



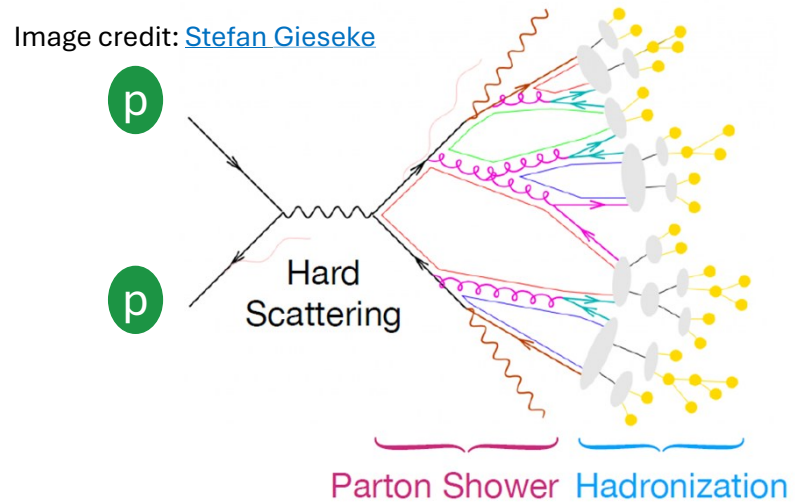
Probing Non-Perturbative QCD with Jet Substructure Measurements at STAR

Youqi Song, UC Berkeley
RHIC/AGS Users Meeting
5/13/26

This work is supported by:

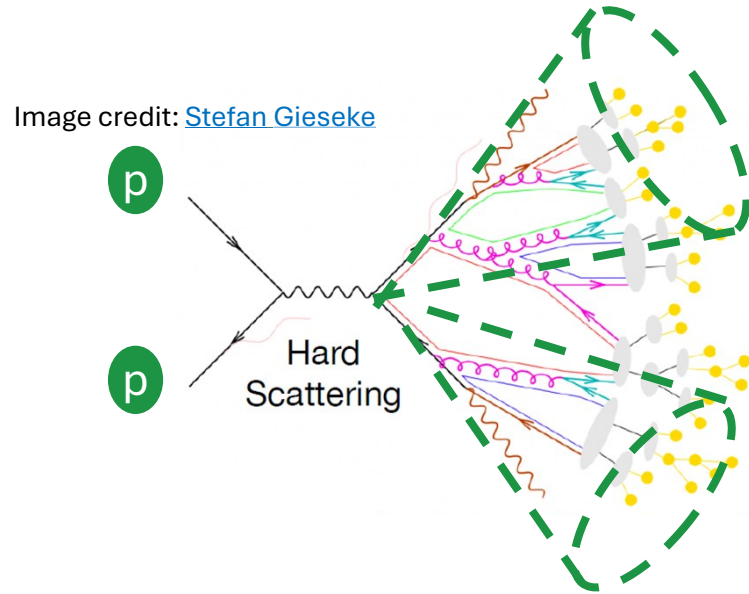


Jets and jet substructure



- Jets: collimated sprays of final-state hadrons

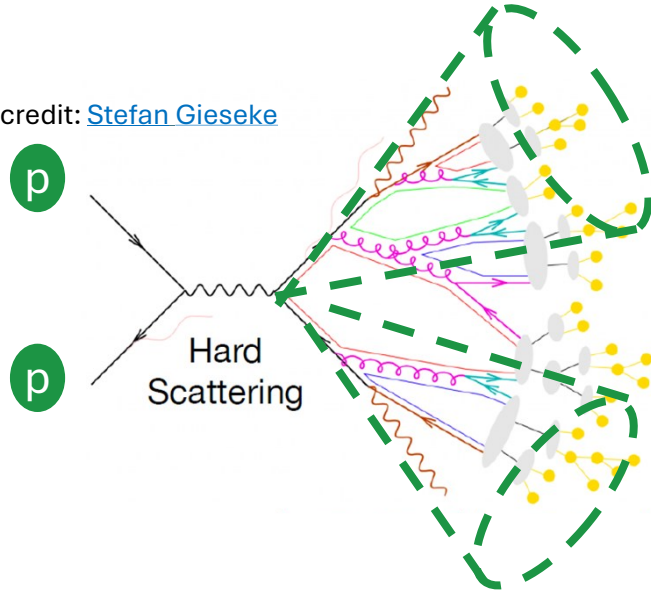
Jets and jet substructure



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Jets and jet substructure

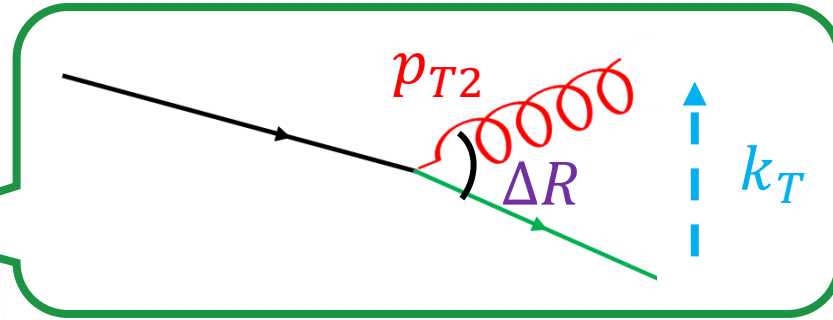
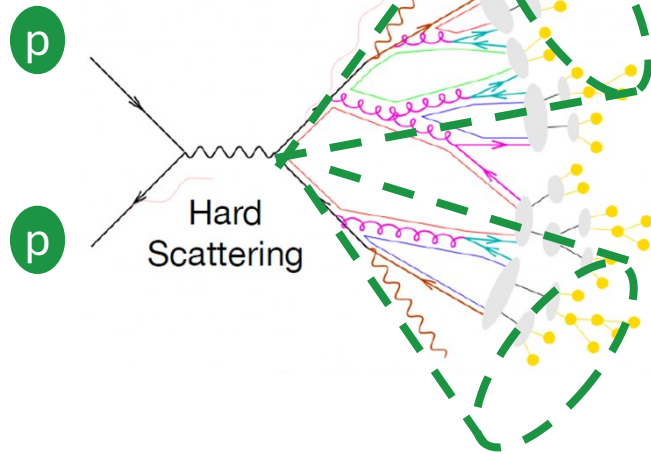
Image credit: [Stefan Gieseke](#)



- Jet substructure studies: access to parton shower and hadronization processes that produce jets
 - Algorithmic reclustering, e.g. SoftDrop grooming

Jets and jet substructure

Image credit: [Stefan Gieseke](#)

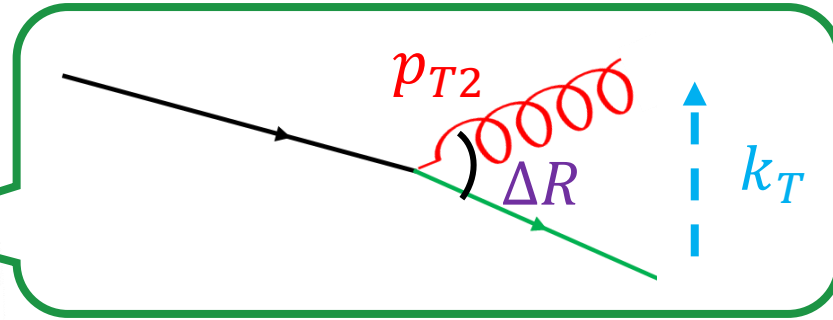
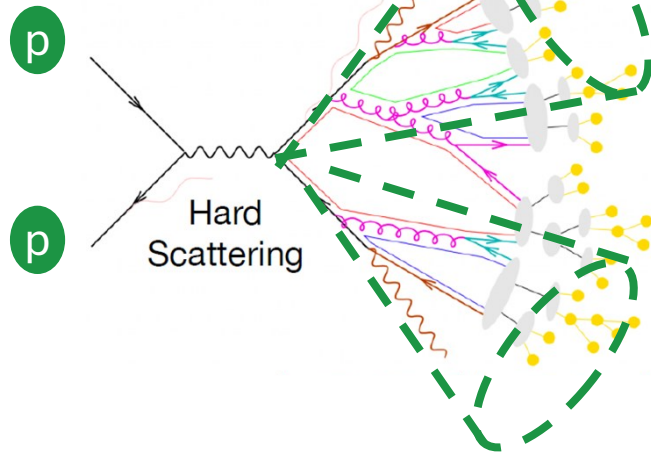


$$k_T = p_{T2} \times \sin(\Delta R)$$
$$z = p_{T2} / p_T$$

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Jets and jet substructure

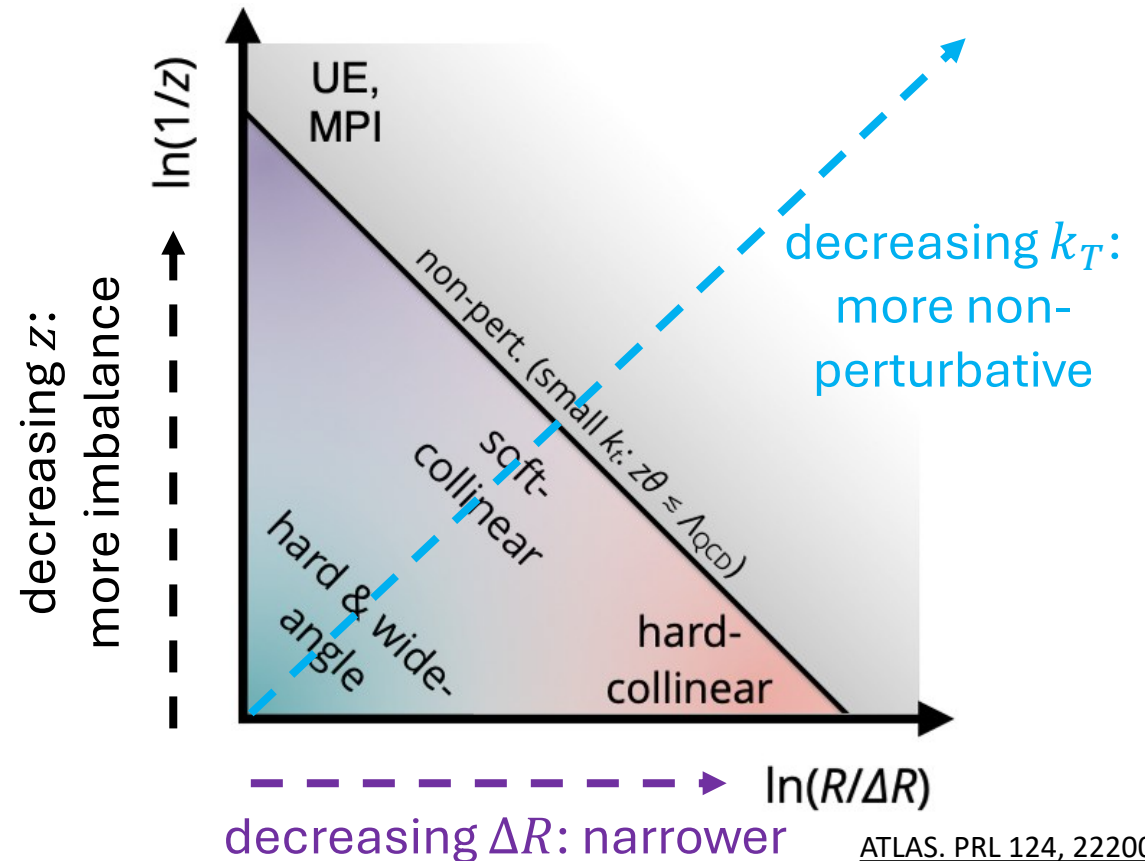
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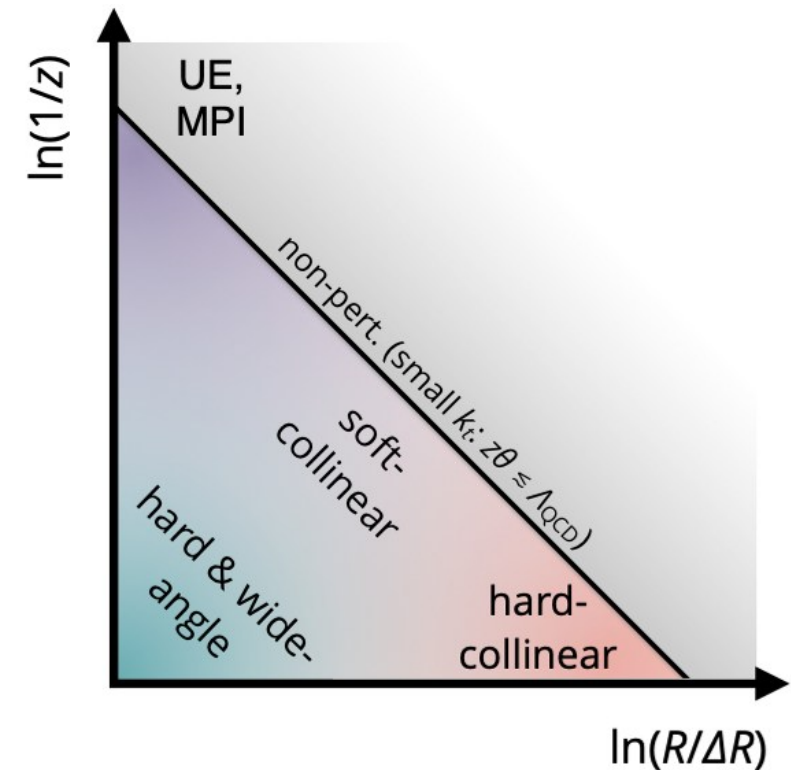
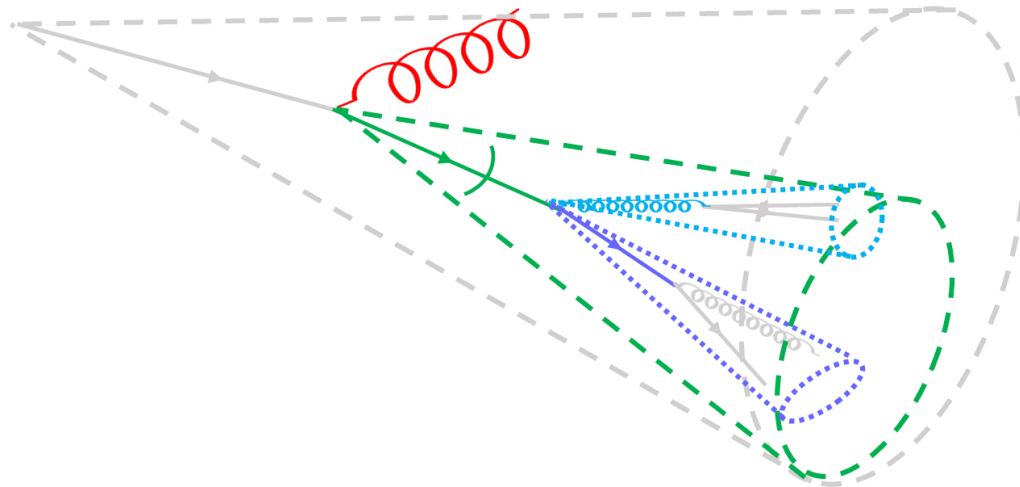


ATLAS. PRL 124, 222002 (2020)

CollinearDrop-SoftDrop correlation

Aims to probe the **soft-hard** correlation within a jet

- How does the amount of soft radiation correlate with the angular and momentum scale of a hard splitting? → How does an **early** emission affect a **later** splitting?*

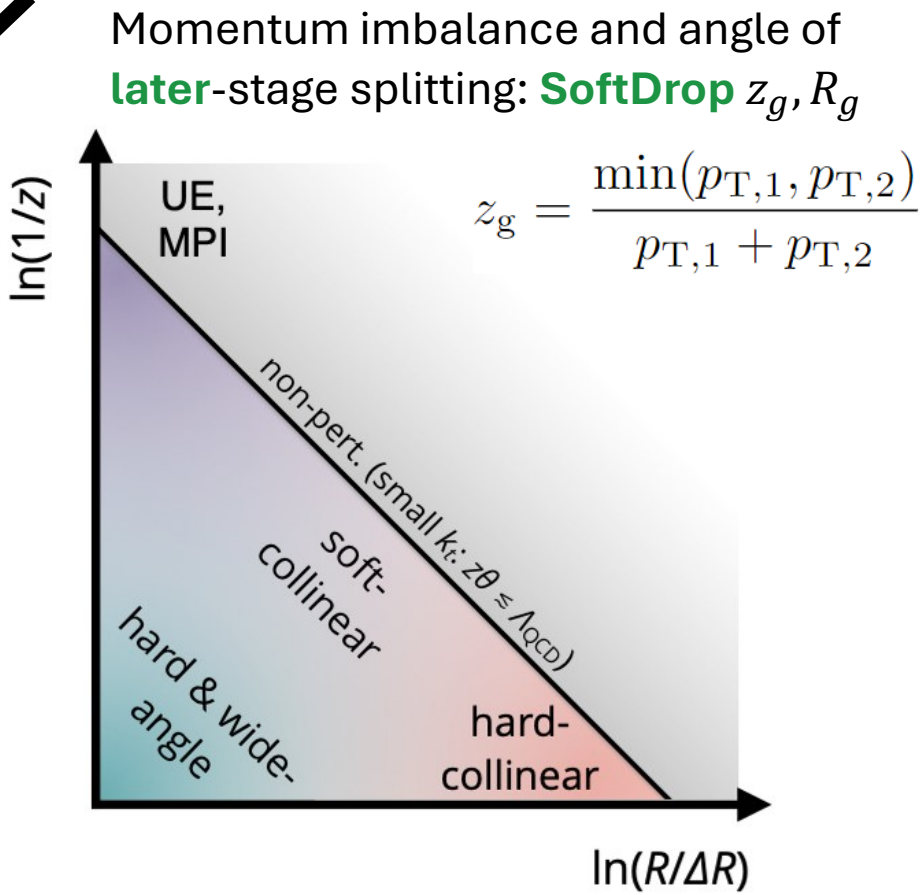
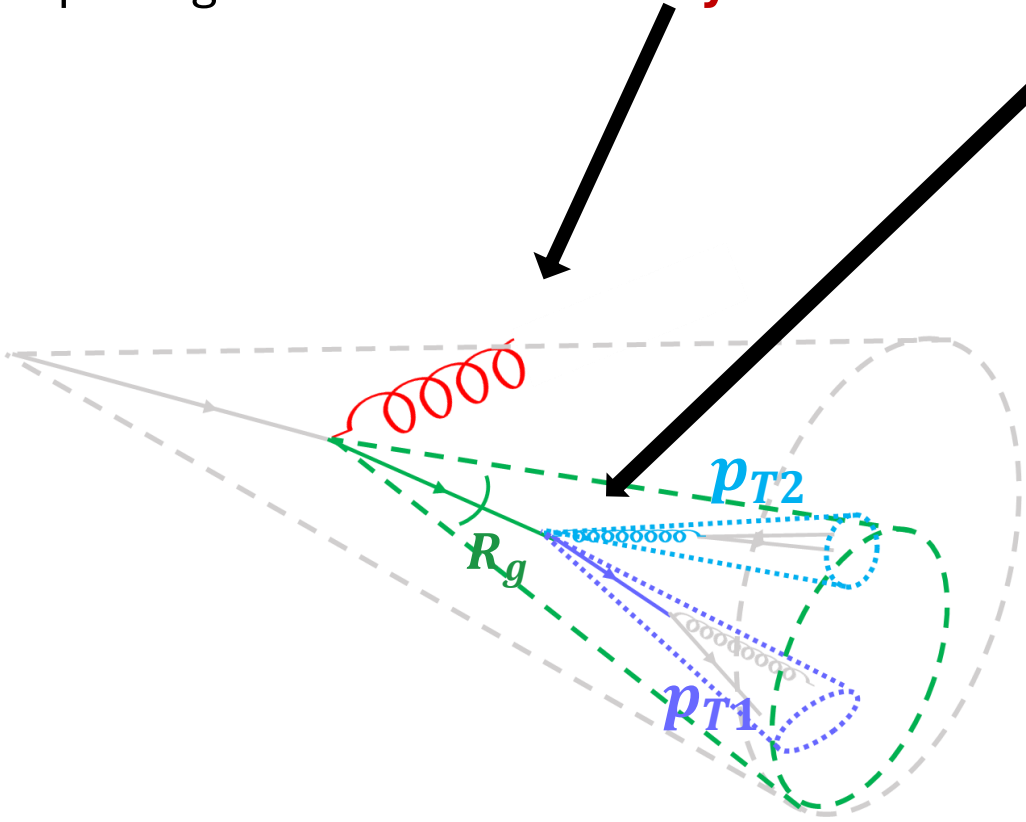


*Assuming angular ordering of parton shower

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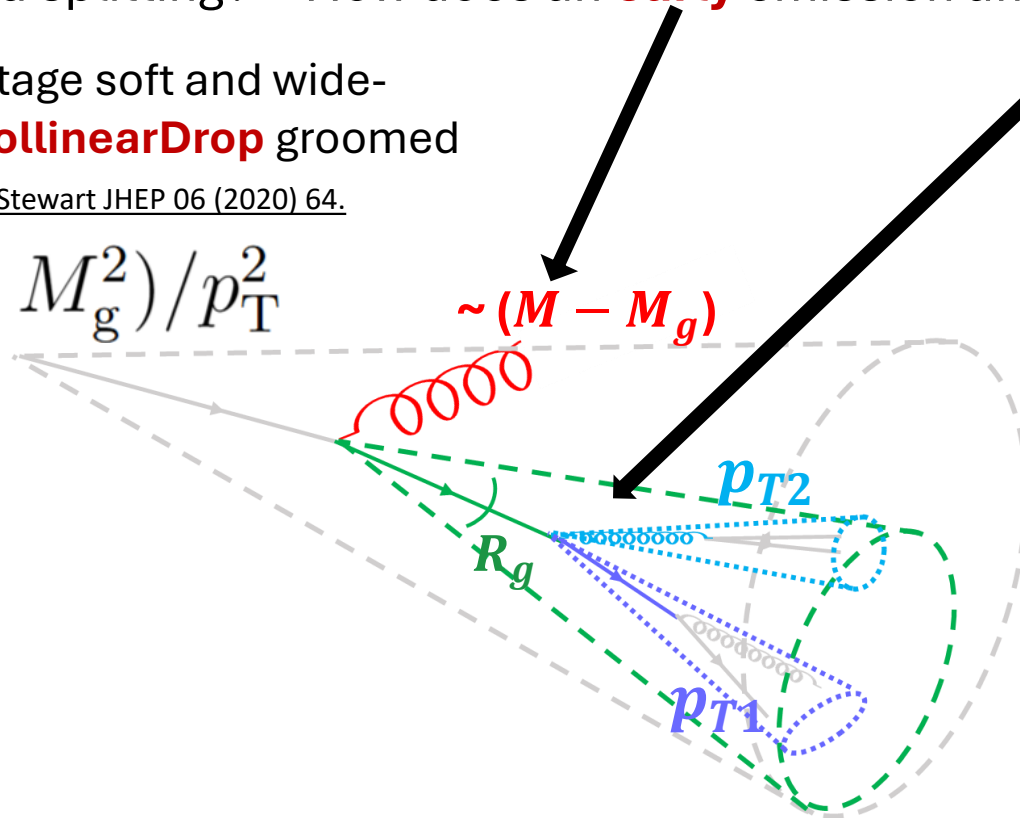
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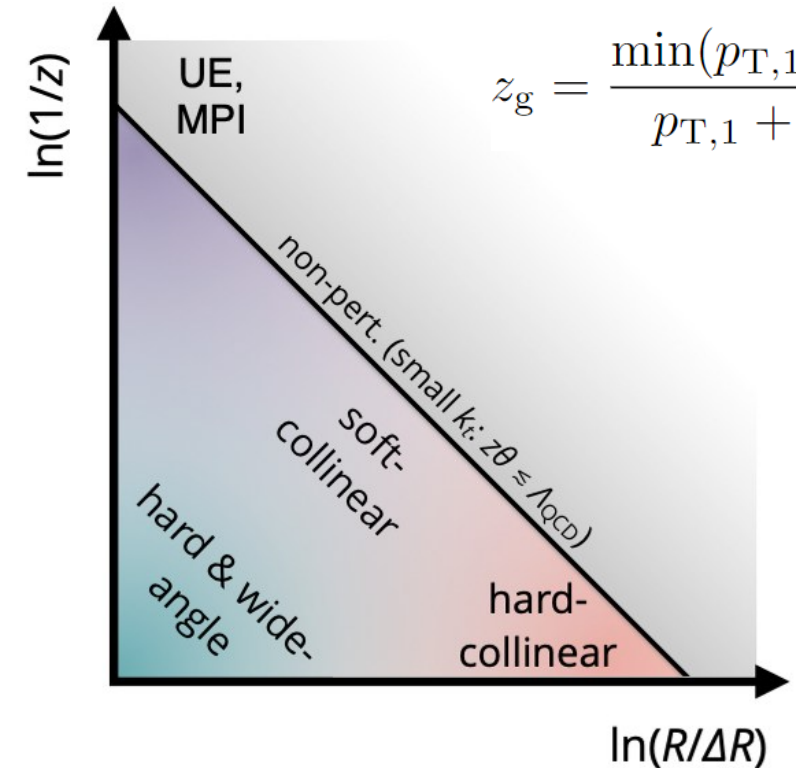
Amount of **early**-stage soft and wide-angle emission: **CollinearDrop** groomed jet mass Chien and Stewart JHEP 06 (2020) 64.

$$(M^2 - M_g^2) / p_T^2$$



Momentum imbalance and angle of **later**-stage splitting: **SoftDrop** z_g, R_g

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



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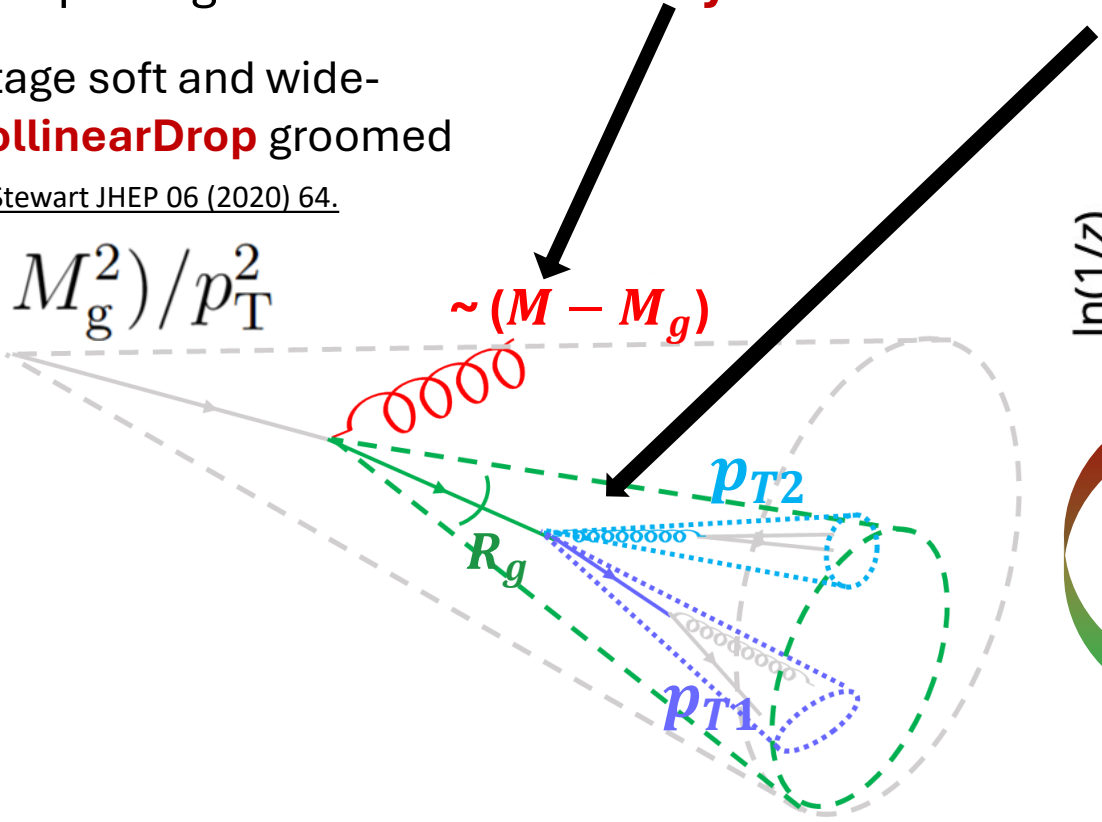
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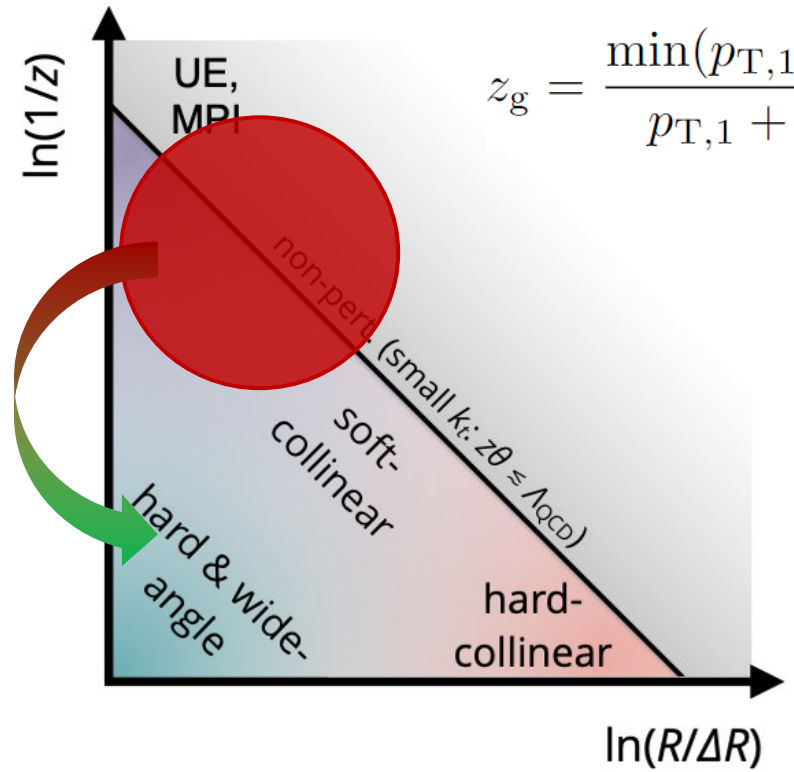
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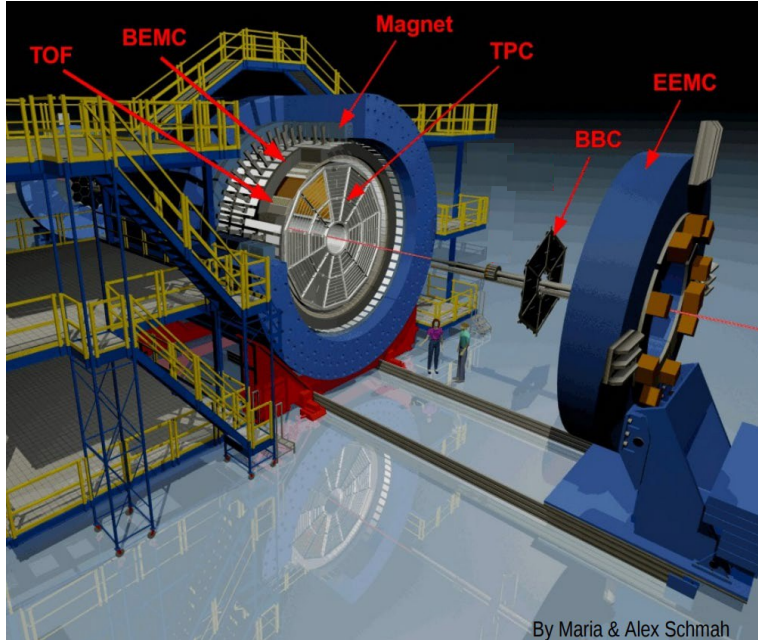
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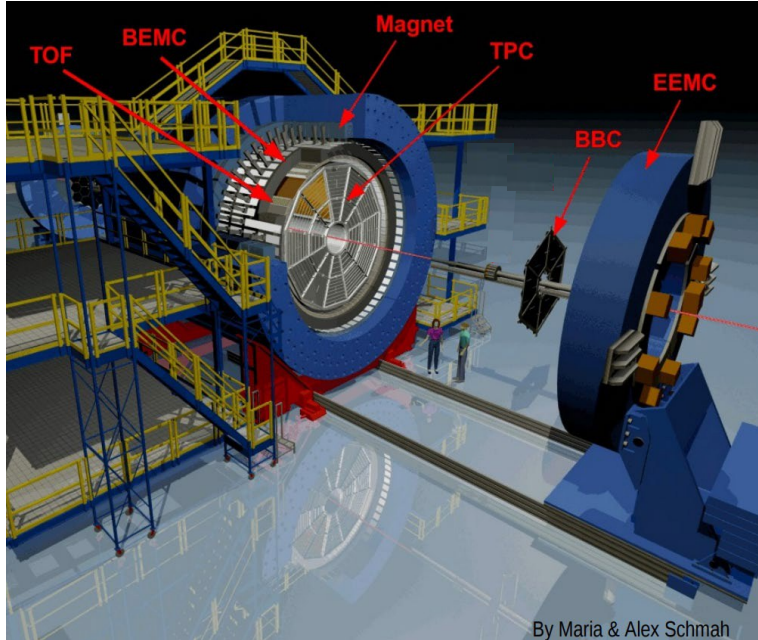
Measurement overview



Measure jets in $\sqrt{s} = 200$ GeV pp collisions
with the **STAR** detector

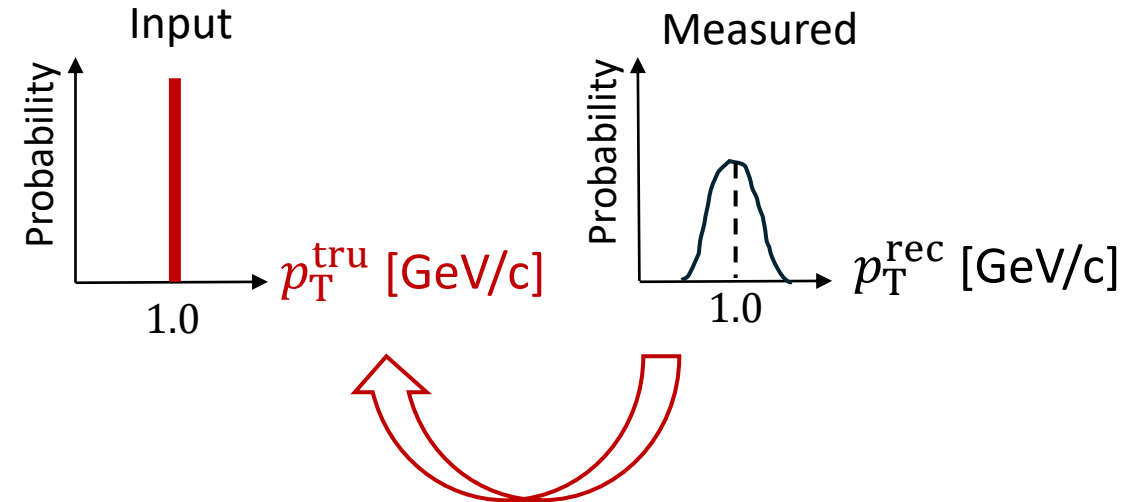
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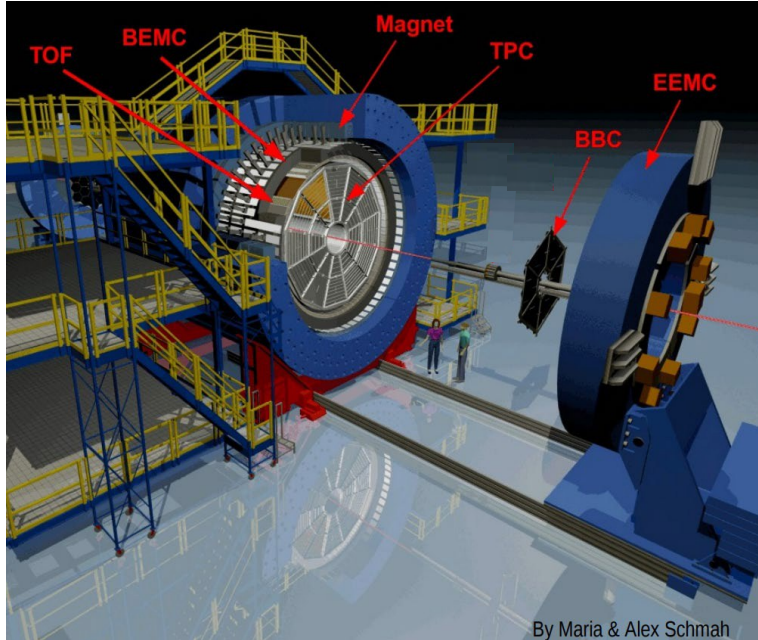
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Unfolding: correcting for detector effects

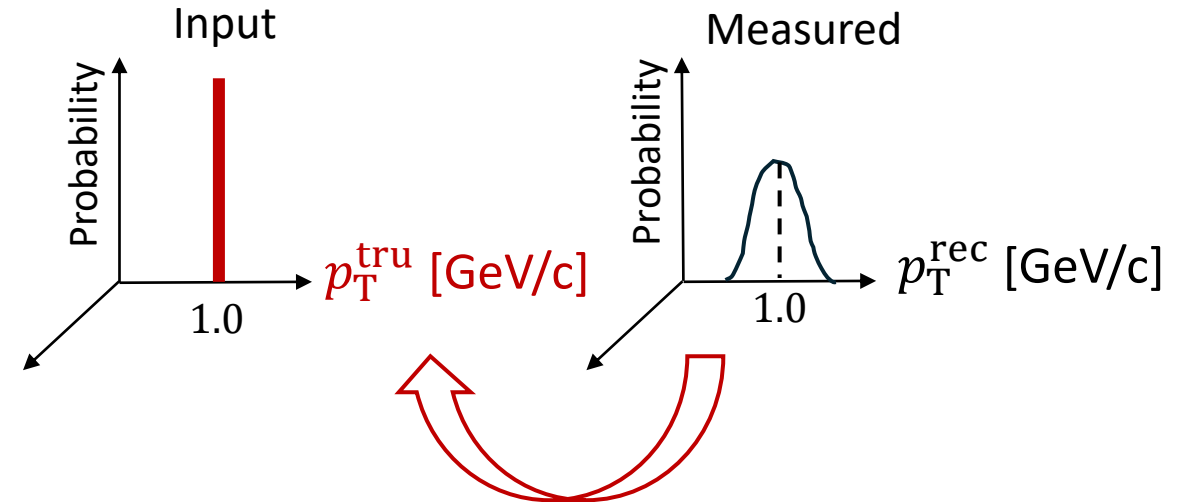
- How to unfold in multiple observables **simultaneously?**

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Unfolding: correcting for detector effects

- How to unfold in multiple observables **simultaneously?**

Method: MultiFold

- Jet observables

- p_T : transverse momentum
- $Q^{\kappa=0.5}$: jet charge $Q^\kappa = \frac{1}{(p_{Tjet})^\kappa} \sum_{i \in jet} q_i \cdot (p_{Ti})^\kappa$
- M : jet mass $M = |\sum_{i \in jet} p_i| = \sqrt{E^2 - |\vec{p}|^2}$
- M_g : SoftDrop groomed (SD) jet mass
- R_g : SD groomed jet radius
- z_g : SD shared momentum fraction

$$z_g = \frac{\min(p_{T,1}, p_{T,2})}{p_{T,1} + p_{T,2}} > z_{cut} (R_g / R_{jet})^\beta$$

All **6 observables** are simultaneously unfolded in an **unbinned** way

- $(M^2 - M_g^2) / p_T^2$ CollinearDrop groomed jet mass obtained from unfolded p_T, M and M_g

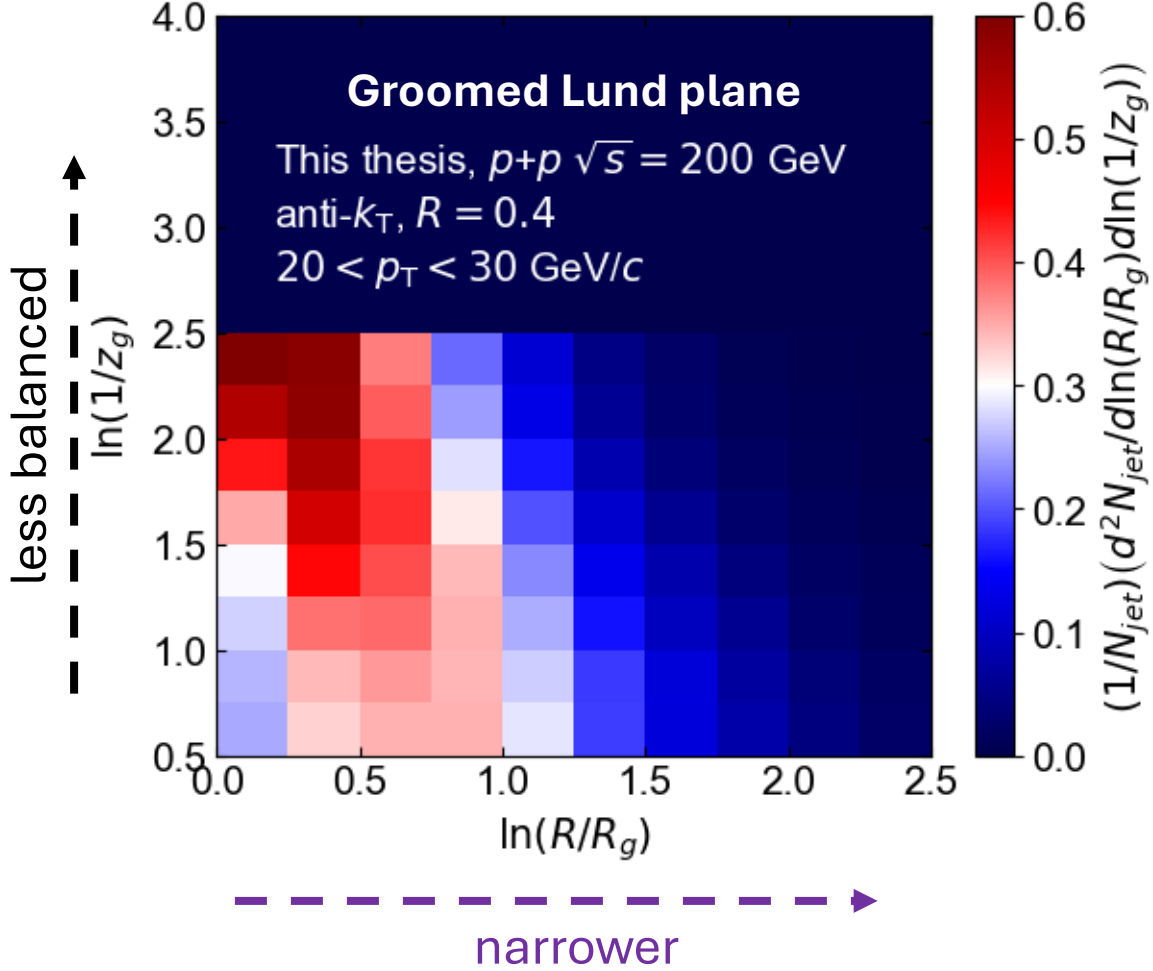
- **First** application of MultiFold on RHIC data!

Andreassen et al. PRL 124, 182001 (2020)
Song et al. EPJC (2026) 86:106

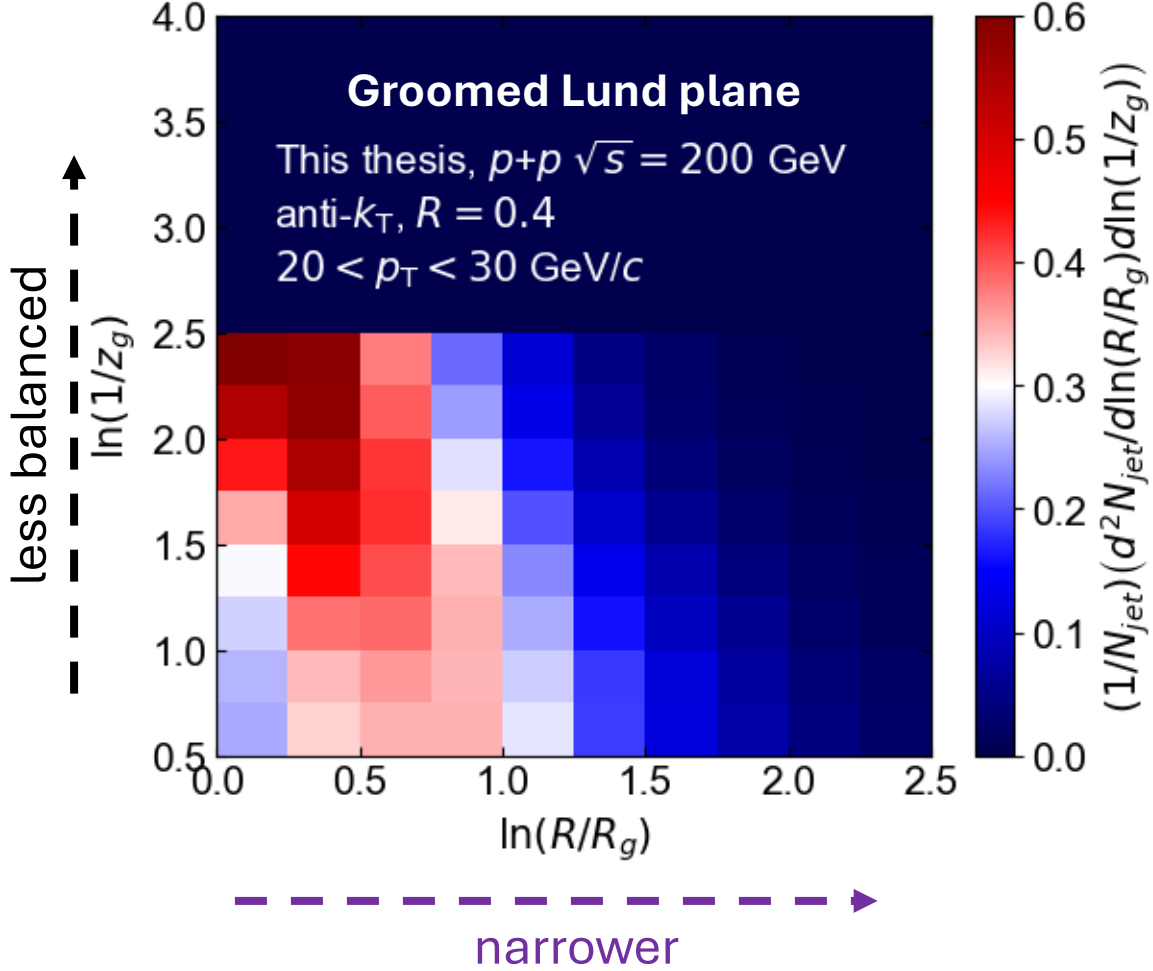
ONLY possible with MultiFold

Especially important for exploring high-dimensional **correlations**

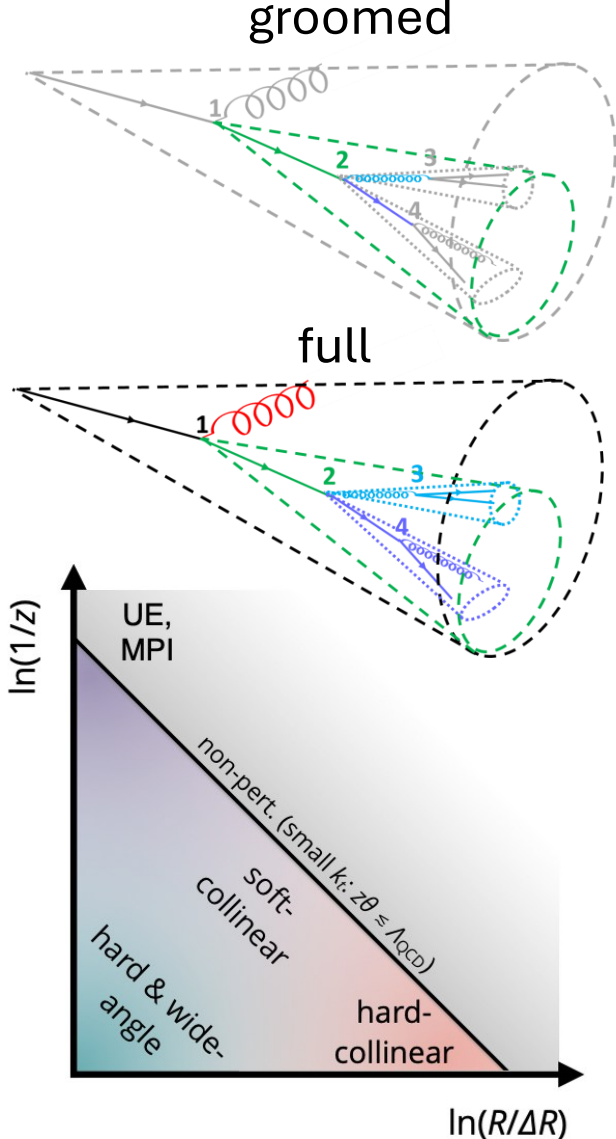
Results: Multi-dimensional correlations



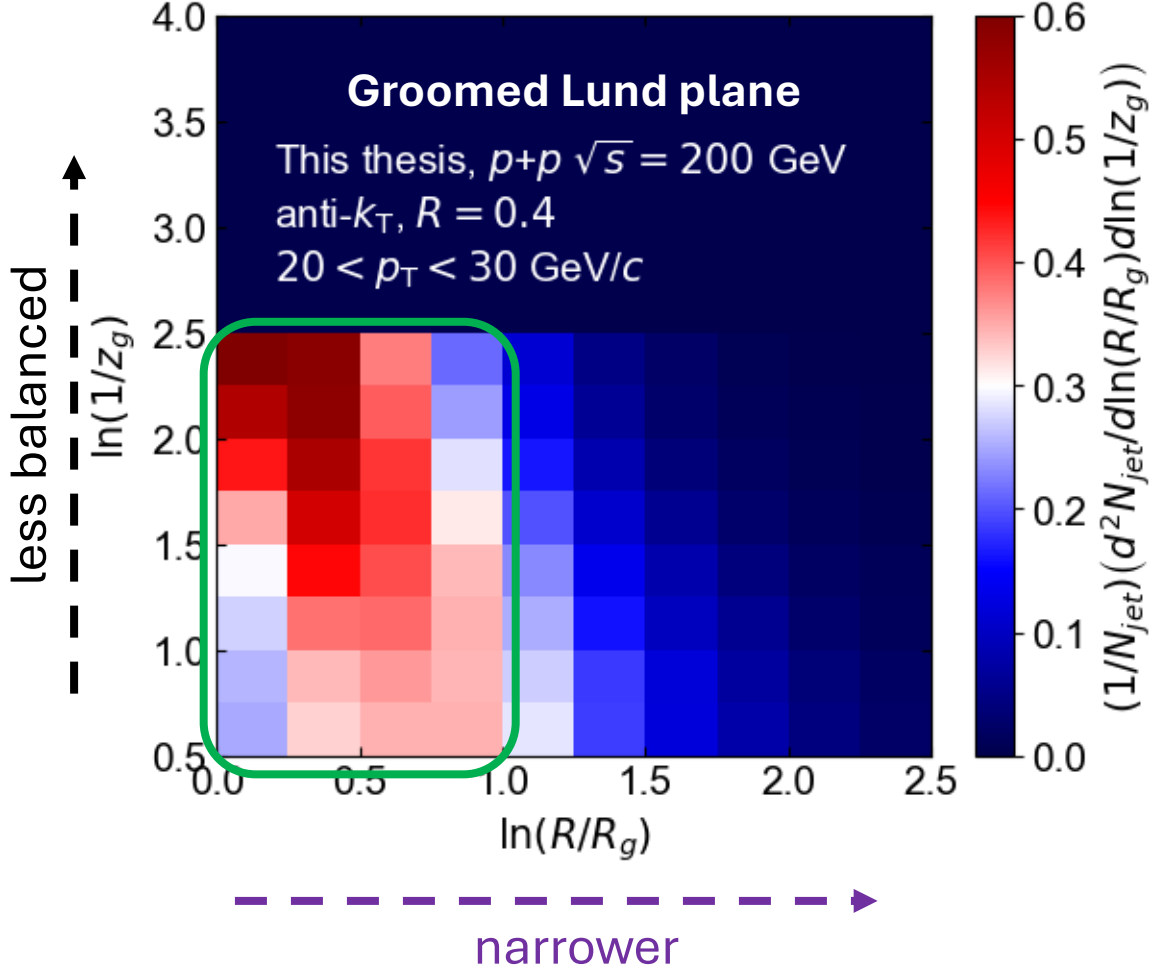
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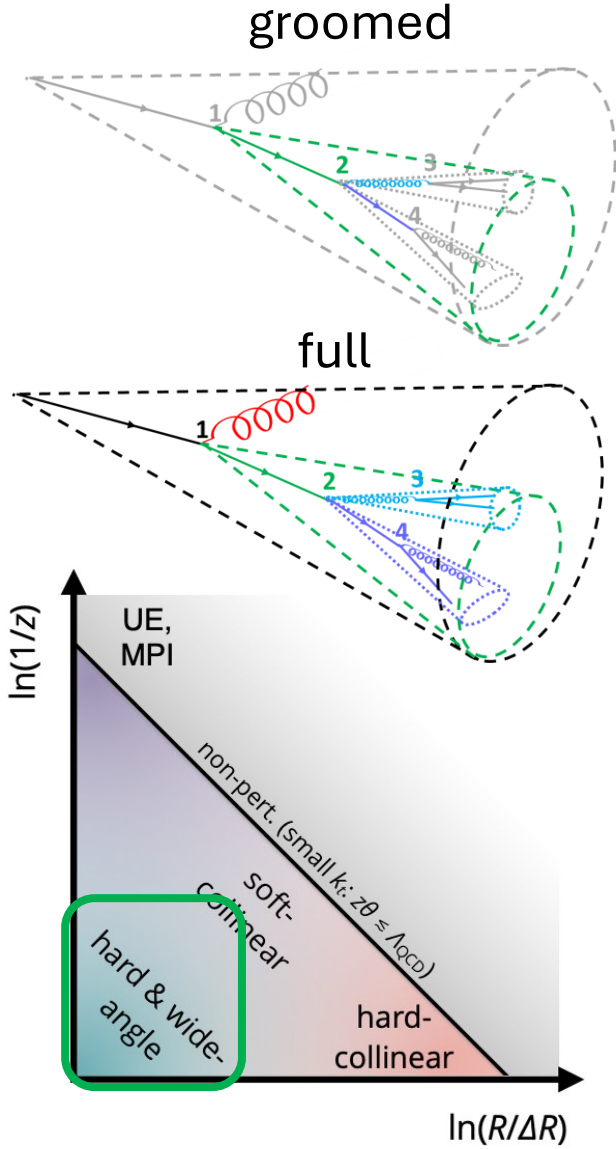
- Groomed Lund plane contains a subset of splittings in the full Lund plane



Results: Multi-dimensional correlations



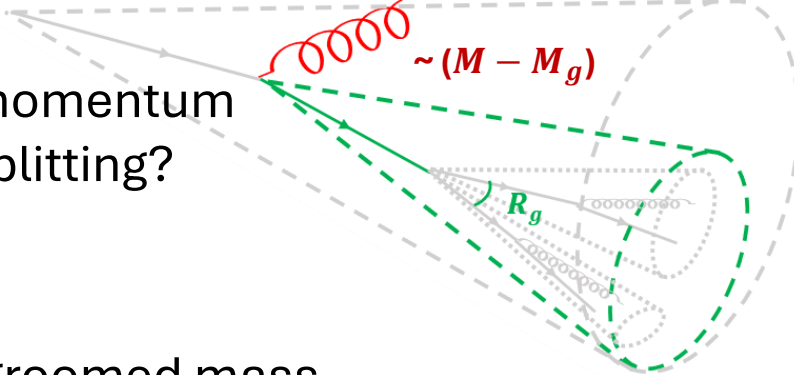
- Groomed Lund plane contains a subset of splittings in the full Lund plane
- R_g and z_g describe the angular and momentum scales of **later-stage perturbative splittings**



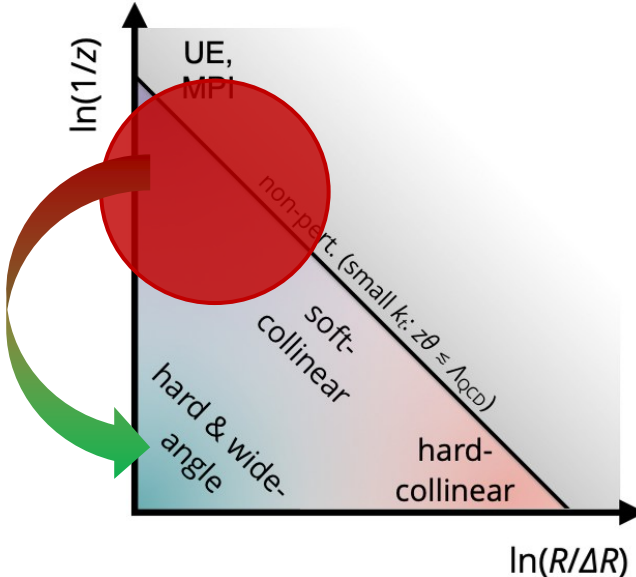
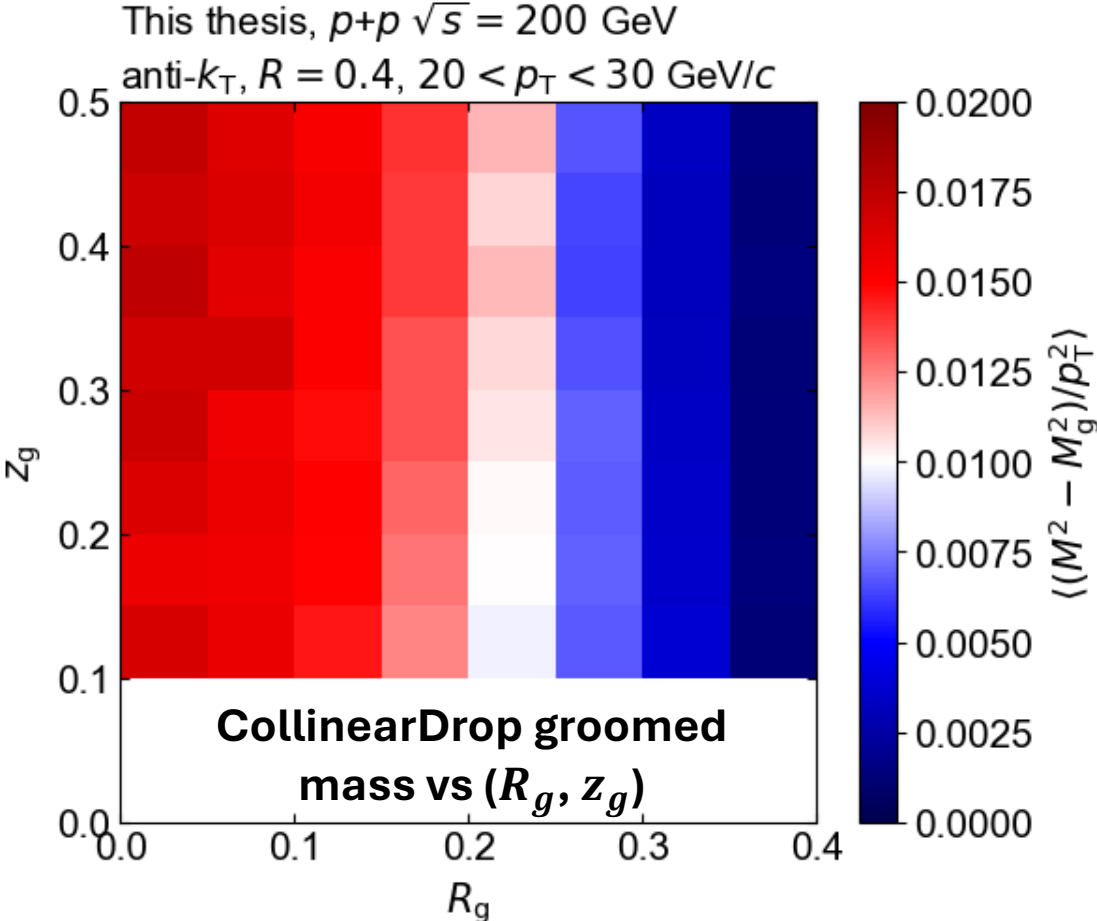
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Probing the **soft-hard** correlation within a jet:

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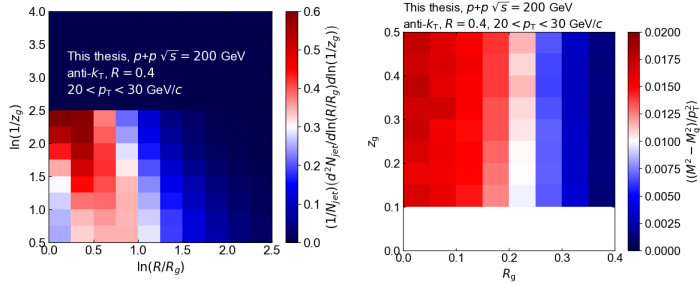


- CollinearDrop groomed mass strongly correlated with R_g and weakly with z_g



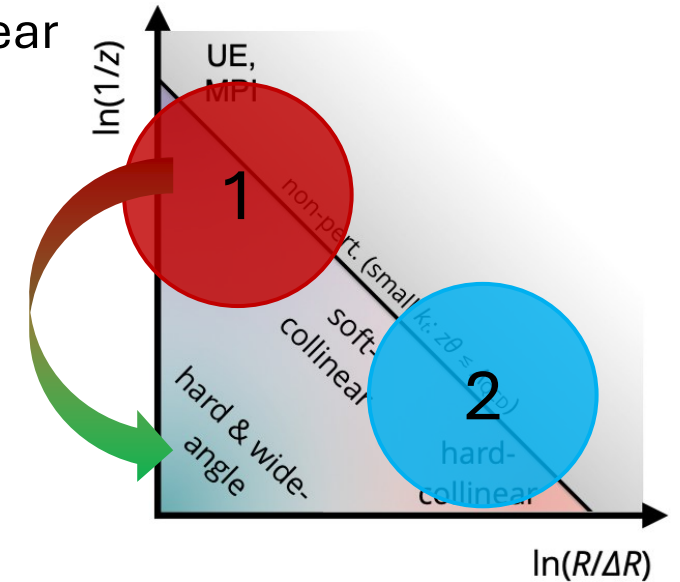
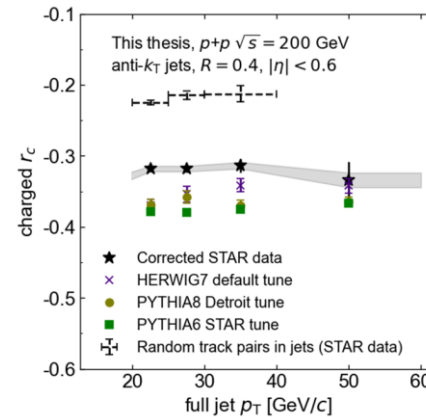
Summary and other results

- **Soft radiation** strongly correlated with dynamics of **first perturbative splitting**



- First application of MultiFold at RHIC
 - MultiFold allows for cutting on **3** different observables, and then study the **4th** → **impossible** with traditional methods

- Not mentioned in this talk:
 - Charge correlator ratio r_c in pp collisions and isobar collisions, sensitive to hadronization effects
 - First r_c measurements in hadron collisions
- Both measurements to be submitted for publication this year



Backup

High-energy particle collisions:

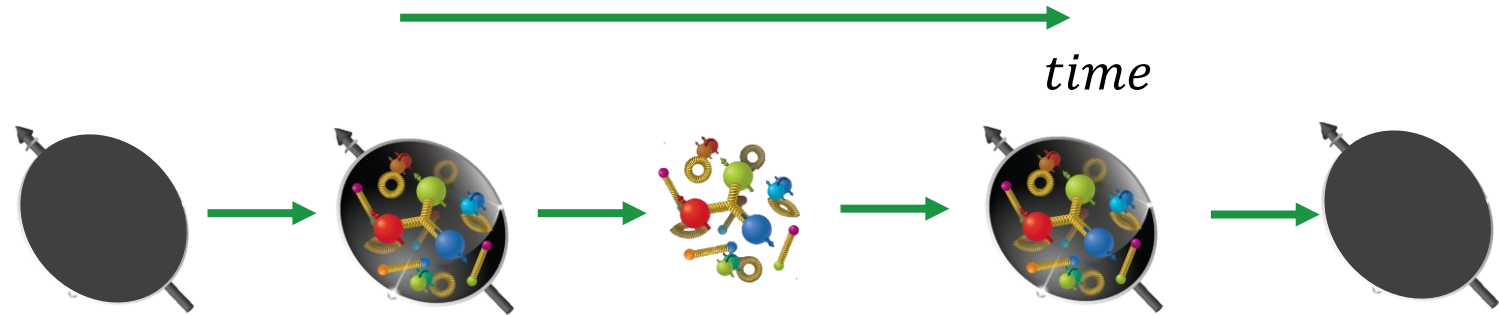
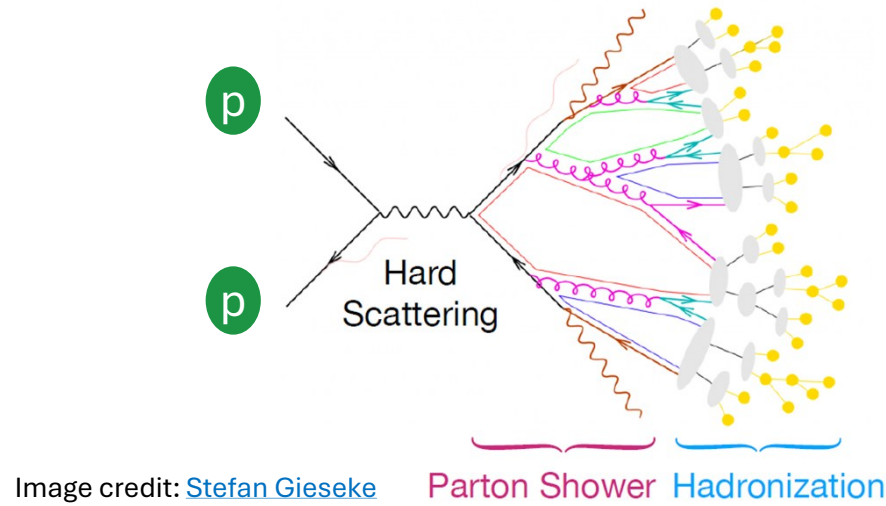


Image credit: [BNL](#)

Degrees of freedom:

hadrons

partons

hadrons

How do QCD degrees of freedom give rise to hadronic degrees of freedom?
→ What is happening during the parton shower and hadronization?

Study this with jets and jet substructure observables!

MultiFold: Simplified two-jet example

1. Generate jets in PYTHIA → PYTHIA+GEANT
- Physics process simulation → PYTHIA
 Detector response simulation → GEANT

Observable	$p_T^{\text{tru}} \rightarrow p_T^{\text{rec}}$	$M^{\text{tru}} \rightarrow M^{\text{rec}}$...	Probability
Jet 1	20 GeV → 18 GeV	3 GeV → 2 GeV	...	0.5
Jet 2	40 GeV → 38 GeV	4 GeV → 3 GeV	...	0.5

3. MultiFold

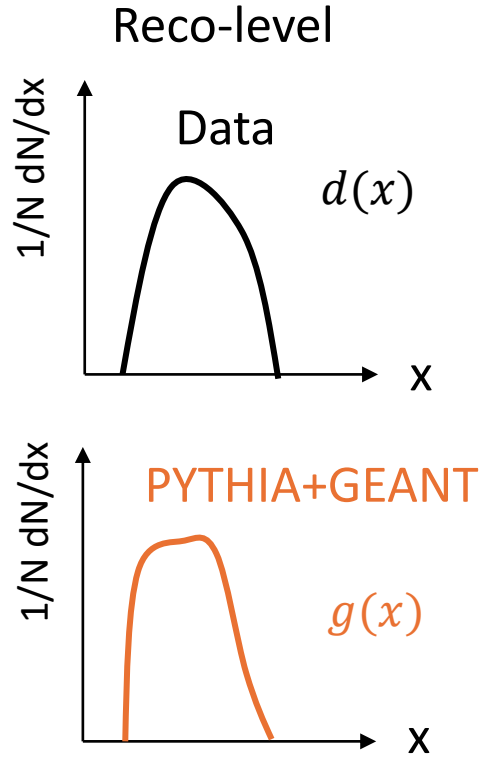
	Probability
Jet 1	0.75
Jet 2	0.25

2. Measure jets in data

Observable	$p_T^{\text{tru}} \rightarrow p_T^{\text{rec}}$	$M^{\text{tru}} \rightarrow M^{\text{rec}}$...	Counts
Jet 3	?? GeV → 18 GeV	? GeV → 2 GeV	...	300
Jet 4	?? GeV → 38 GeV	? GeV → 3 GeV	...	100

Density ratio estimation:
 What weights to apply to jets
 in simulations, such that
 they match data?

MultiFold: Step 1, iteration 1



Weights: $w_1(x) = d(x)/g(x)$ Ok for the binned case

$\approx f(x)/(1 - f(x))$ Using Bayes' Theorem

where $f(x)$ is a neural network and trained with the binary cross-entropy loss function

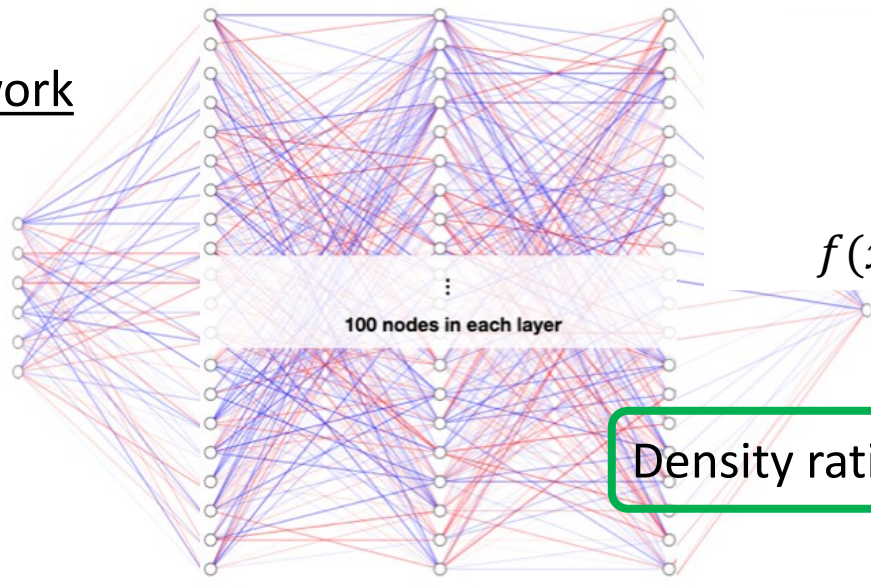
to distinguish jets coming from data vs from **PYTHIA+GEANT**

$w_1(x)$

Neural network

input

$$\vec{x} = \begin{Bmatrix} p_T \\ M \\ \vdots \end{Bmatrix}$$



Neural network

output

$f(\vec{x}) =$ probability that jet \vec{x} is from data

Density ratio estimation \rightarrow Classification

MultiFold results: Validation

This thesis

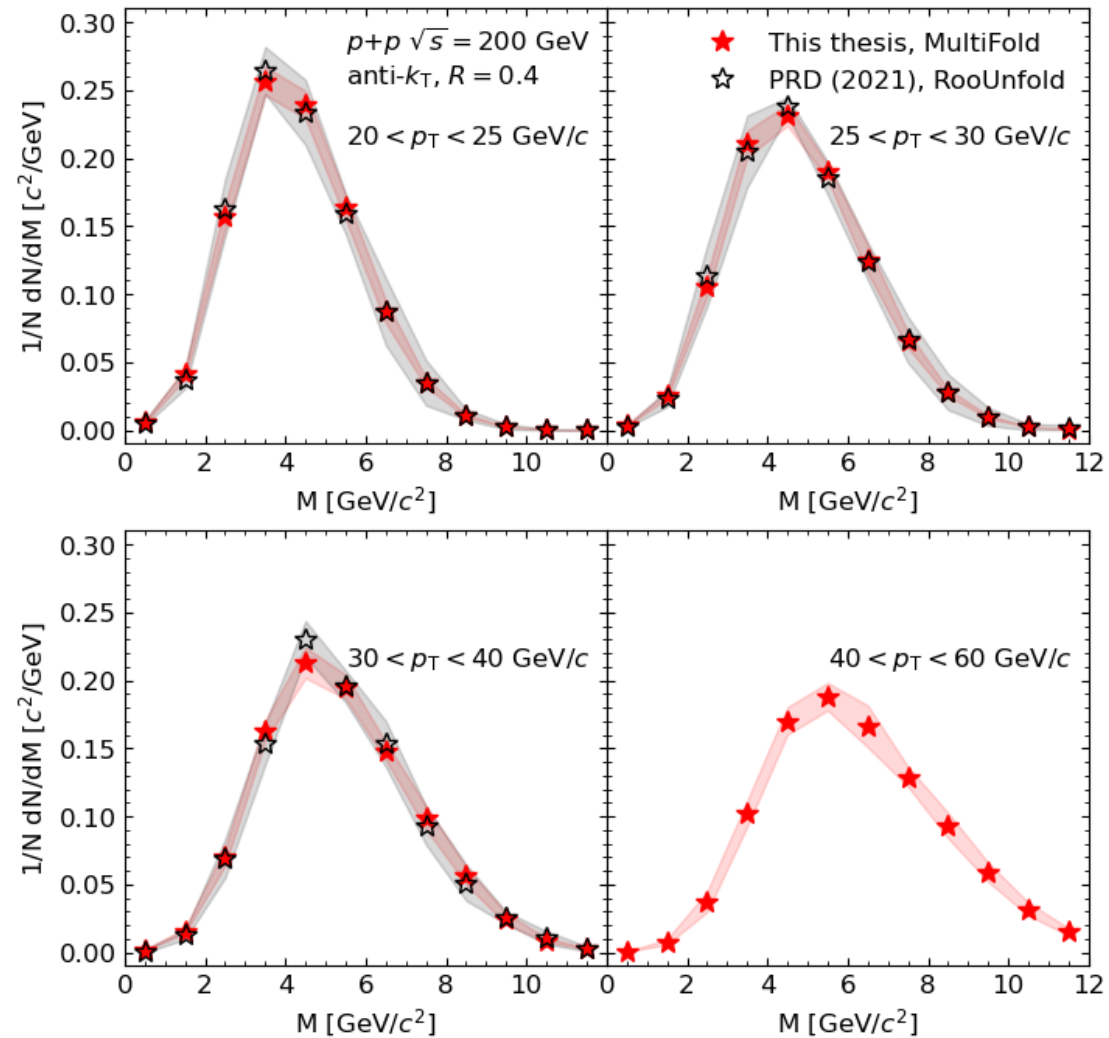
MultiFolded results agree with **RoUnfolded** results ([STAR. PLB 811 \(2020\) 135846](#), [STAR. PRD 104, 052007\(2021\)](#))

Uses Iterative
Bayesian method

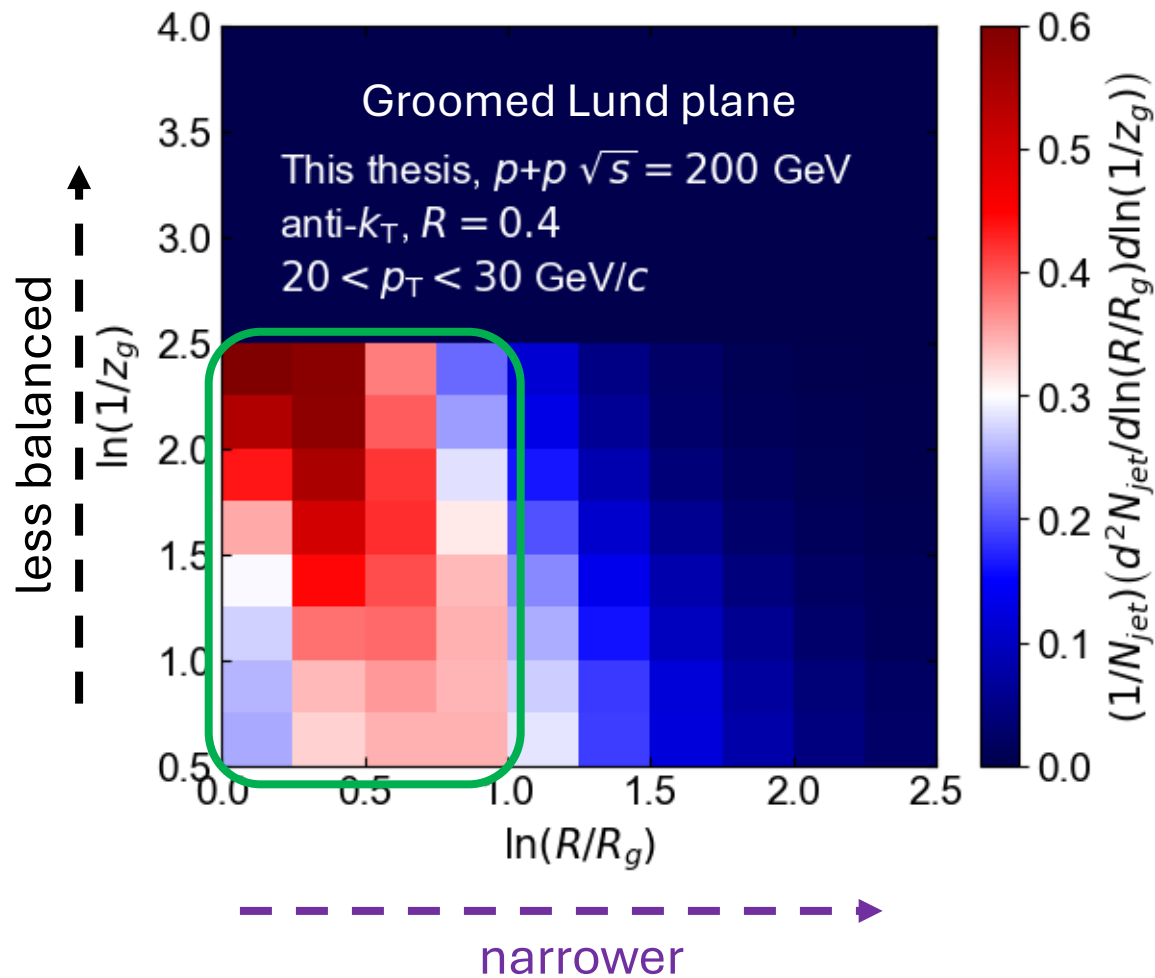
- Example: Jet mass M

$$M = \left| \sum_{i \in \text{jet}} p_i \right| = \sqrt{E^2 - |\vec{p}|^2}$$

- See 1D distributions of the other 5 unfolded observables in thesis



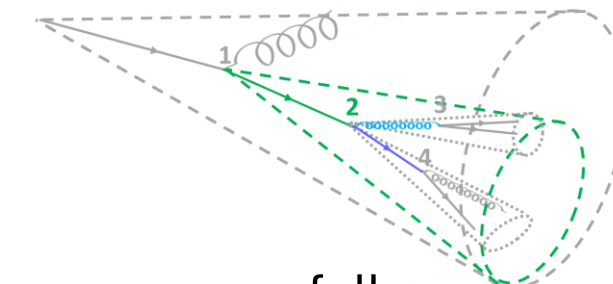
MultiFold results: Multi-dimensional correlations



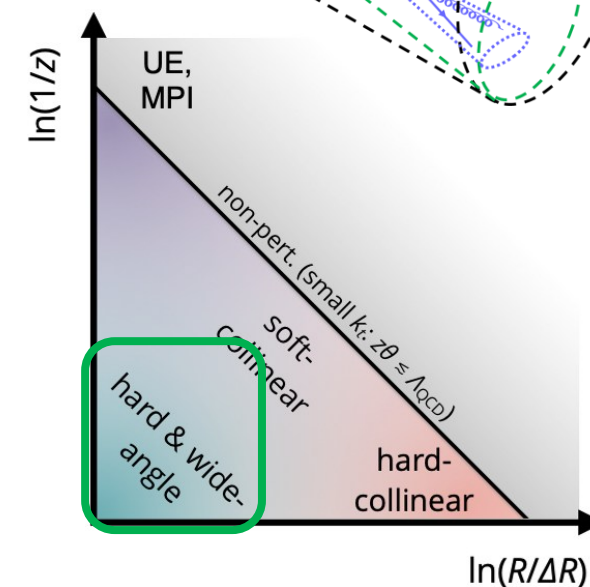
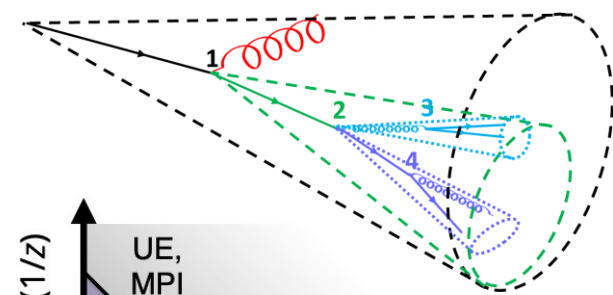
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This thesis

groomed



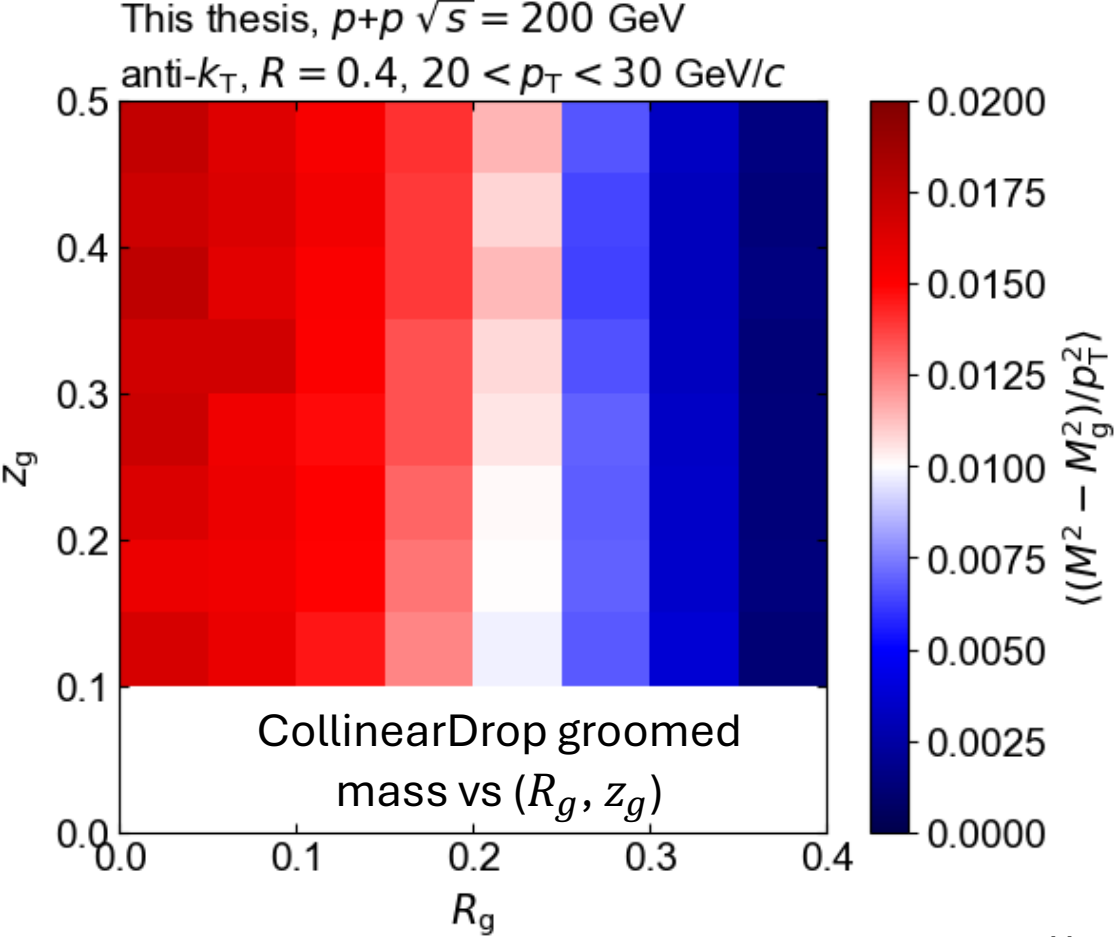
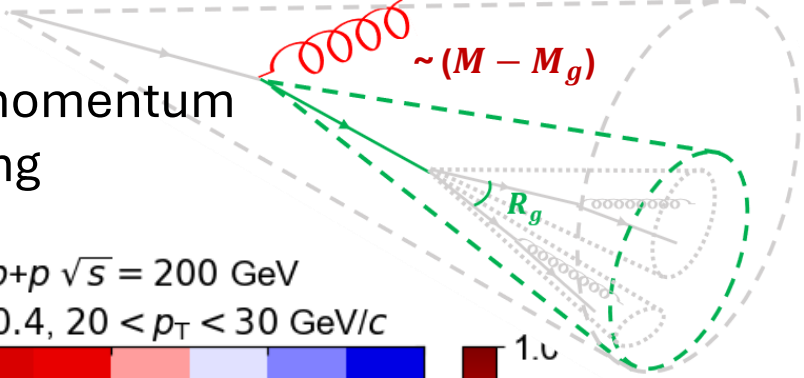
full



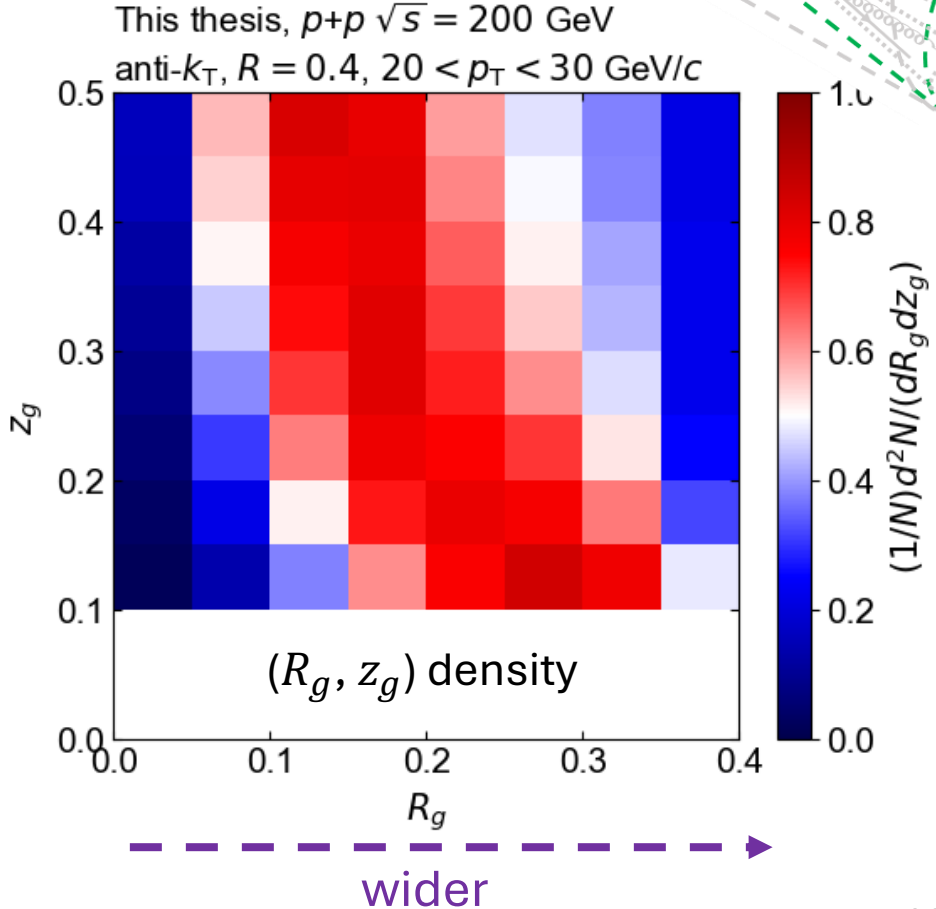
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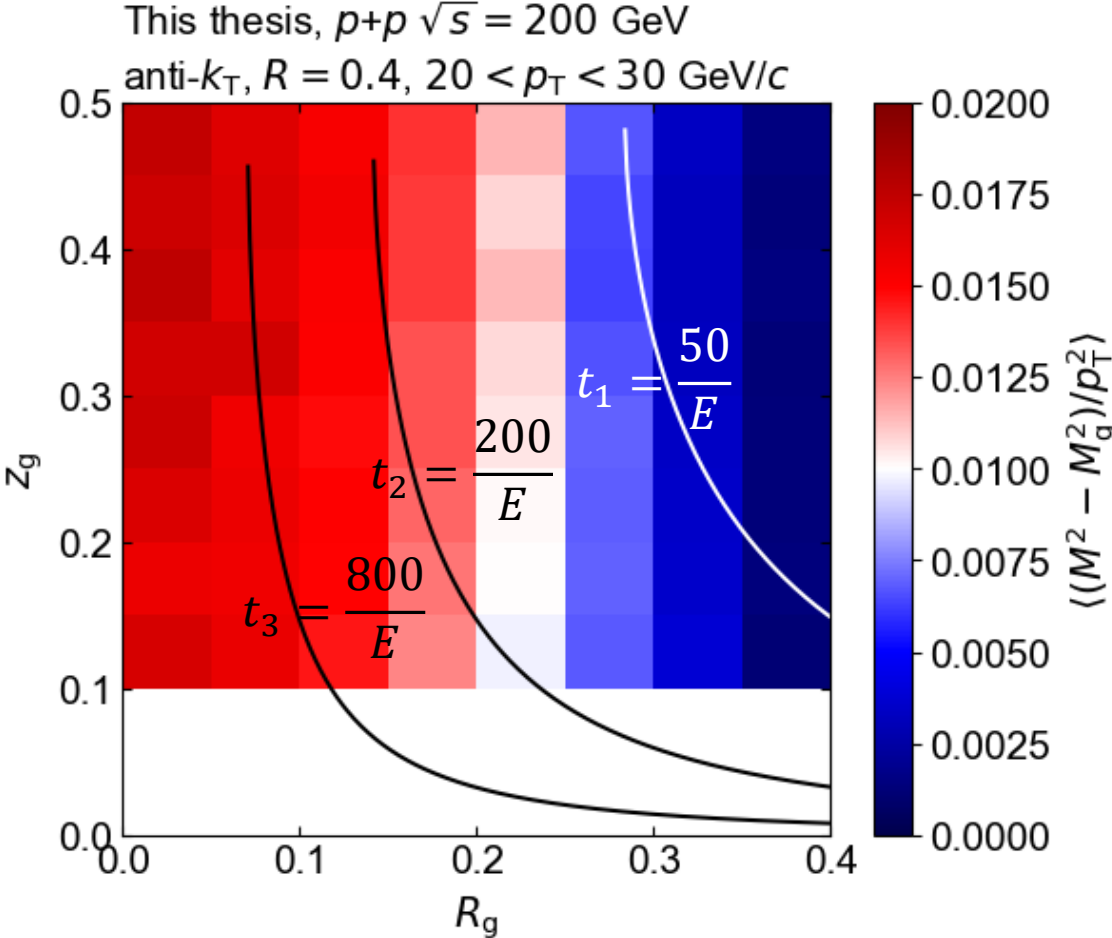
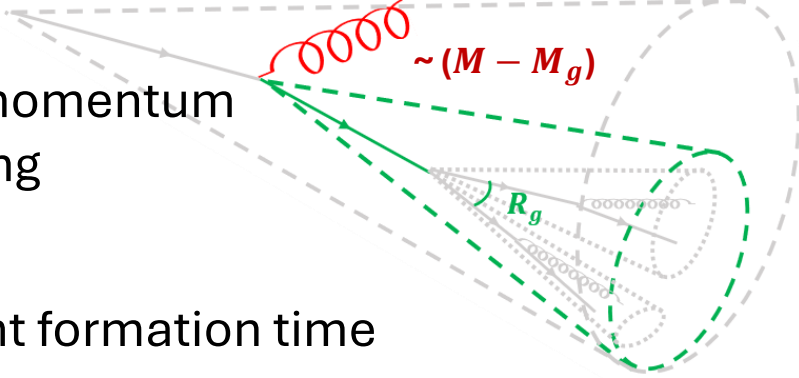
more balanced ↑



MultiFold results: Multi-dimensional correlations

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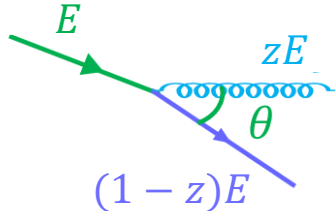
- Lines of constant formation time

Y. L. Dokshitzer, et al. *Basics of Perturbative QCD* (1991).

Using $t_F \sim \frac{1}{2Ez(1-z)(1-\cos(\theta))}$

solve for $z(\theta, z < 0.5)$:

$$z = \frac{1}{2} \left[1 - \sqrt{1 - \frac{2}{tE(1-\cos(\theta))}} \right]$$



- CollinearDrop groomed mass strongly correlated with R_g and weakly with z_g
- To shed a lot of mass at **early** stage, the hard splitting needs to happen **late**