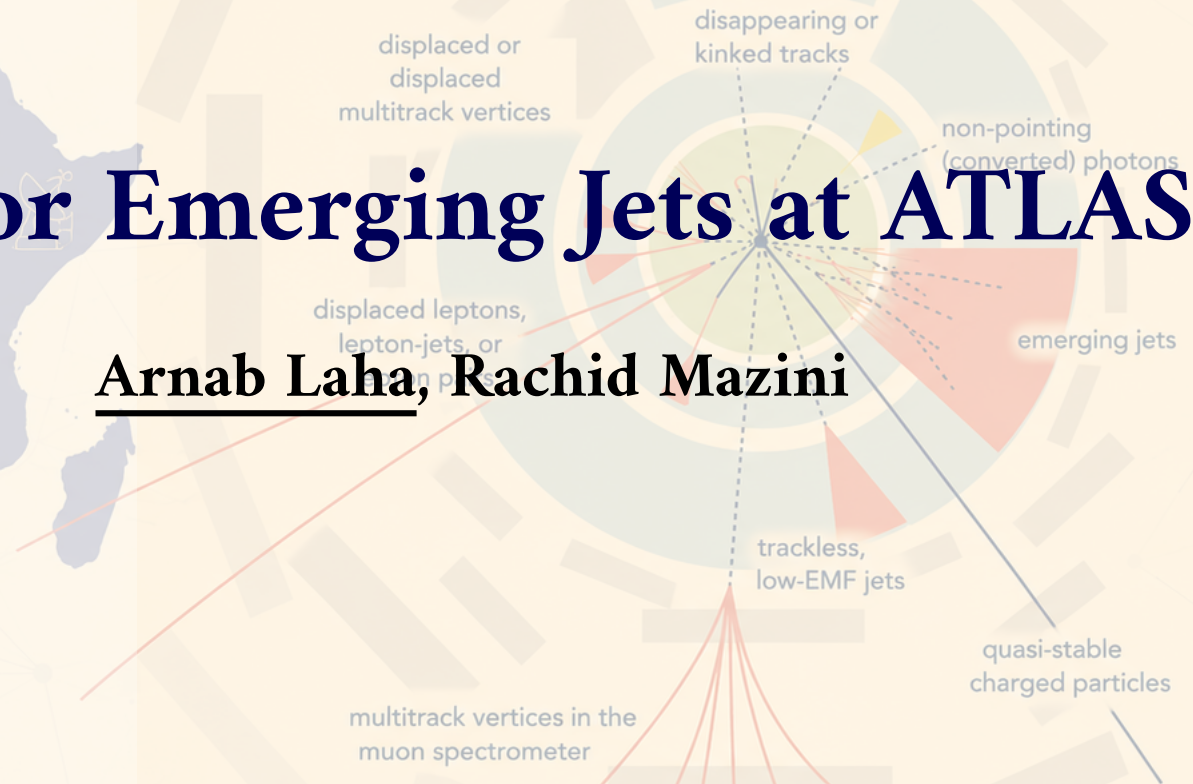


arnab.laha@cern.ch



Search for Emerging Jets at ATLAS

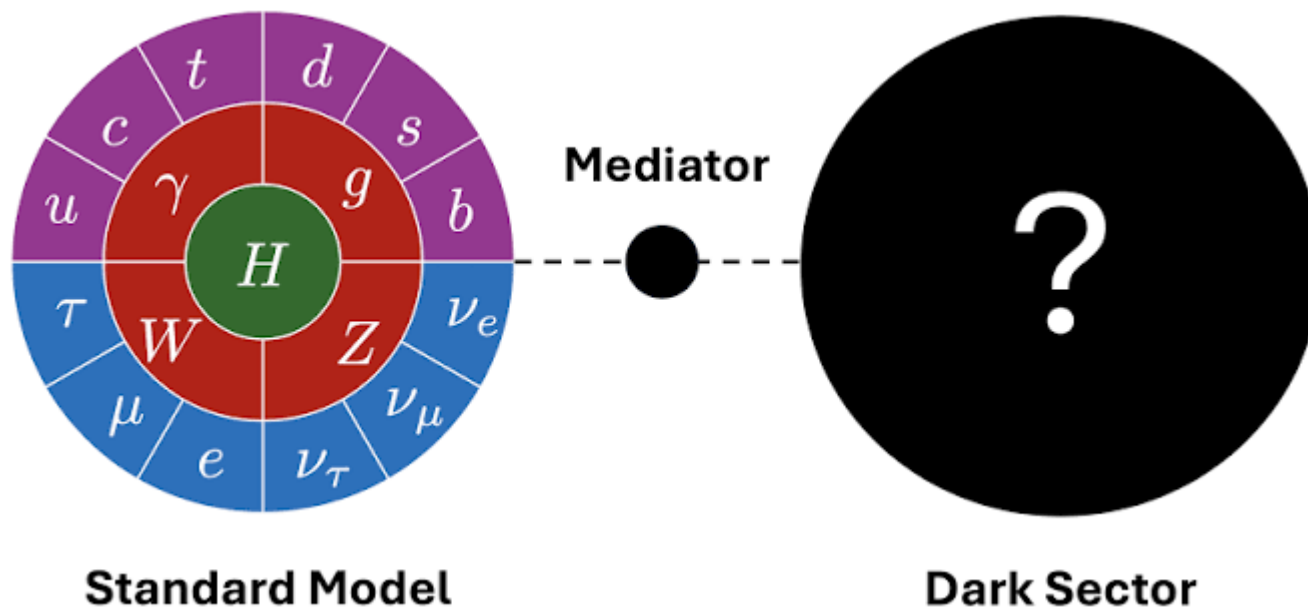
Arnab Laha, Rachid Mazini



UNIVERSITY OF THE
WITWATERSRAND,
JOHANNESBURG



A Hidden World: Beyond the Standard Model

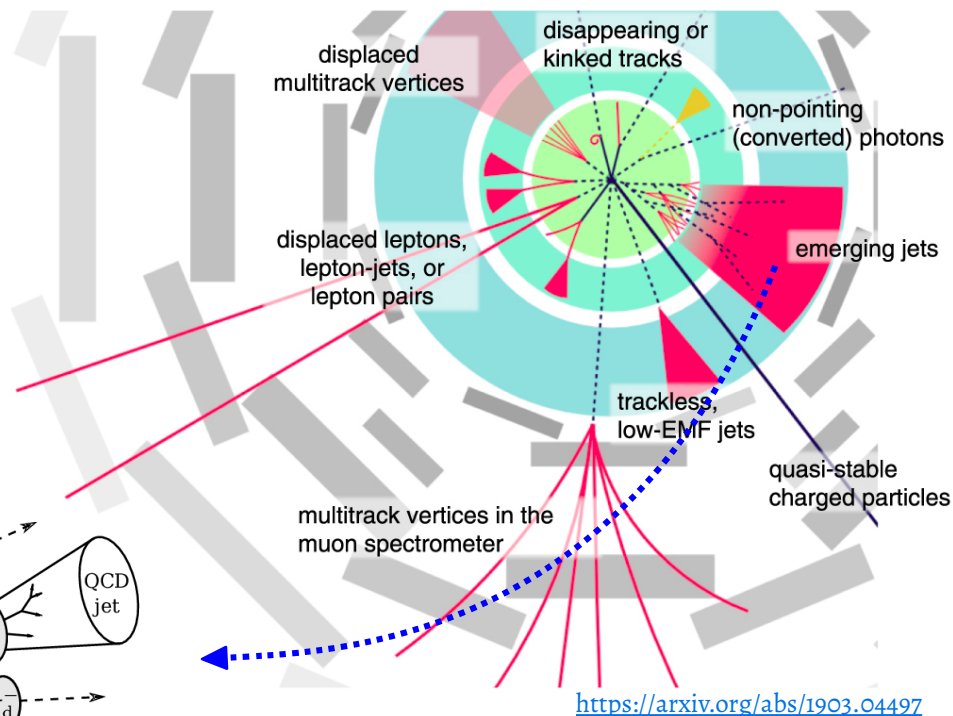
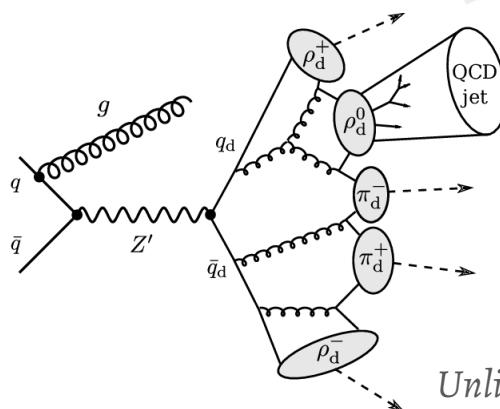
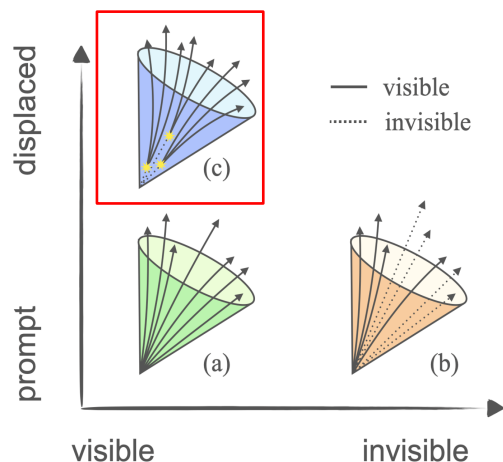


- Standard Model is incomplete; We don't know the particle nature of dark matter yet!
- **Hidden World?** A new sector of physics beyond the Standard Model which is connected to Dark Matter
 - The mediator particle(s) bridges the SM and Dark Sector

Dark QCD and Emerging Jets

Dark QCD is a popular BSM framework which extends the SM with “**dark quarks**” charged under a new $SU(N)_D$

- Dark quarks will shower and hadronize into dark meson in the dark sector before decaying back to SM quarks
- Novel signatures than QCD jets
- Emerging jets are a part of different types of **dark jets** predicted in various hidden sector models

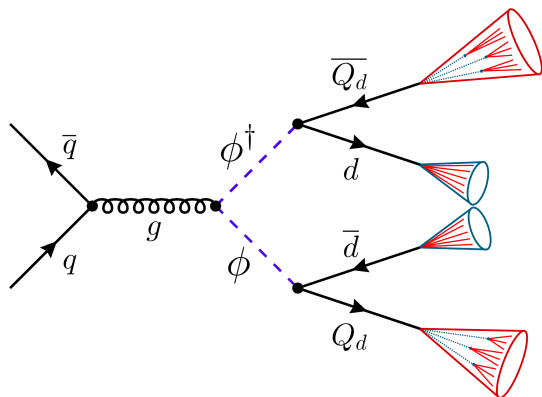


Unlike SM jets, the emerging jets develop gradually with many displaced tracks and secondary vertices.

Benchmark models

based on two ATLAS EJ searches

Run-2 search

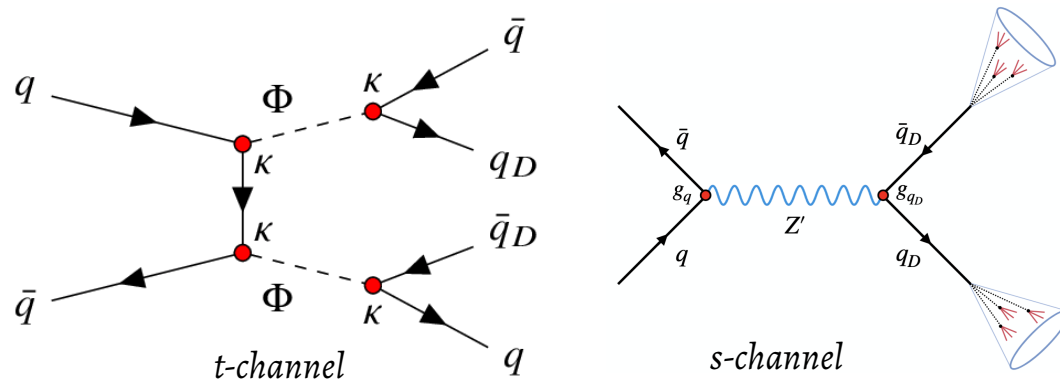


Mediator: Scalar ϕ

Production: ϕ pair production

Final State: 2 QCD Jets + 2 EJs

Run-3 search



Mediator: Scalar ϕ / Vector Z'

Production: t-channel (scalar mediated)/ s-channel

Final State: 2 Ejs (+ QCD jets in t-channel)

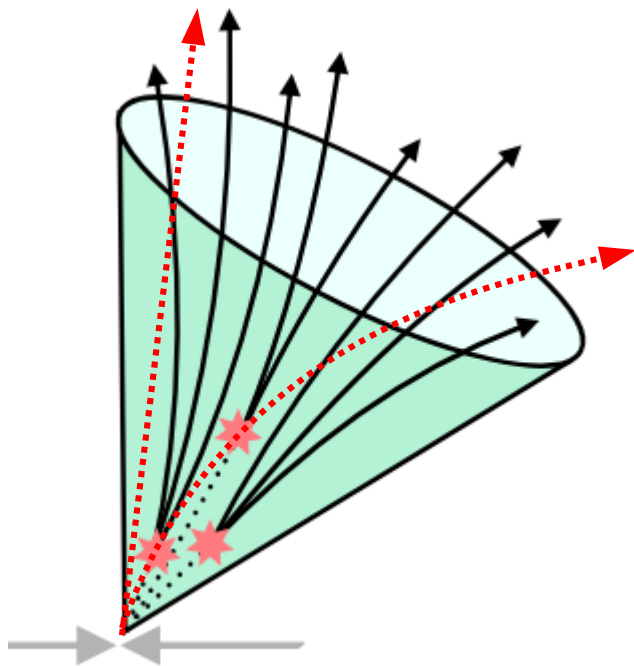
Model
parameters

$(m_{\pi_D}, \Lambda_D, m_{\rho_D})$ [GeV]	(5, 10, 20), (10, 20, 40), (20, 40, 80)
$m_{Z'}$ [TeV]	0.6, 0.8, 1.0, 1.2, 1.5, 1.8, 2.2, 2.6, 3.0, 3.5
m_Φ [TeV]	0.6, 1.0, 1.5, 2.0
$c\tau_{\pi_D}$ [mm]	1, 5, 10, 50, 100, 500, 1000

$$N_c^{\text{dark}} = 3, N_f^{\text{dark}} = 7$$

$$m_{\rho_d} = 2\Lambda_d = 2m_{q_d} = 4m_{\pi_d}$$

Anatomy of Emerging Jets

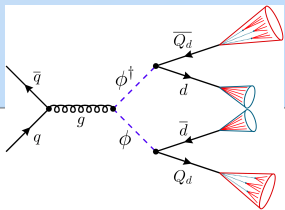


- Presence of Displaced Vertices
- More displaced tracks than **prompt tracks** experimentally
 - Prompt track fraction
- Jets substructure
 - Energy concentration inside the jet-cone is distinguishable than normal QCD jets
 - Energy correlation functions, subjettiness could probe the pronginess of the jets

- Special Large-Radius Tracking to reconstruct highly displaced tracks
- Secondary Vertices considering LRT tracks

<https://arxiv.org/abs/2304.12867>

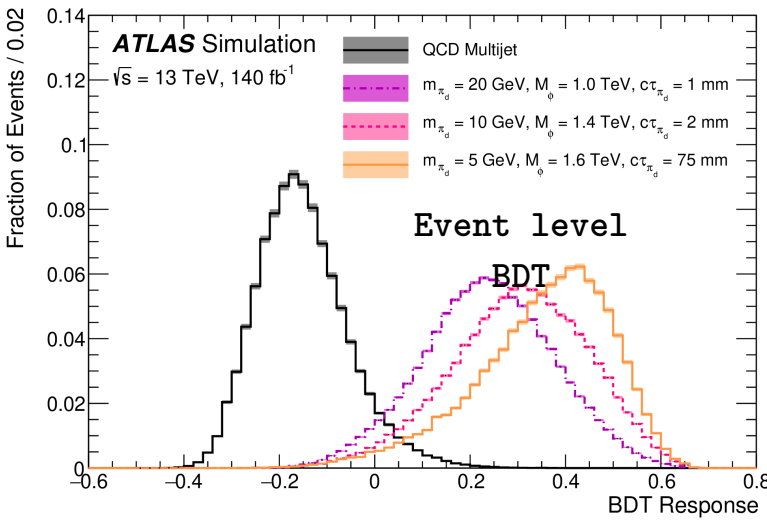
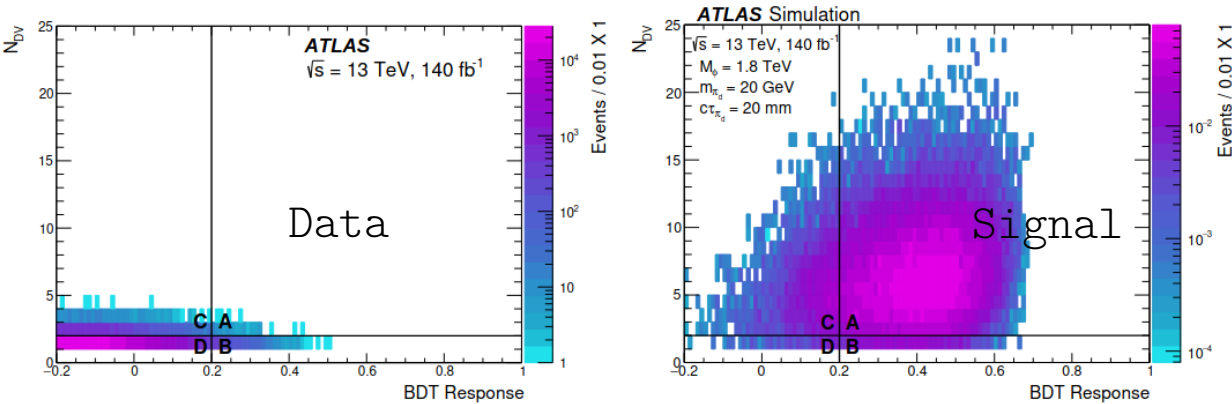
Run 2 search



- **Trigger:** at least 4 jets with $P_T > 120$ GeV
- Events are required to have at least one displaced vertex matched to a reconstructed jet
- Two stage BDT classifier:
 - **Jet-level-BDT:** Identify emerging jets
 - **Event-level-BDT:** Reduce QCD background
- **Data-driven** background estimation strategy (ABCD method)
 - Variables: N_{DV} vs Event-level-BDT score

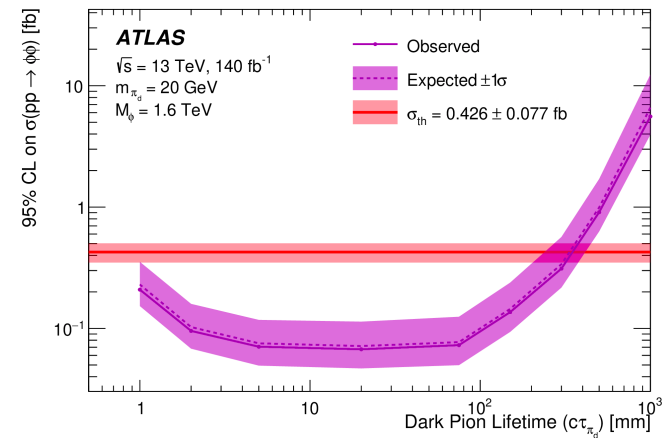
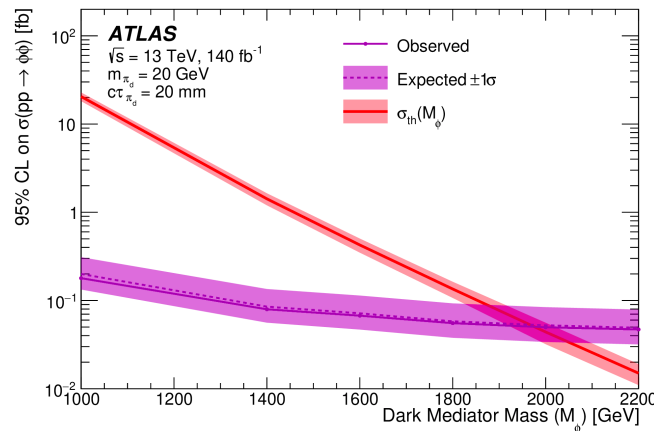
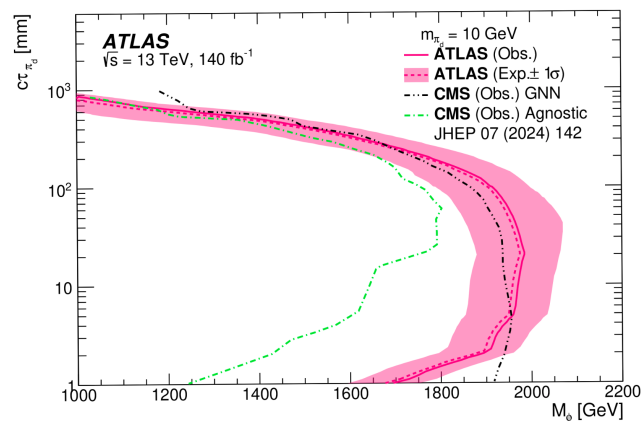
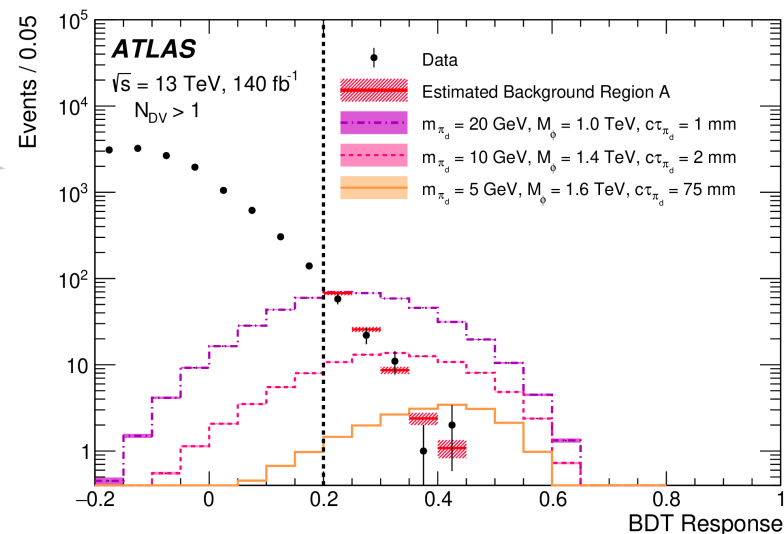
Jet-level-BDT

Observable	Description
E_{Jet}	Jet energy, measured directly from calorimeter deposits
$m_{\text{Jet}} = \sqrt{(\sum_i E_i)^2 - (\sum_i \vec{p}_i)^2}$	Jet mass, invariant mass from the sum of topological clusters
$W_{\text{Jet}} = \frac{1}{p_{T,\text{Jet}}} \sum_i p_{T,i} \Delta R_i$	Jet width, p_T -weighted angular spread of topological clusters
η_{Jet}	Jet pseudorapidity



Run 2 result

- Data agree with SM prediction
- Limits in 2D plane of ϕ Mass vs $c\tau$
- 1D limits in different model parameters

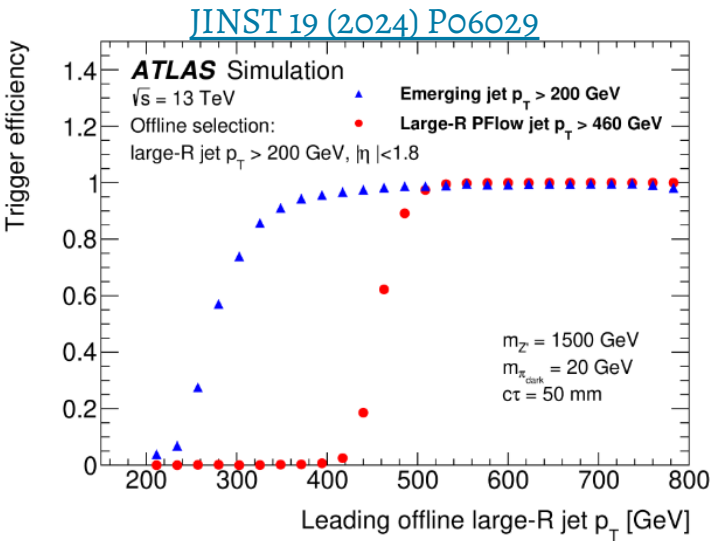


Run 3: Improved trigger and analysis strategy

- New dedicated trigger in Run 3 allows to probe lower Z' masses

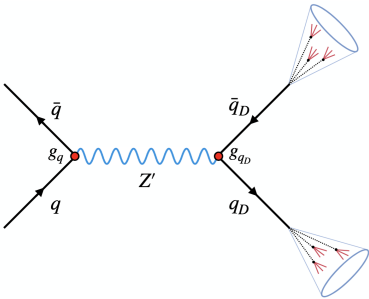
Two different triggers:

- **Standard single-jet trigger:**
 - Selects events containing a large- jet with $P_T > 460$ GeV
 - Fully efficient offline for jets with $P_T > 520$ GeV
- **Emerging Jet (EJ) trigger:**
 - Uses **Prompt Track Fraction (PTF)** as a discriminant.
 - Events selected with at least one jet having $PTF < 0.08$
 - Efficient down to much lower jet P_T than the single large-R jet trigger



Analysis Strategy

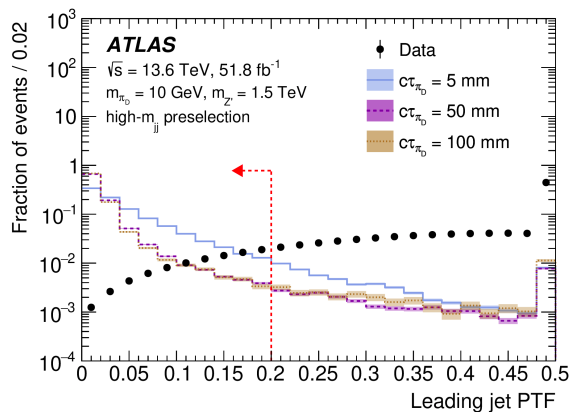
	low- m_{jj} EJ trigger & $m_{jj} < 1$ TeV	high- m_{jj} jet trigger & $m_{jj} > 1$ TeV
Cut-based	Easier Reinterpretation	
ML-based	Higher Sensitivity	



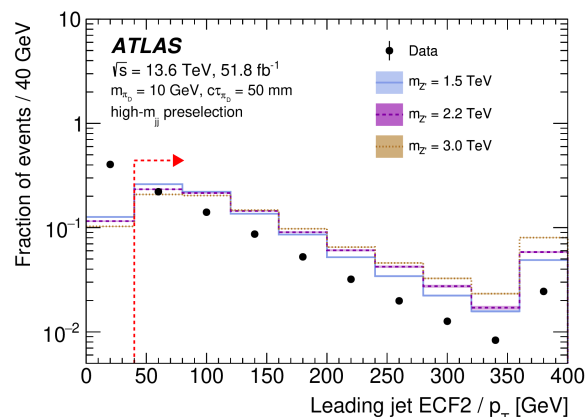
Cut Based Strategy

- Key discriminating variables to exploit emerging jets feature

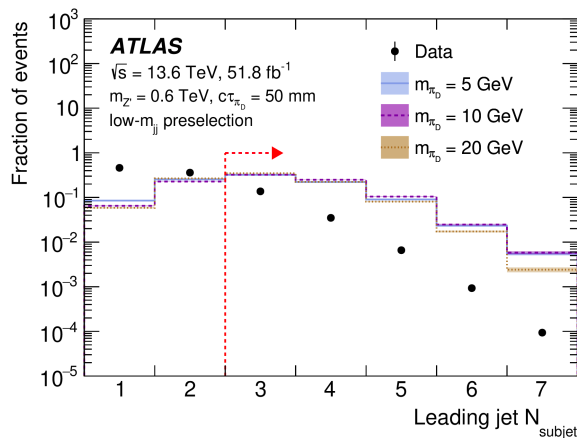
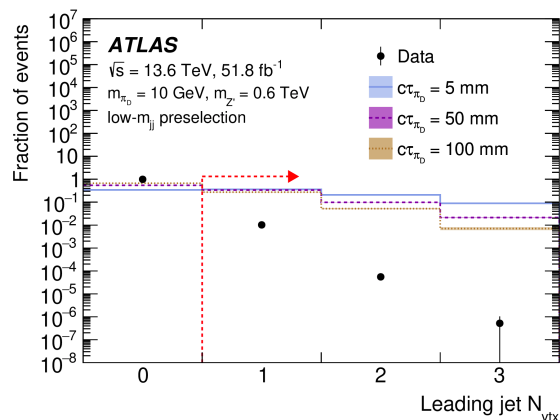
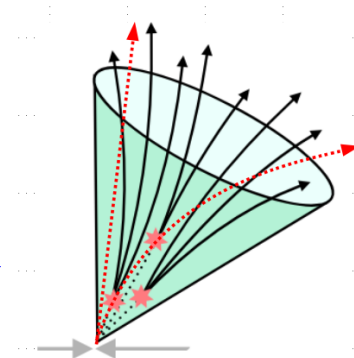
Displacement Properties



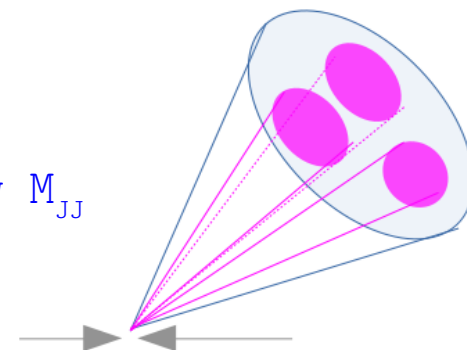
Jet substructure/ pronginess



High M_{JJ}



Low M_{JJ}

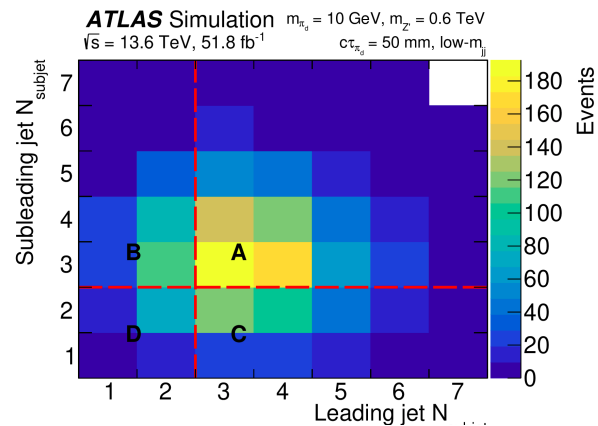
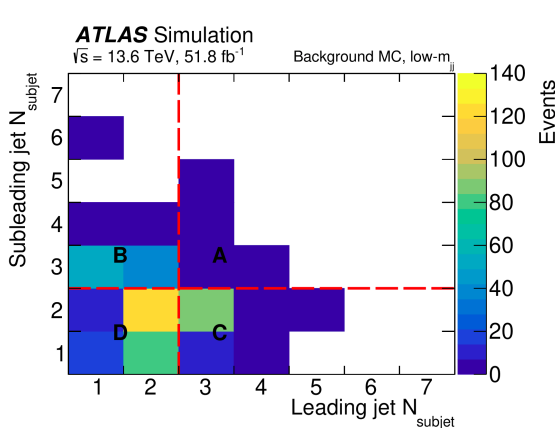


Background Estimation : ABCD method

- QCD MC is not reliable to predict background events in Signal Region
- Data-driven ABCD method is adopted in both regions

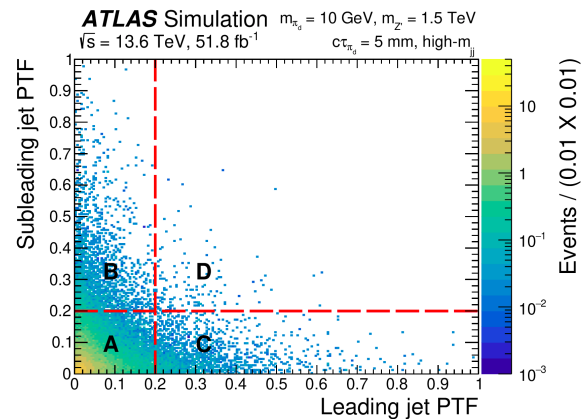
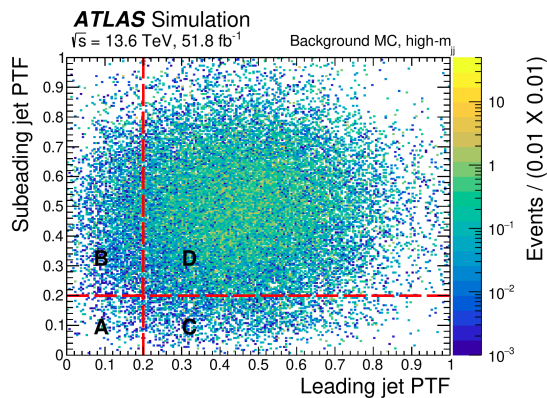
Low M_{JJ}

number of small-R jet constituents
contained in the two leading jets



High M_{JJ}

prompt track fraction
of the two leading jets

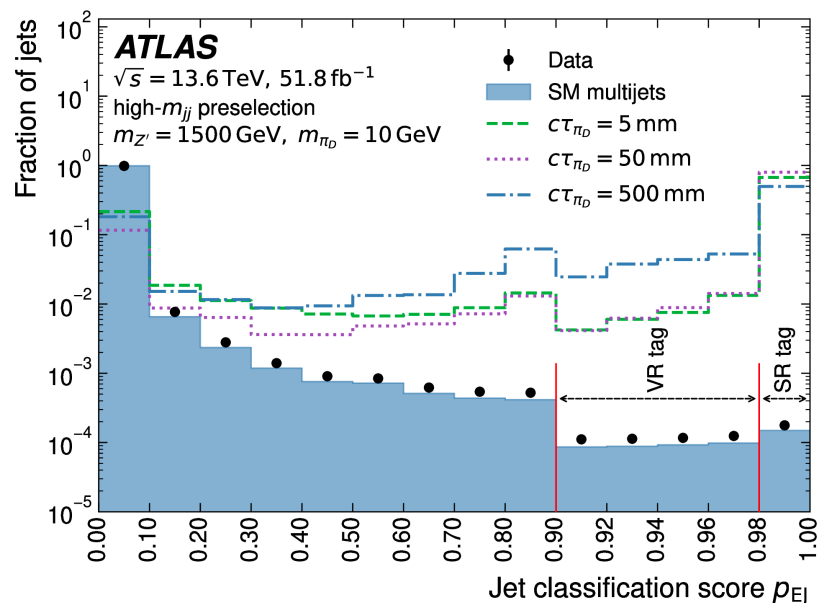


ML Strategy: Graph Neural Network

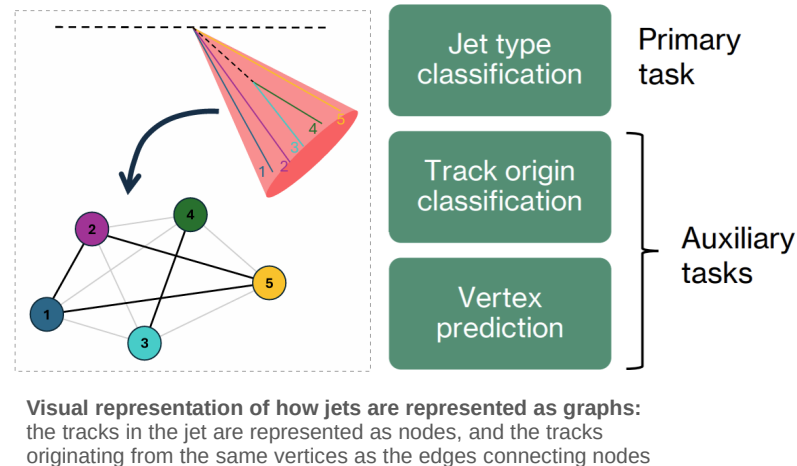
Graph Attention Network (GAT), based on GN2 b-tagging algorithm

- Track as nodes and track level features as node features
- Total Loss** = $L_{\text{jet}} + \alpha L_{\text{trk}} + \beta L_{\text{vertex}}$

GNN Score for identifying EJ



Bkg. Rejection = 2600, Signal Eff = 97.5 %
 $p_{\text{EJ}} > 0.98$



CR	SR
Events with $N_{\text{EJ}} < 2$	Events with $N_{\text{EJ}} \geq 2$
Used to estimate background	Search for EJ signal

Background Estimation: Mistag Map Method

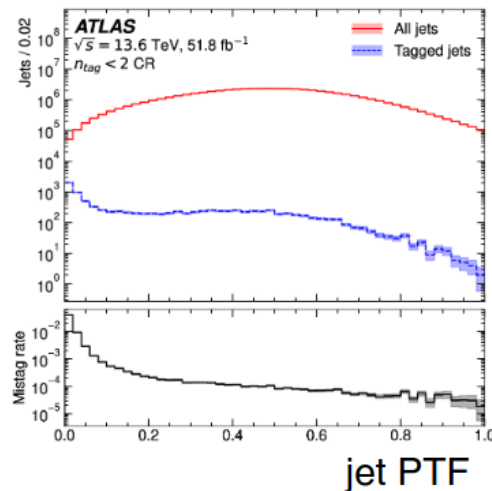
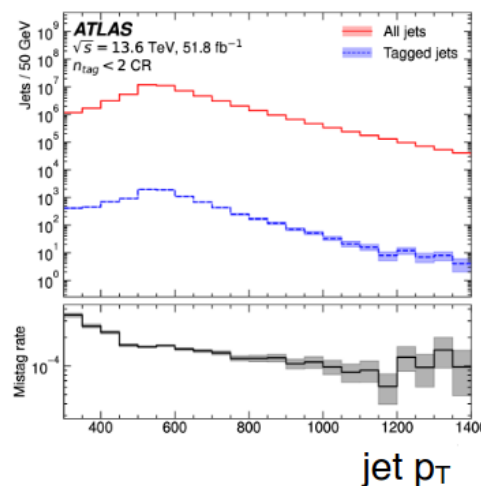
Data-driven mistag rate approach is adopted

- Probability that a bkg jet is misclassified as signal
- mistag rate determined in CR
- 2D efficiency maps using jet-level variables correlated with the GNN score

$$P(0 \text{ tag}|\text{event}) = \prod_{i=1}^{n_{\text{jet}}} (1 - P(\text{tag}|j_i))$$

$$P(1 \text{ tag}|\text{event}) = \sum_{i=1}^{n_{\text{jet}}} P(\text{tag}|j_i) \times \prod_{k \neq i} (1 - P(\text{tag}|j_k))$$

$$P(\geq 2 \text{ tag}|\text{event}) = 1 - P(1 \text{ tag}|\text{event}) - P(0 \text{ tag}|\text{event})$$



Key Limitation

- ➔ Difficult to model the correlation with tagger score in a few variables
- ➔ varying mistag rate parameterisation (nbjets, ntrk, nDV) → 23% (60%)

Results

No excess was found in any of the defined region

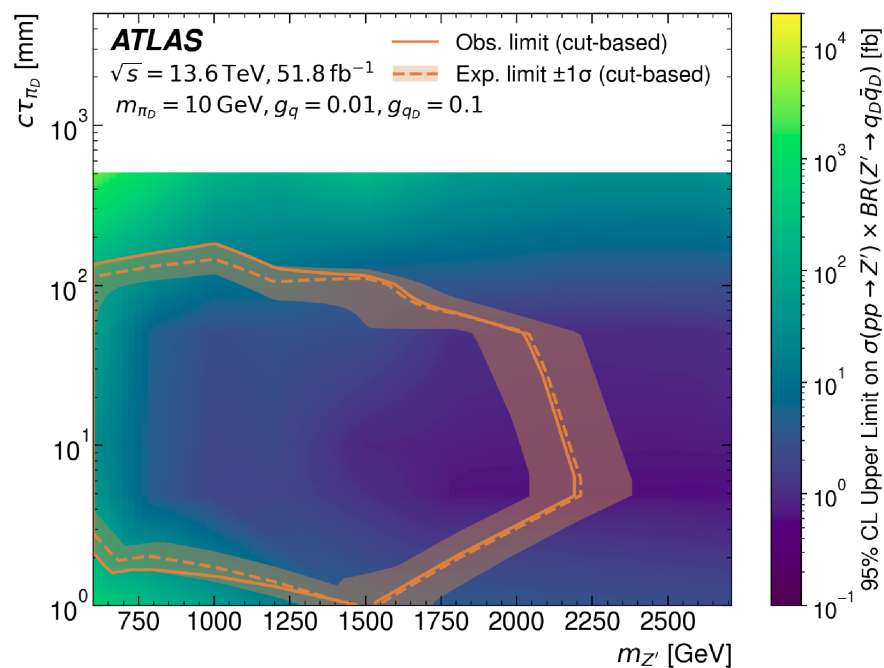
Strategy	Region	Prediction ($\pm$ stat $\pm$ syst)			Observed yield
Cut-based	High- m_{jj}	7.5	± 1.1	± 1.1	8
	Low- m_{jj}	16.6	± 4.8	± 4.8	10
ML-based	High- m_{jj}	4.5	± 0.3	± 2.8	3
	Low- m_{jj}	31.8	± 0.8	± 7.5	24

Simultaneous fit of low and high m_{jj} regions for each approach in the limit interpretation

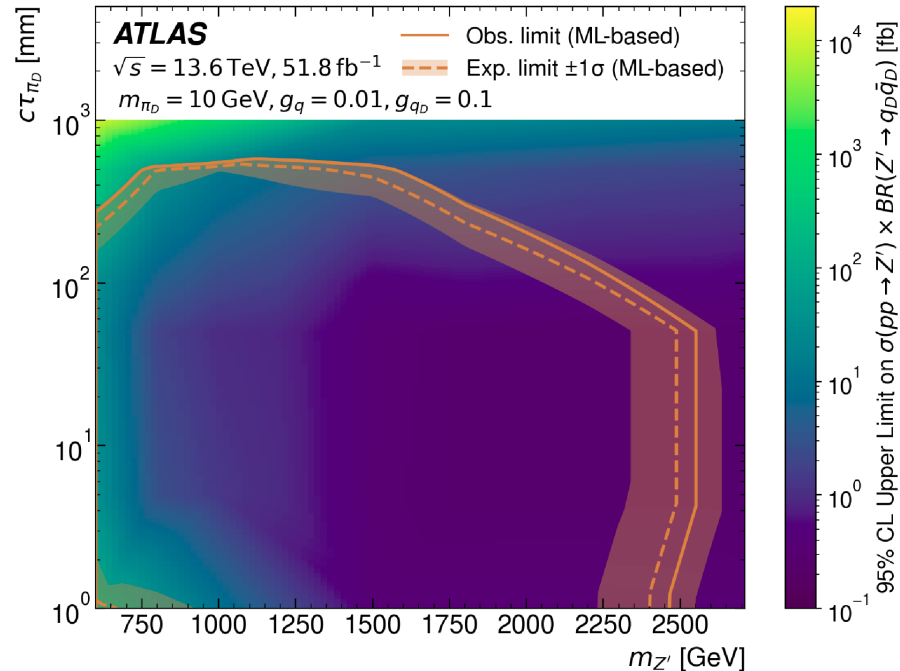
Results : s-channel

- Results are interpreted as cross-section $\times$ BR limits vs proper decay length and Z' mass
 - ML-based set limits about a order of magnitude more stringent than cut-based

Cut based



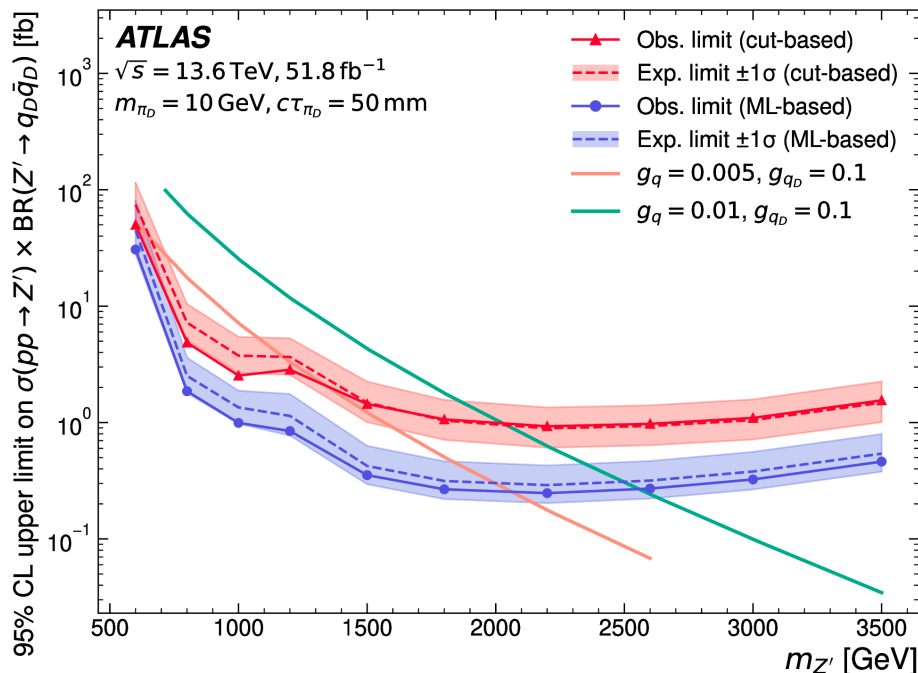
ML based



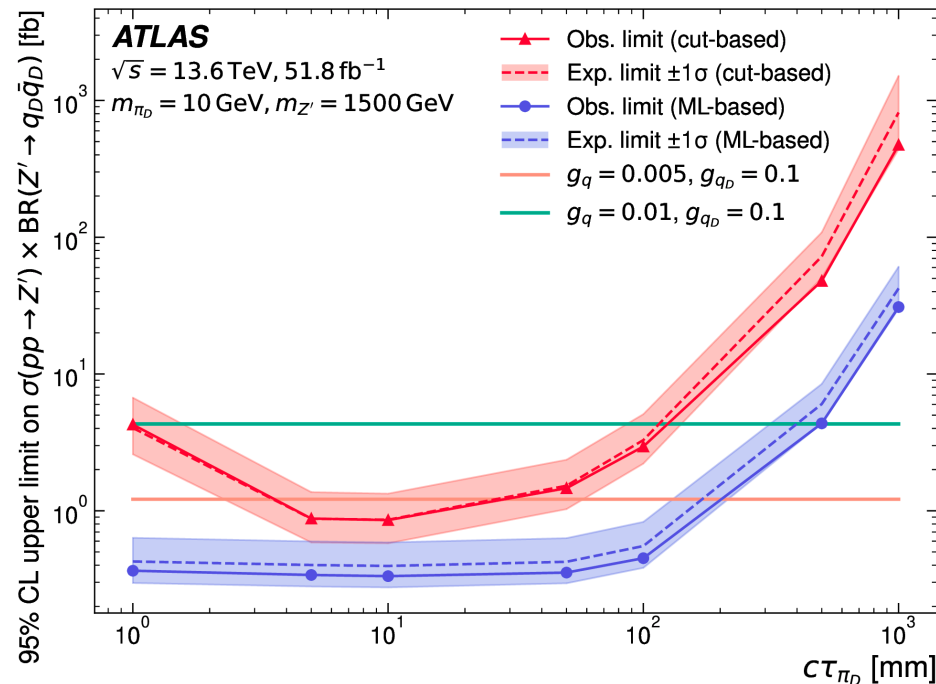
Results: s-channel

- EMJ trigger allows to probe low Z' mass phase-space
- Track reconstruction limitations at boosted regime

Limit on cross-section as $M_{Z'}$ varies

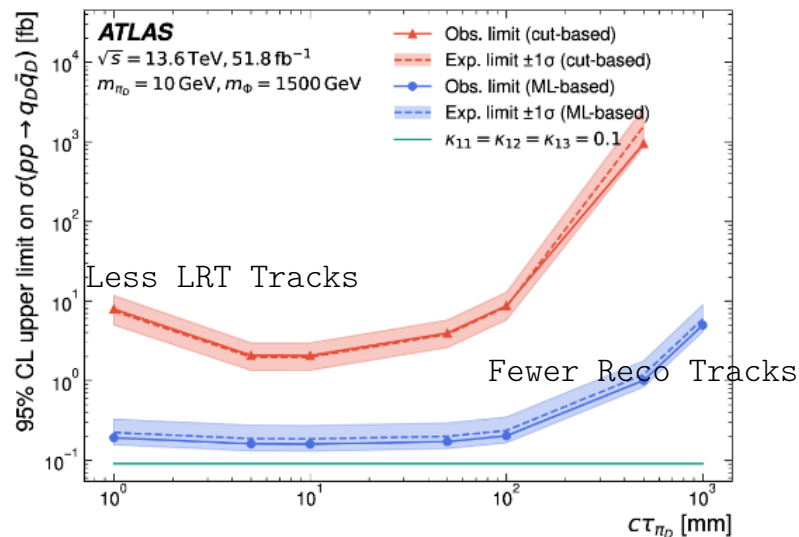
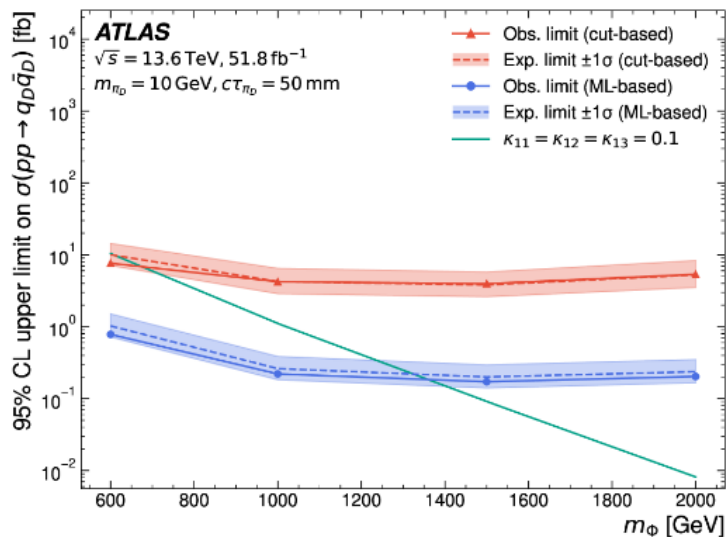
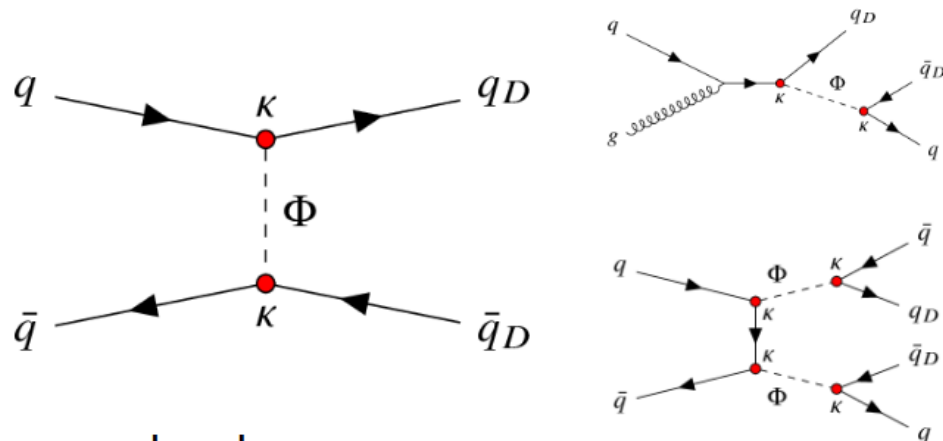


Limit on cross-section as $c\tau$ varies



Results: t-channel

- Low sensitivity in cut-based strategy due to presence of extra SM jets
 - ABCD method based on leading and subleading jet of the event
- ML-based approach is magnitude more sensitive



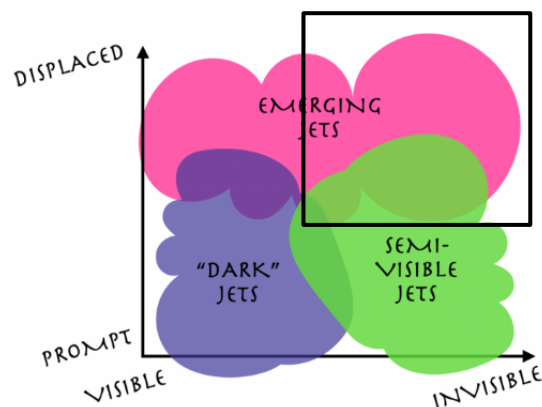
Looking ahead: towards Full Run 3

- Full Run 3 analysis is ongoing to improve on several aspects of the previous analysis beyond luminosity benefits

Stay tuned! 😊

Benchmark Model

- Consistent model parameters across experiments
- Simplified model
- Semivisible Emerging Jets?



Cut-based tagger

- Going away from ABCD method to tackle stat limitation issue
- Improvement in both models
- Relying on jet-level properties

What's new for Full Run 3 Analysis?

- Harmonize background estimation
- Improvement in Mistag Map method
- BDT-based mistag rate

Anomaly Detection
Channel to be sensitive
to a wide range of models

Re-interpretation

- Challenging due to extensive model parameters
- ML-models to map truth level
 - reco level selection efficiency?

Back up

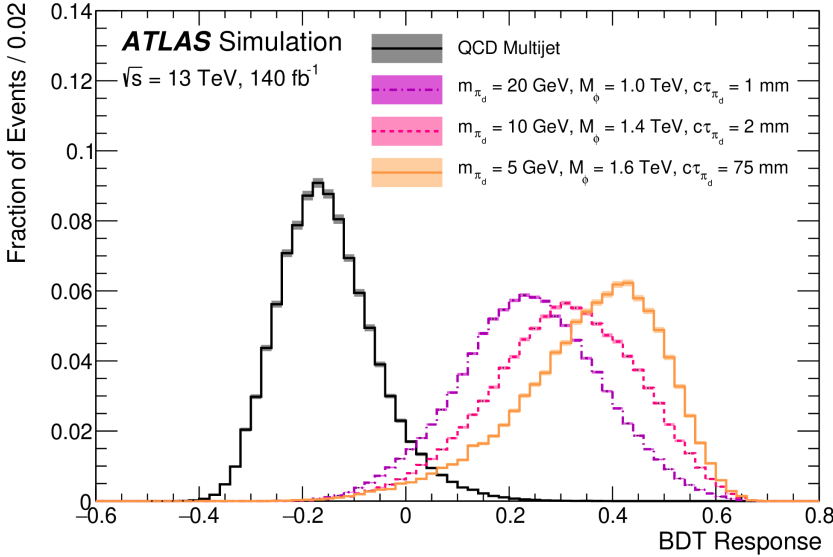
Run-2 search

Jet-level-ML

Observable	Description
E_{Jet}	Jet energy, measured directly from calorimeter deposits
$m_{\text{Jet}} = \sqrt{(\sum_i E_i)^2 - (\sum_i \vec{p}_i)^2}$	Jet mass, invariant mass from the sum of topological clusters
$W_{\text{Jet}} = \frac{1}{p_{\text{T}}^{\text{Jet}}} \sum_i p_{\text{T},i} \Delta R_i$	Jet width, p_{T} -weighted angular spread of topological clusters
η_{Jet}	Jet pseudorapidity

Event-level-ML

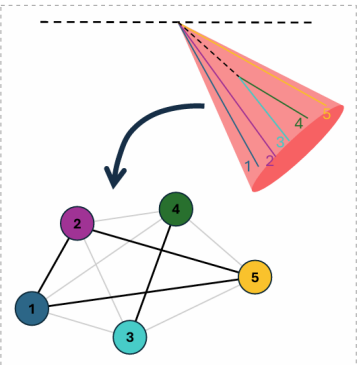
Observable	Description
R_{Jet}^{1-4}	BDT response of the four highest p_{T} jets, individually
$H_{\text{T}} = \sum_{j=1}^4 p_{\text{T},j}$	Scalar sum of the four highest p_{T} jet transverse momenta
minPTF	The minimum PTF value in the four highest p_{T} jets
N_{Jet}	Reconstructed jet multiplicity
S_{T}	Transverse Sphericity



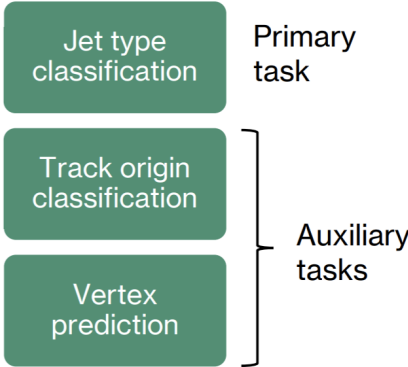
ML Strategy: Graph Neural Network

Graph Attention Network (GAT), based on GN2 b-tagging algorithm

- Leveraging ATLAS GN2 flavour tagging architecture based on transformers
- Each node (track hit) receives weighted inputs from neighbors
- Weights (α_{tt}) determine feature importance for LLP tagging.
- **Total Loss = $L_{\text{jet}} + \alpha L_{\text{trk}} + \beta L_{\text{vertex}}$**



Visual representation of how jets are represented as graphs: the tracks in the jet are represented as nodes, and the tracks originating from the same vertices as the edges connecting nodes



G.Gustavino's LHC Seminar

low-level track inputs

up to 200 tracks per jet from QCD and EJ

Input	Description
Jet η	Jet pseudorapidity
d_0	Track closest distance to PV in transverse plane
$z_0 \sin(\theta)$	Track closest distance to PV in longitudinal plane
$\Delta\phi$	Azimuthal angle of the track, relative to the jet ϕ
$\Delta\eta$	Track pseudorapidity, relative to jet η
q/p	Track charge over momentum
$\sigma(\phi)$	Uncertainty in track ϕ
$\sigma(\theta)$	Uncertainty in track θ
$\sigma(q/p)$	Uncertainty in track q/p
$d_0/\sigma(d_0)$	signed d_0 significance
$z_0/\sigma(z_0)$	signed z_0 significance
$N_{\text{PIX hits}}$	Number of Pixel hits per track
$N_{\text{SCT hits}}$	Number of SCT hits per track
$N_{\text{IBL hits}}$	Number of innermost pixel layer hits
$N_{\text{PIX shared}}$	Number of Pixel shared hits
$N_{\text{SCT shared}}$	Number of SCT shared hits

Run 3 search

Event Selections

Preselection	Low- m_{jj}	High- m_{jj}
leading jet p_{T}	–	$> 520 \text{ GeV}$
subleading jet p_{T}	–	$> 300 \text{ GeV}$
trigger-matched jet	$p_{\text{T}} > 250 \text{ GeV}, \text{PTF} < 0.04$	–
leading and subleading jet PTF	< 1.0	
leading and subleading jet ΔPTF	< 0.4	
leading and subleading jet N_{vtx}	≥ 1	
leading and subleading jet $\text{ECF2}/p_{\text{T}}$	–	$> 40 \text{ GeV}$
m_{jj}	$< 1 \text{ TeV}$	$> 1 \text{ TeV}$
number of jets	≥ 2	
Signal Region		
leading and subleading jet N_{subjet}	≥ 3	–
leading and subleading jet PTF	–	< 0.2

Limit on g_q vs g_{qd}

