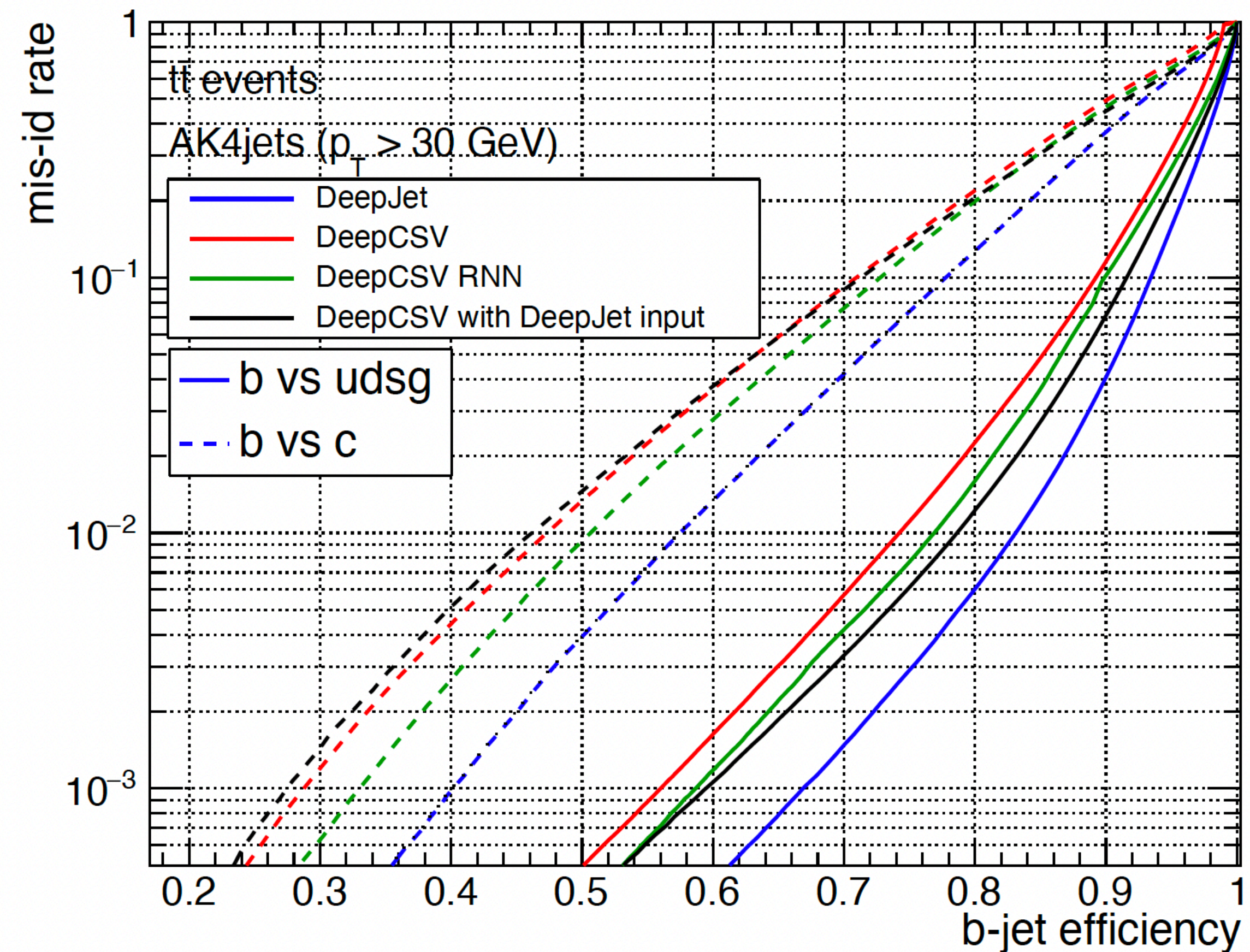
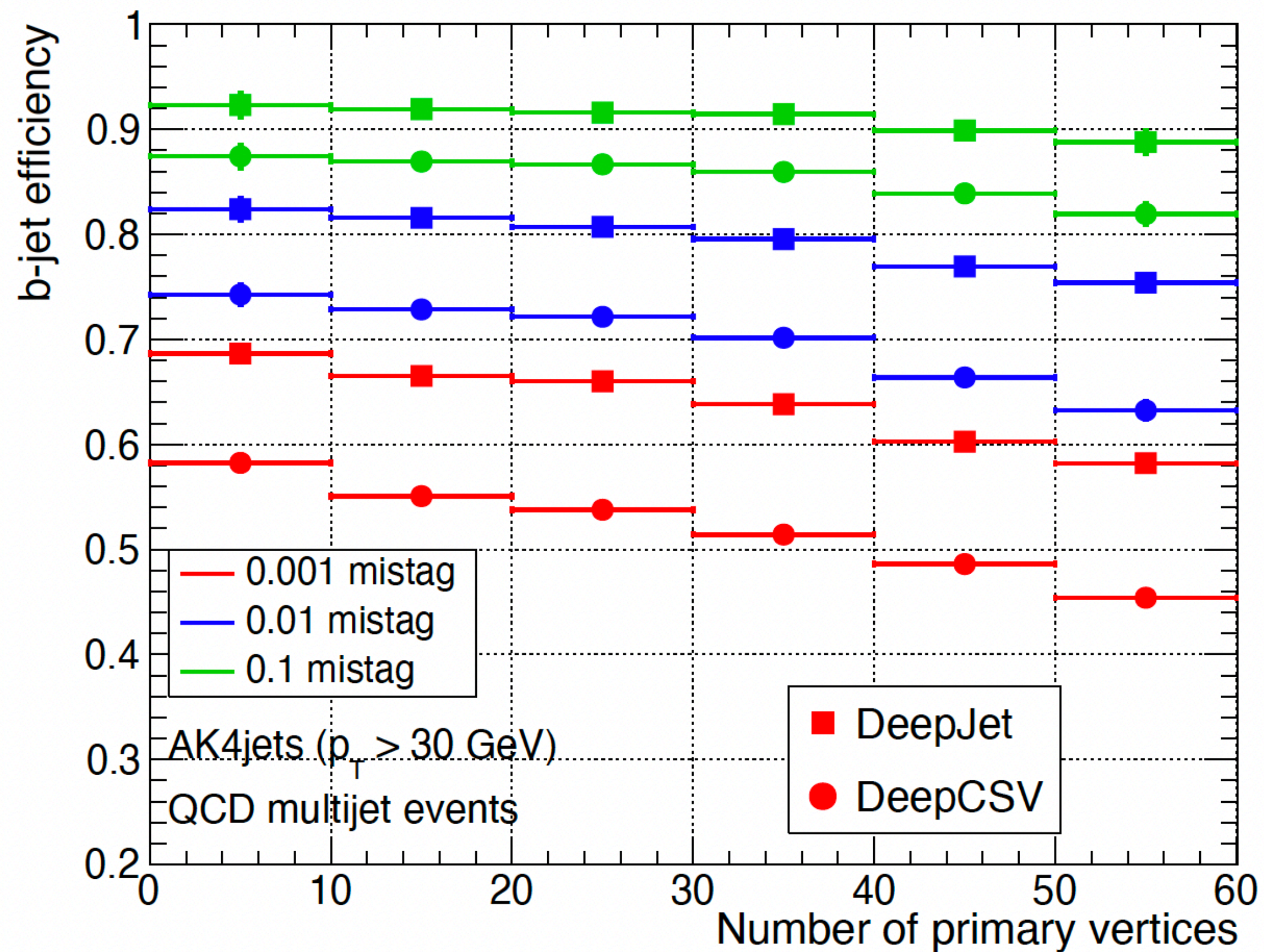
- High-luminosity, full “barrel” coverage $|\eta| < 2.4$
- Large acceptance tracking $|\eta| < 2.4$ in Run 3
- Muon detectors, ECAL and HCAL
- Outstanding trigger system



sPHENIX at RHIC:

- **Time-Projection Chamber** (GEM readout)
 - 240 billion AuAu events in continuous readout mode
- **MVTX vertex detector** (based on ALICE ITS2 technology)
 - impact parameter resolution $\sim 20 \mu\text{m}$ for $p_T = 1 \text{ GeV}/c$

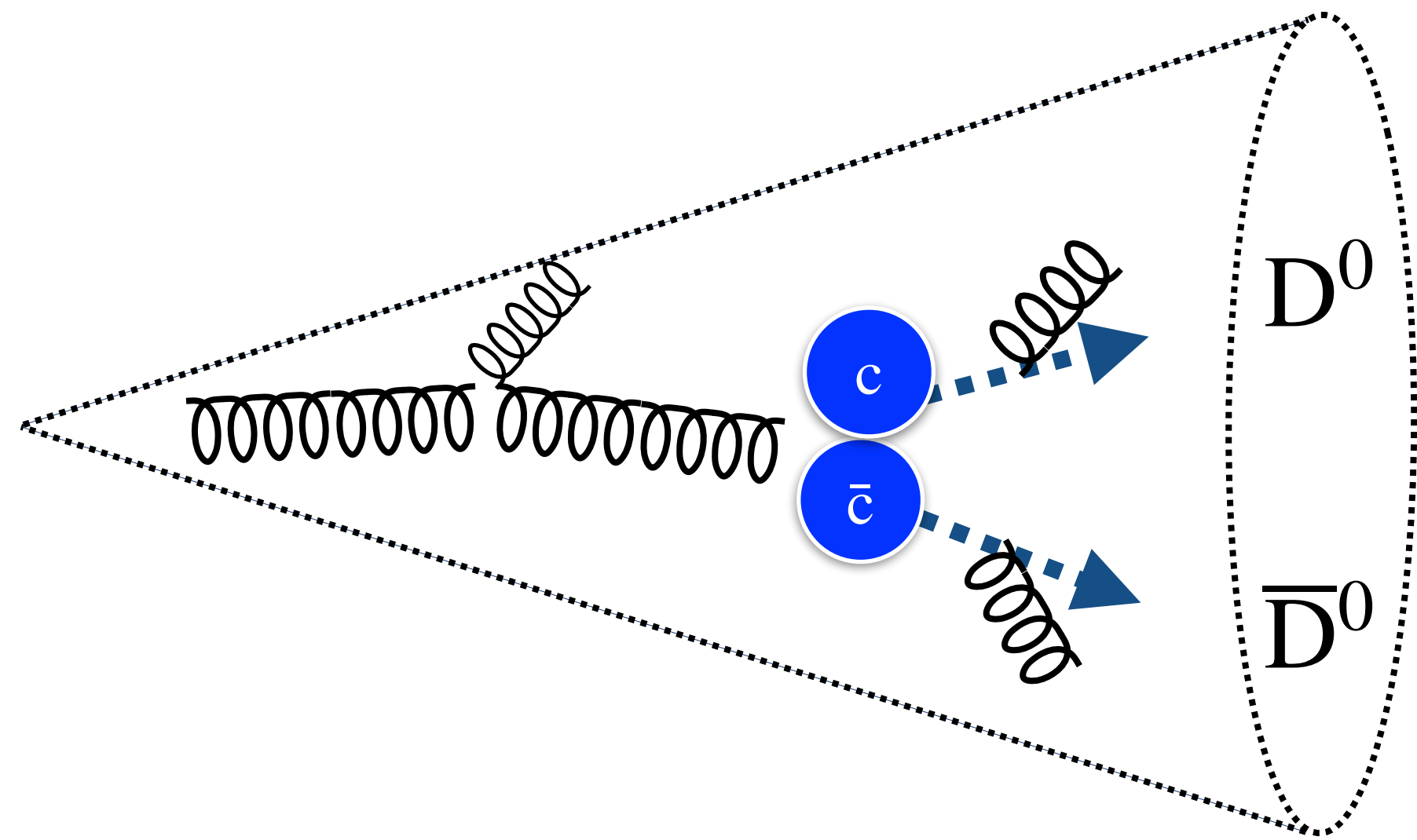
Flavor tagging in CMS



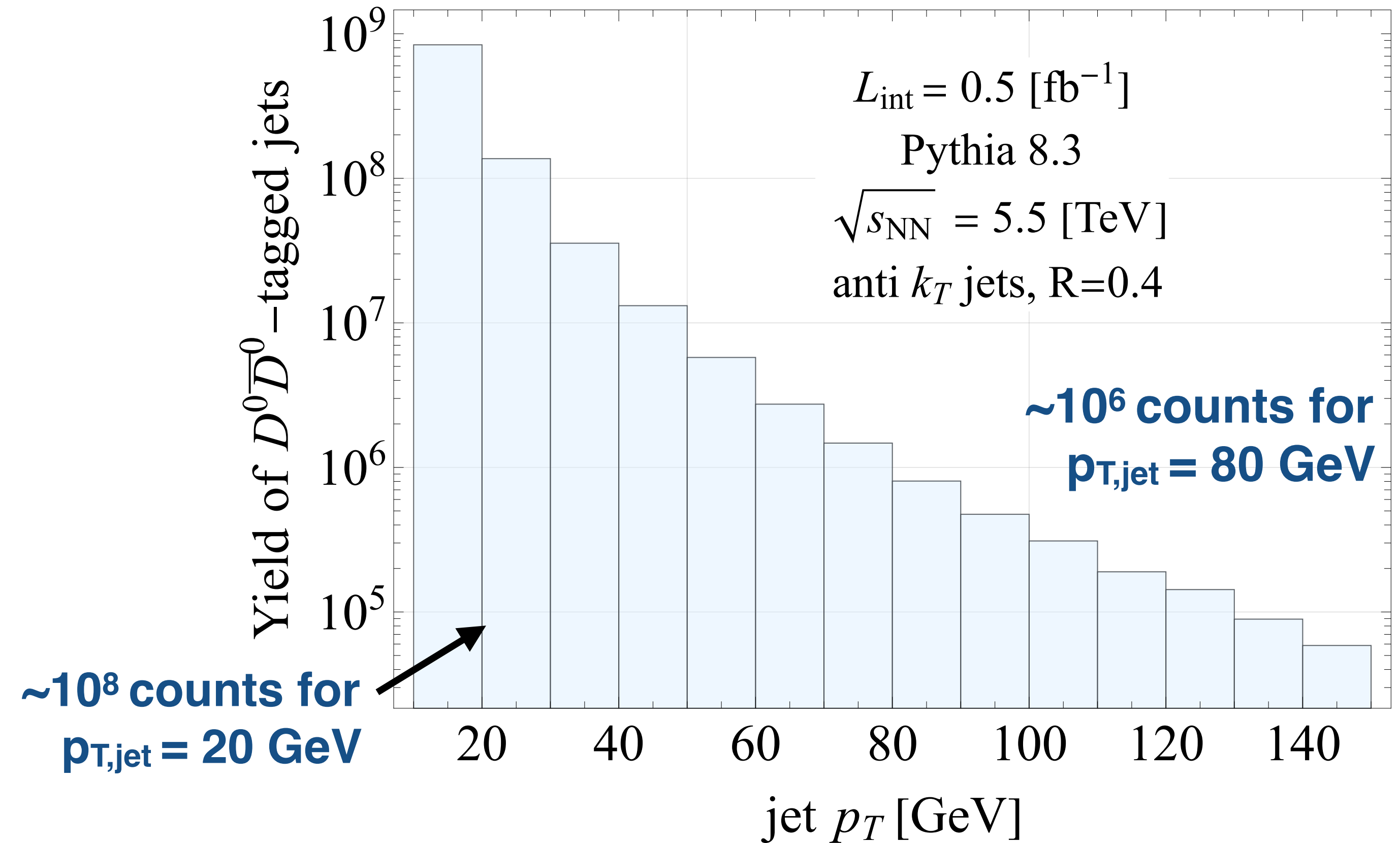
BACKUP SLIDES
gluon splitting
and time structure

Monte Carlo studies with Pythia 8

- Anti- k_T “full” jets with FastJet ($R=0.4$)
- one $D^0\bar{D}^0$ per jet
- only prompt D^0 contribution considered ($c \rightarrow D^0$)



$L_{\text{int}} = 0.5 \text{ fb}^{-1} \text{ pp} \sim 10 \text{ nb}^{-1} \text{ PbPb}$ (no quenching)



- Fully reconstructed hadronic D^0 decays
- **But also** $c\bar{c}$ -tagging techniques high- p_T jets or tagging of semi-leptonic charm decays \rightarrow **sample \sim entire $c\bar{c}$ statistics**

Challenging measurement:

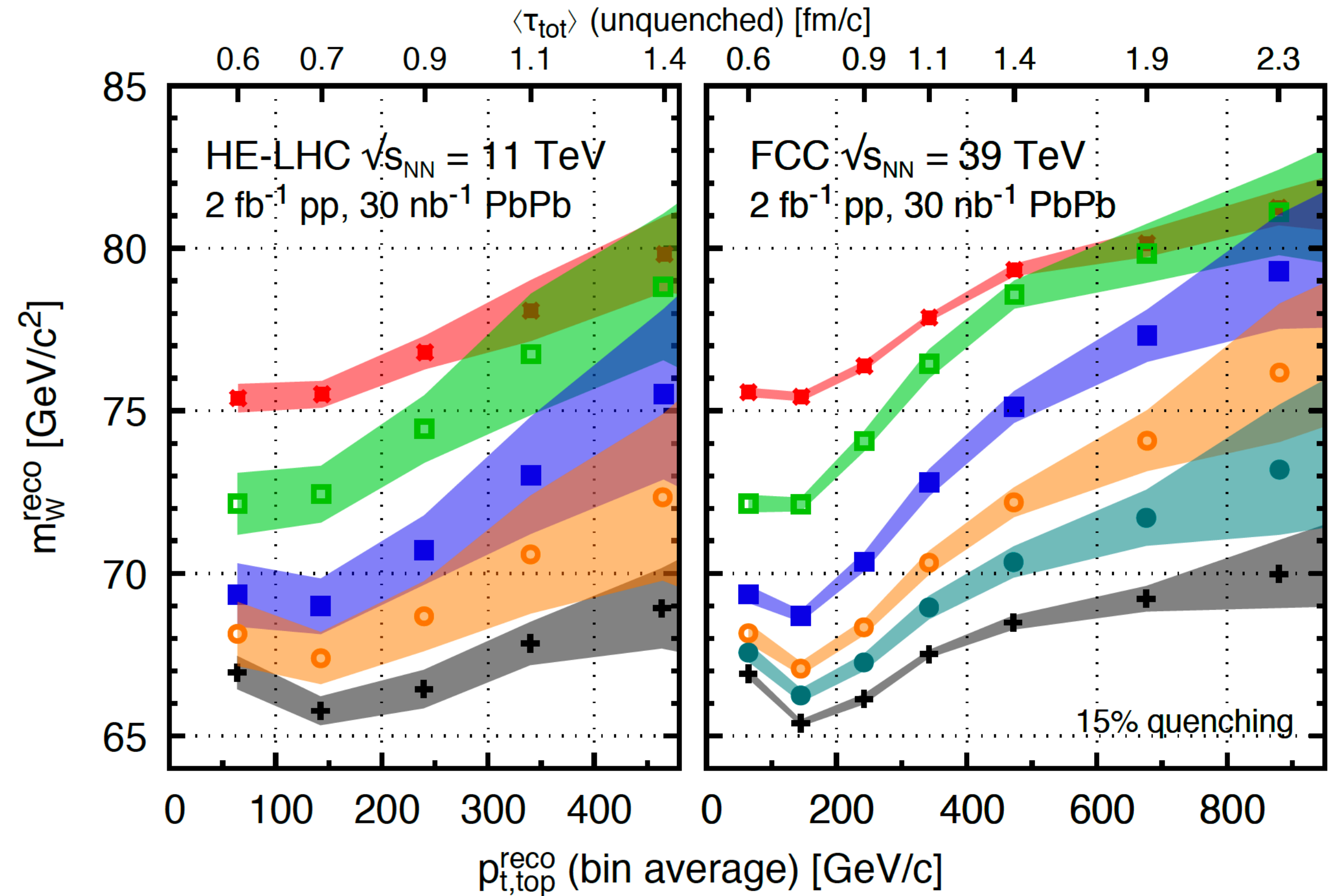
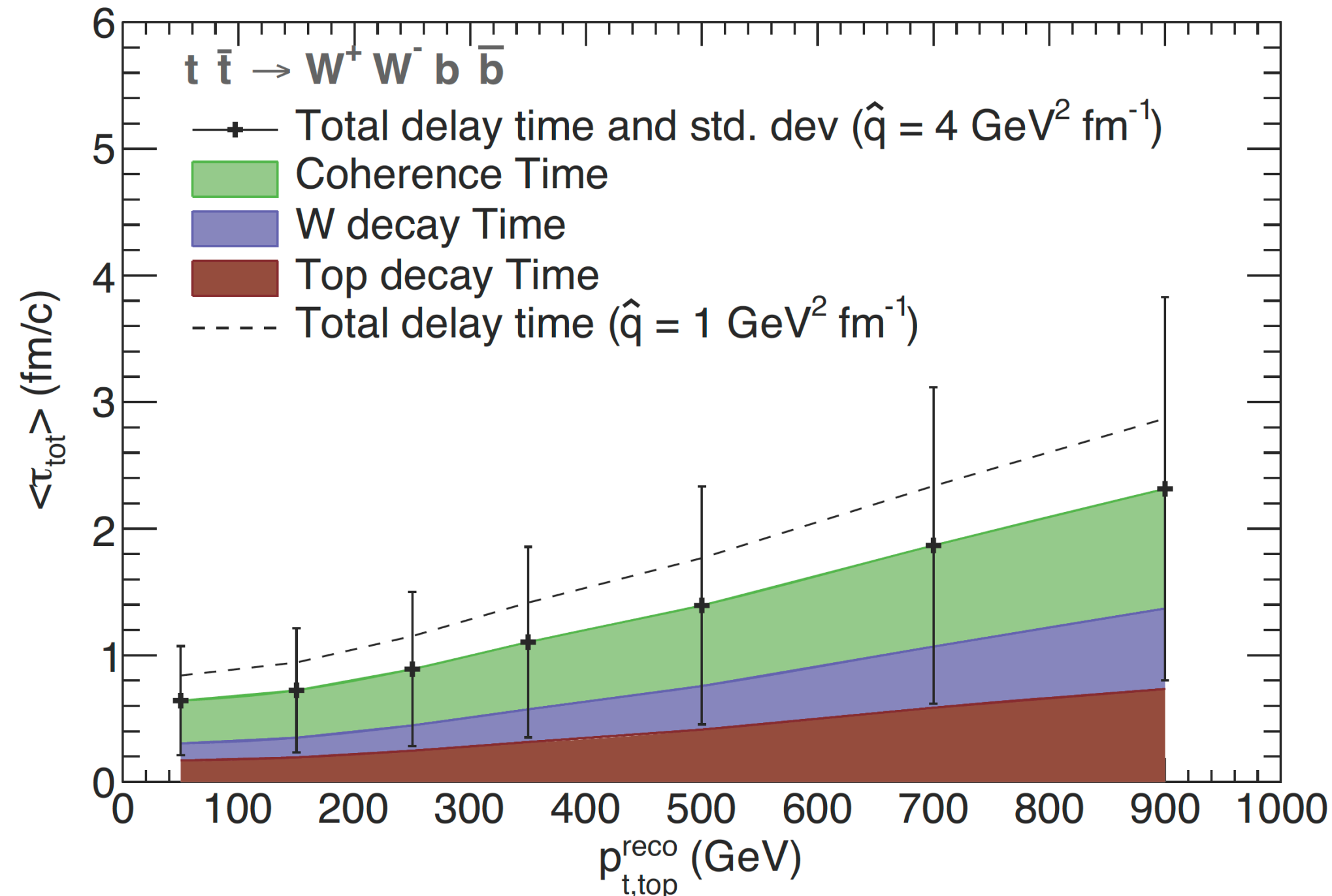
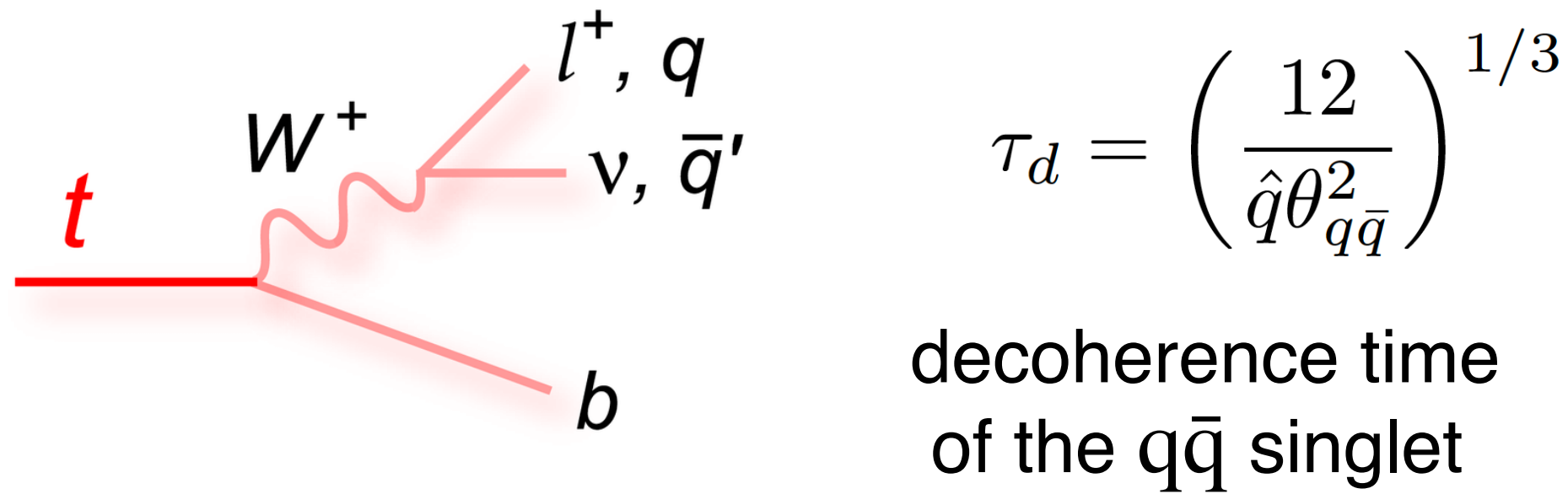
\rightarrow Based on expected yields, the measurement could be within reach with HL-LHC

Yoctosecond structure of the QGP with top quarks

→ study differentially the space-time evolution of the medium created in heavy ion collisions

$$\langle \tau_{\text{tot}} \rangle = \gamma_{t,\text{top}} \tau_{\text{top}} + \gamma_{t,W} \tau_W + \tau_d$$

L. Apolinário, J.G. Milhano, G. P. Salam, C. A. Salgado,
Phys. Rev. Lett. 120, 232301 (2018)



→ effect of quenching observed via the shift in the invariant mass of the m_{jj} of the dijet decays

BACKUP SLIDES
LHC long-plan program

