

Towards an understanding of jet substructure

Gavin Salam (CERN)
with Mrinal Dasgupta, Alessandro Fregoso & Simone Marzani

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As a field we've devised $O(10-20)$ powerful methods to tag jet substructure.

Many of the methods have been tried out in searches and work; these kinds of methods will be crucial for searches in the years to come.

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Many of the methods have been tried out in searches and work; these kinds of methods will be crucial for searches in the years to come.

But from outside, the many methods make the field look pretty confusing.

And from inside, I get the impression we don't always know *why* or *how* the methods work – which is bad if we're looking for robustness.

Is it time to get back to basics?

Boost 2010 proceedings:

The [Monte Carlo] findings discussed above indicate that while [pruning, trimming and filtering] have qualitatively similar effects, there are important differences. For our choice of parameters, pruning acts most aggressively on the signal and background followed by trimming and filtering.

At the time:

- No clear picture of why the taggers might be similar or different
- No clear picture of how the parameter choices affect the taggers

Better Insight

Can guide taggers' use
in experimental
analyses

It may help us design
better taggers

This talk → analytical understanding. Why?

Better Insight

Can guide taggers' use
in experimental
analyses

It may help us design
better taggers

Robustness

You know what you
predict, what you don't

Unlike MC, you have
powerful handles for
cross-checks & accuracy
estimates

There is a “right” answer

Scope of our study

To fully understand “Boost” you want to study all possible signal (W/Z/H/top/...) and QCD jets.

But you need to start somewhere.

We chose the QCD jets because:

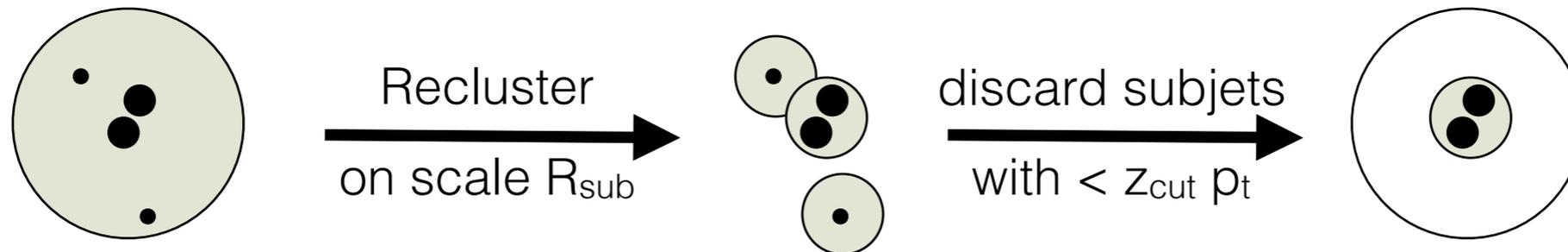
(a) they have the richest structure.

(b) once you know understand the QCD jets, the route for understanding signal jets becomes clear too.

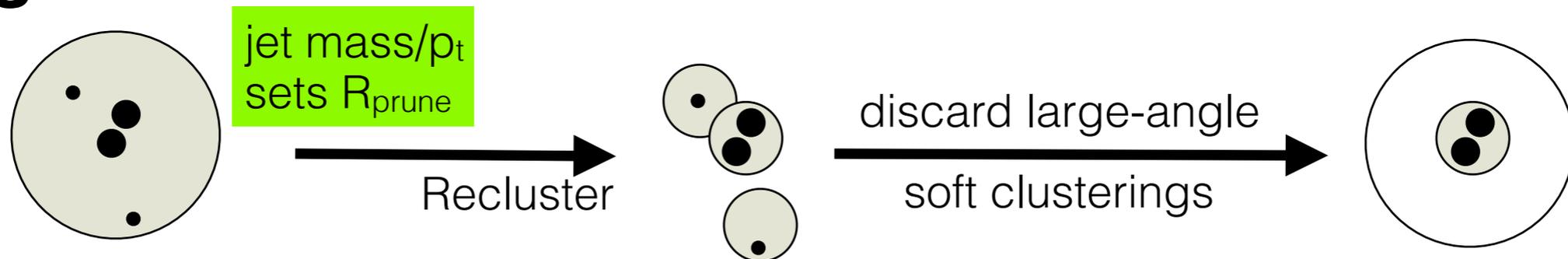
study 3 taggers/groomers

Cannot possibly study all tools
These 3 are widely used

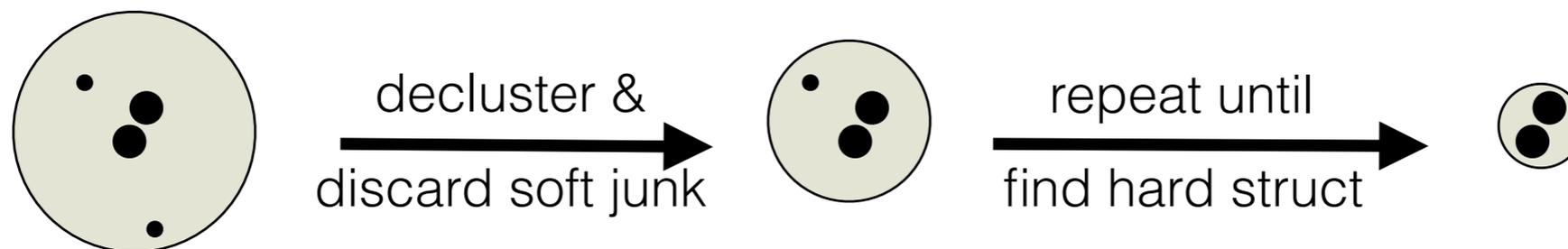
Trimming



Pruning



Mass-drop tagger (MDT, aka BDRS)



First use MC to get a panorama

For phenomenology

Jet mass: m

*[as compared to $W/Z/H$
or top mass]*

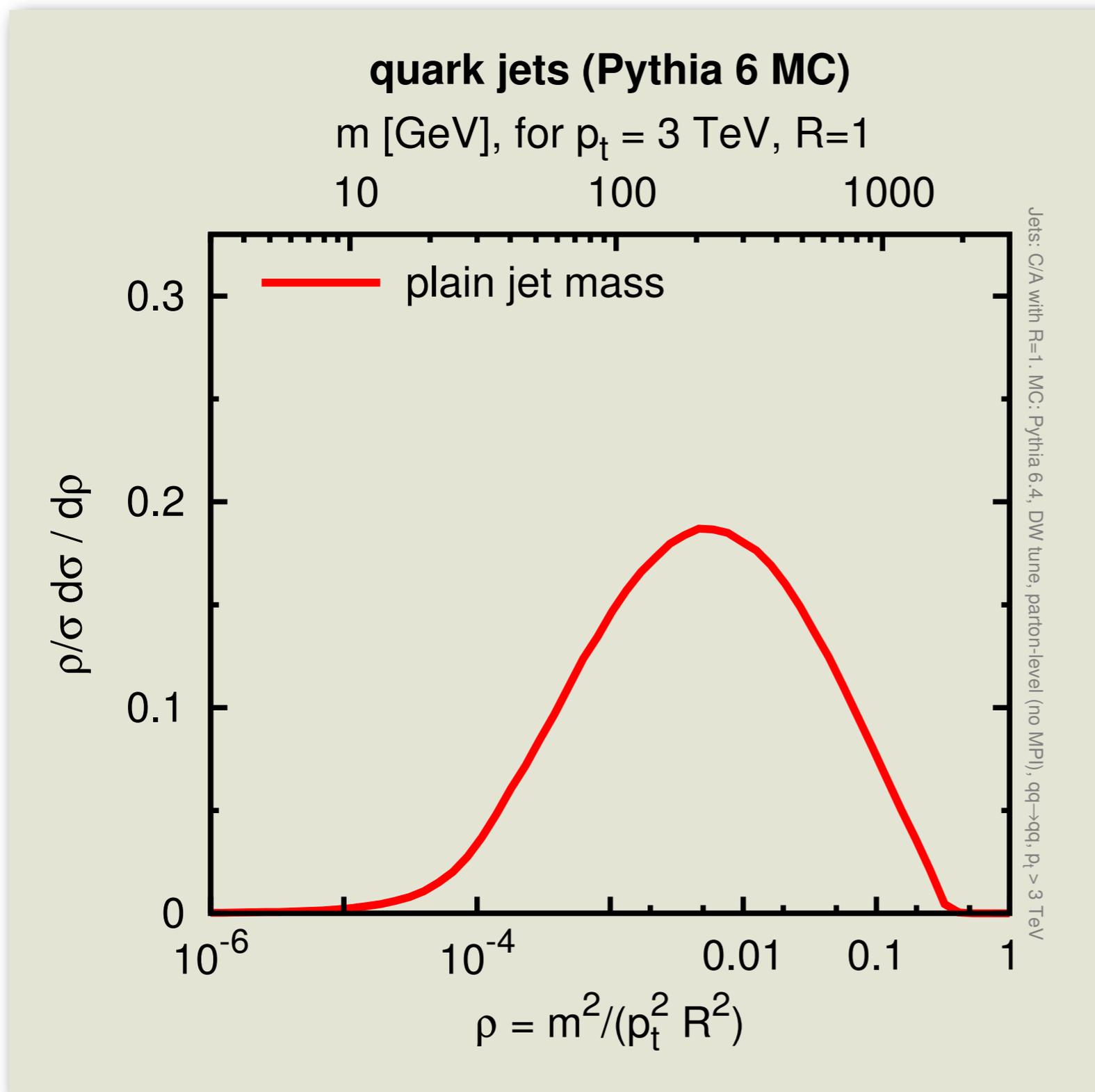
For QCD calculations

$$\rho = \frac{m^2}{p_t^2 R^2}$$

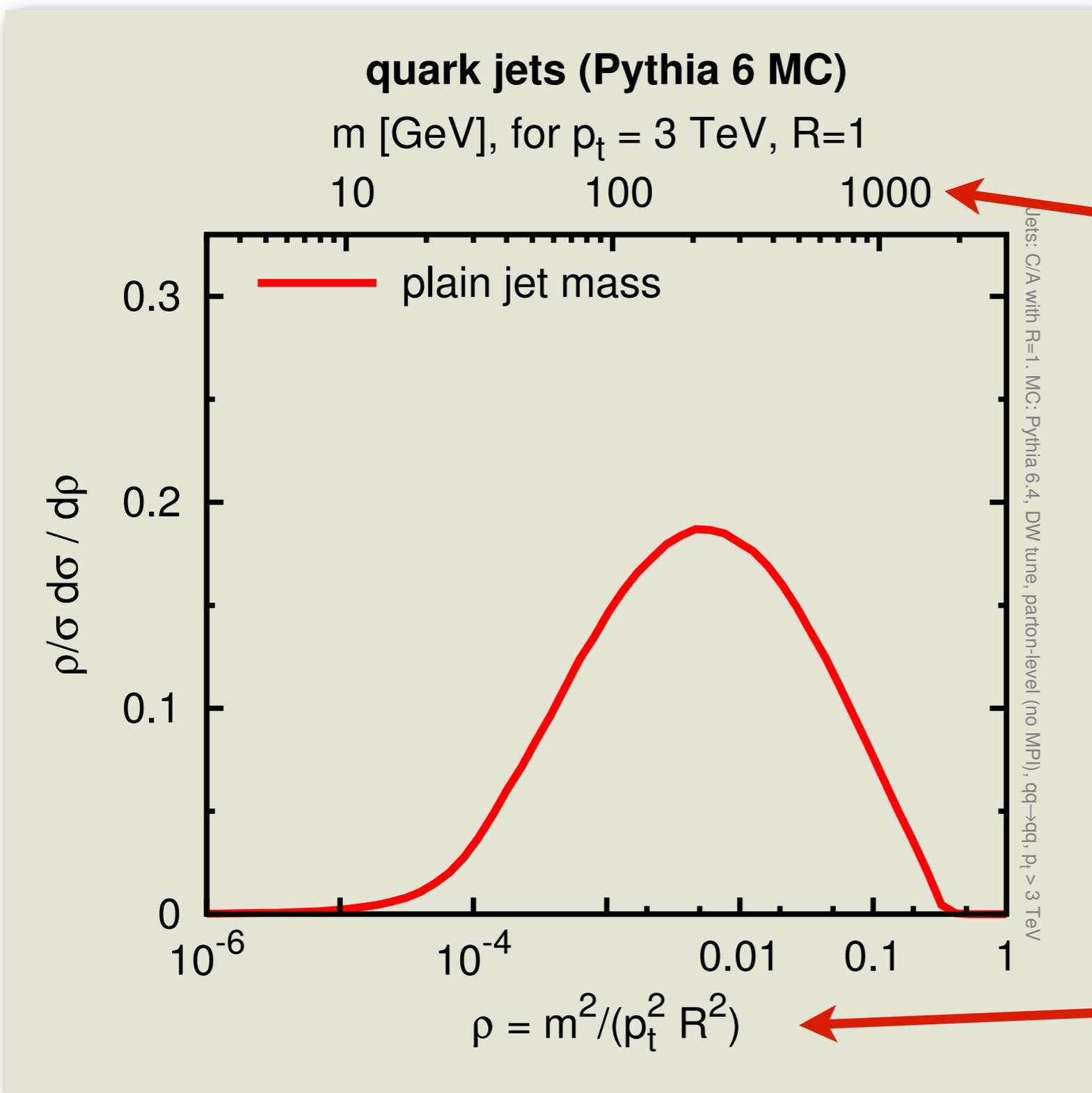
*[R is jet opening angle
– or radius]*

Because ρ is invariant under
boosts along jet direction

Start with “plain” jet mass



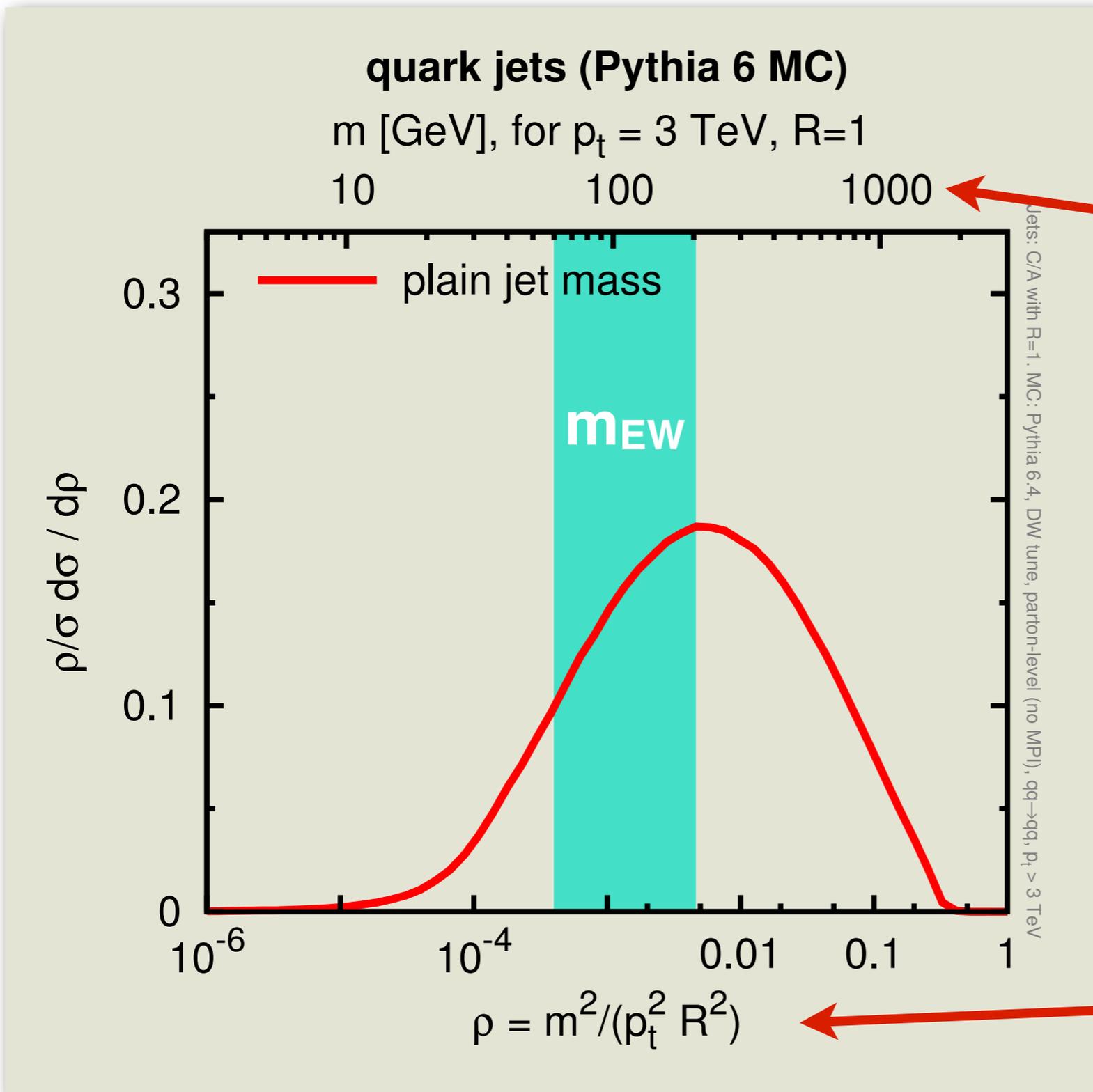
Start with “plain” jet mass



Physical mass for
3 TeV, R=1 jets

$\rho \sim$ Rescaled mass²
(i.e. the QCD variable)

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Physical mass for
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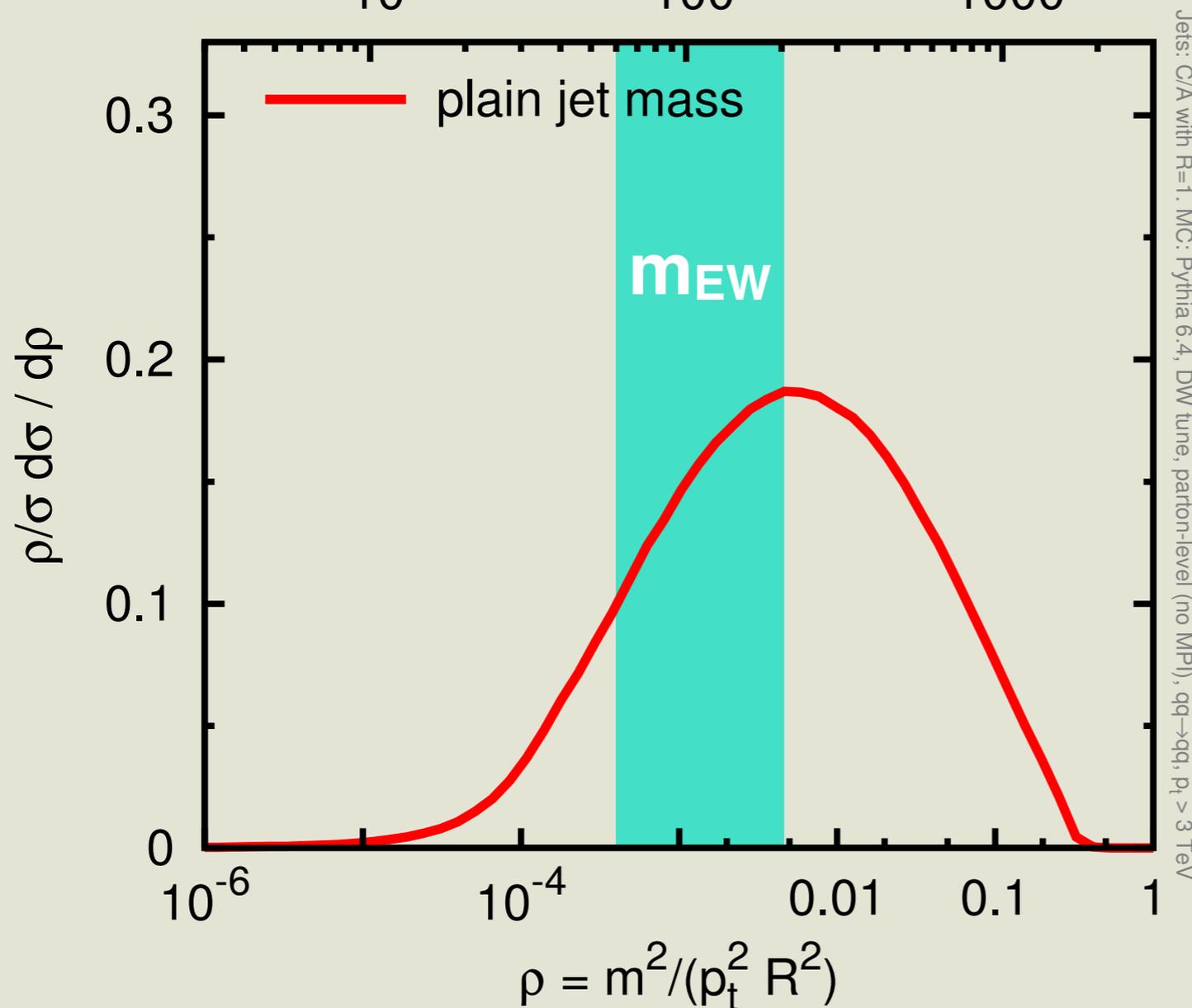
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Start with “plain” jet mass

quark jets (Pythia 6 MC)

m [GeV], for $p_t = 3$ TeV, $R=1$

10 100 1000



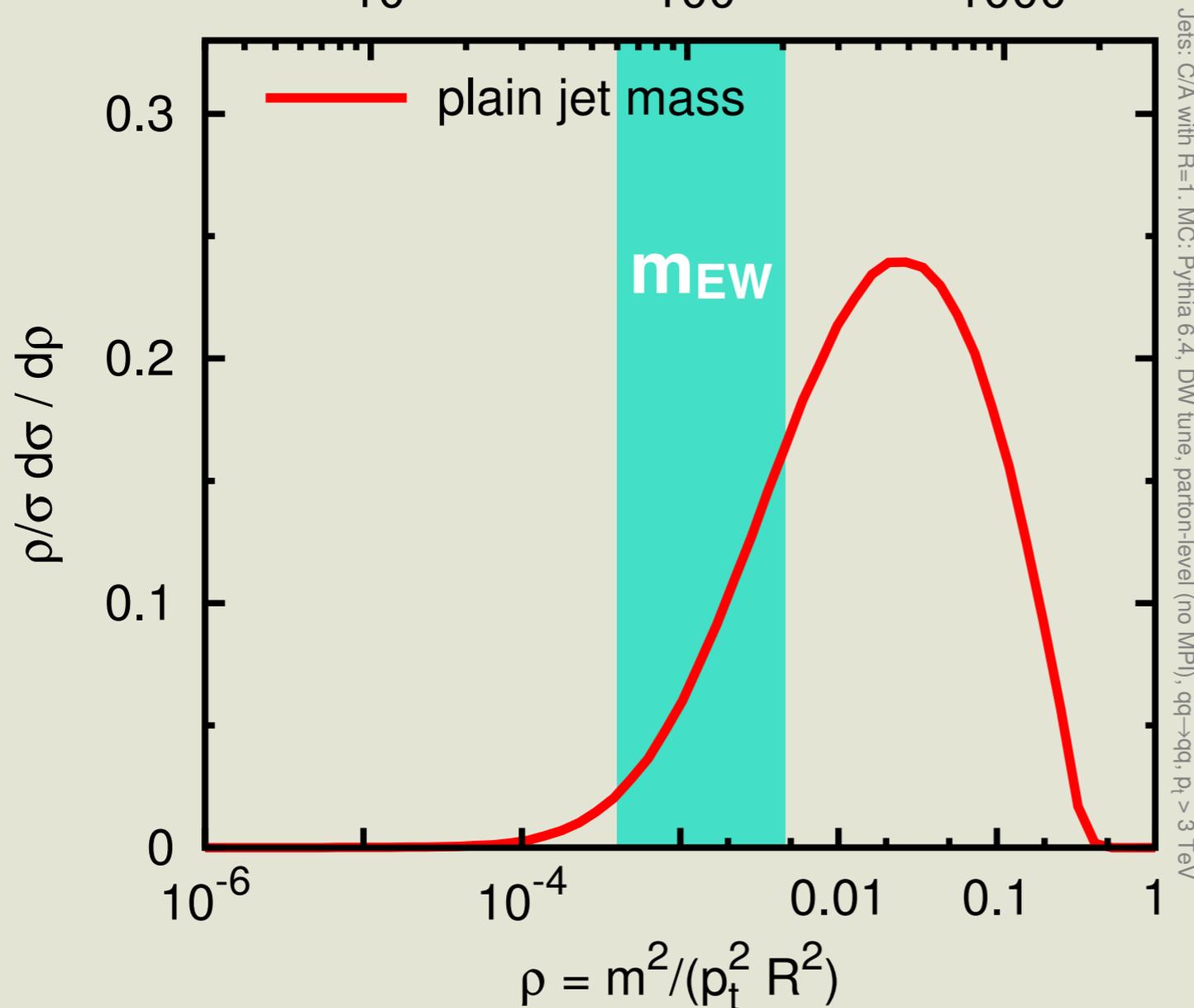
Quark and gluon jets are different, so we treat them separately

Start with “plain” jet mass

gluon jets (Pythia 6 MC)

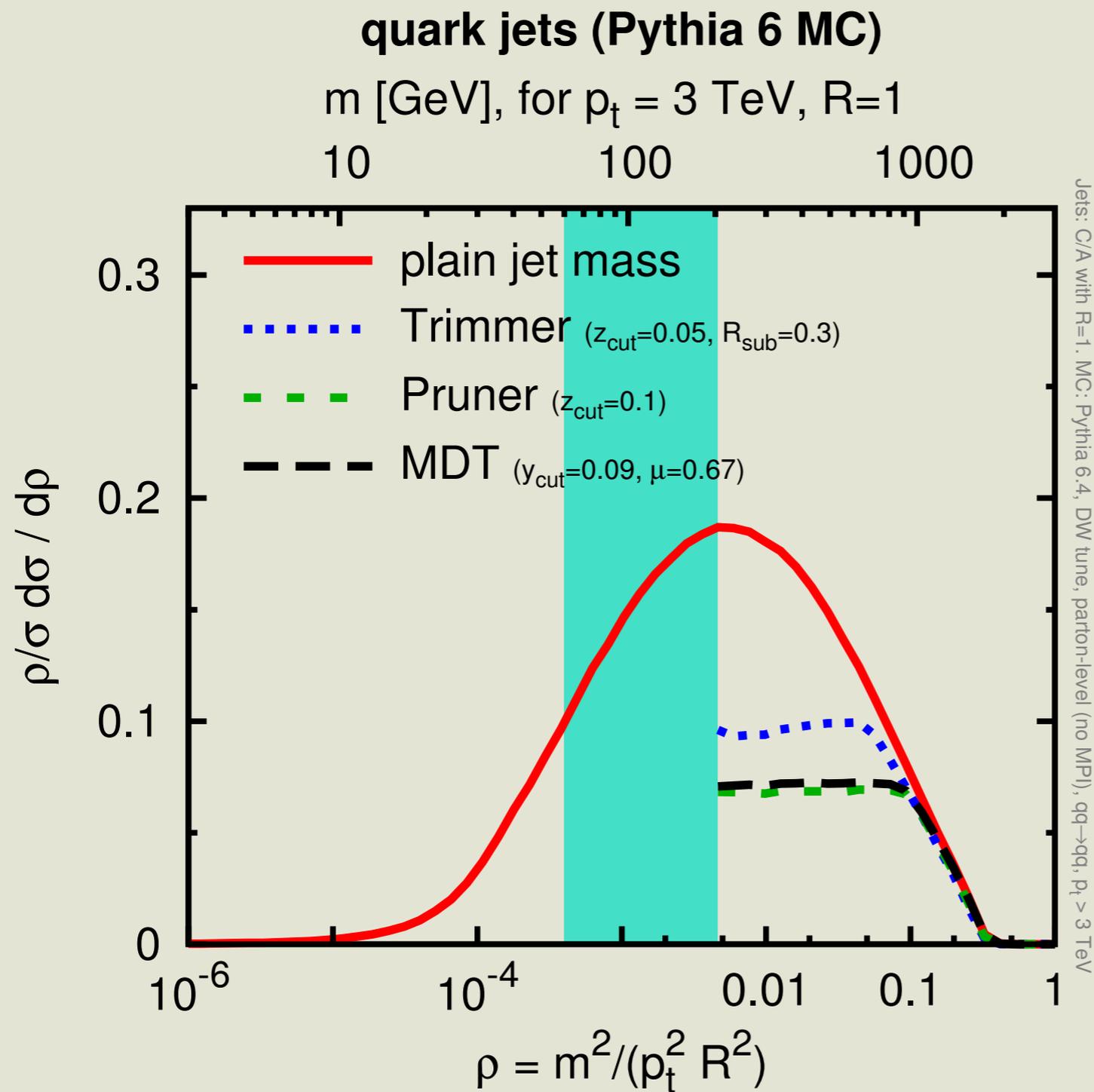
m [GeV], for $p_t = 3$ TeV, $R=1$

10 100 1000



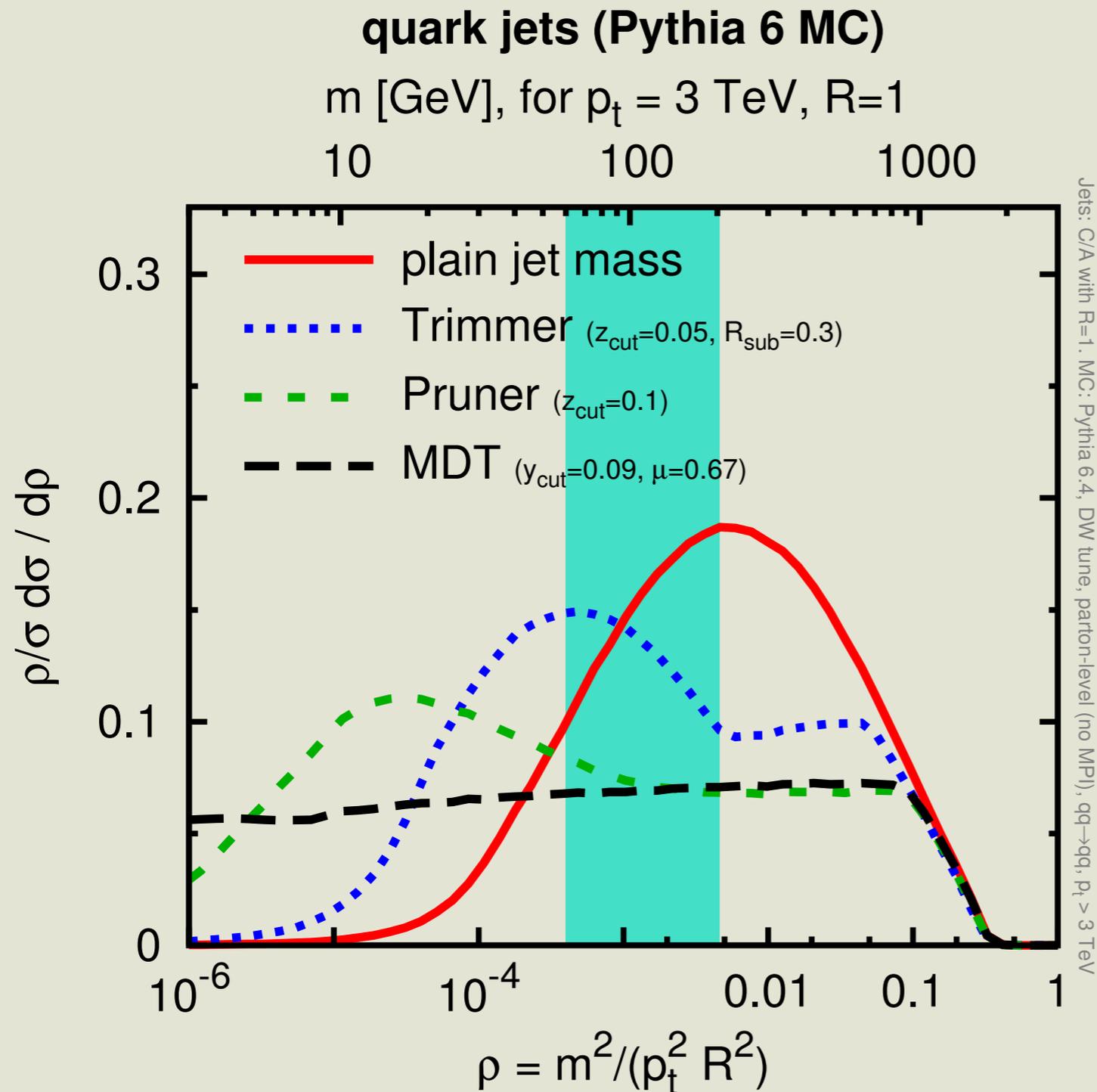
Quark and **gluon** jets are different, so we treat them separately

Now examine “taggers/groomers”



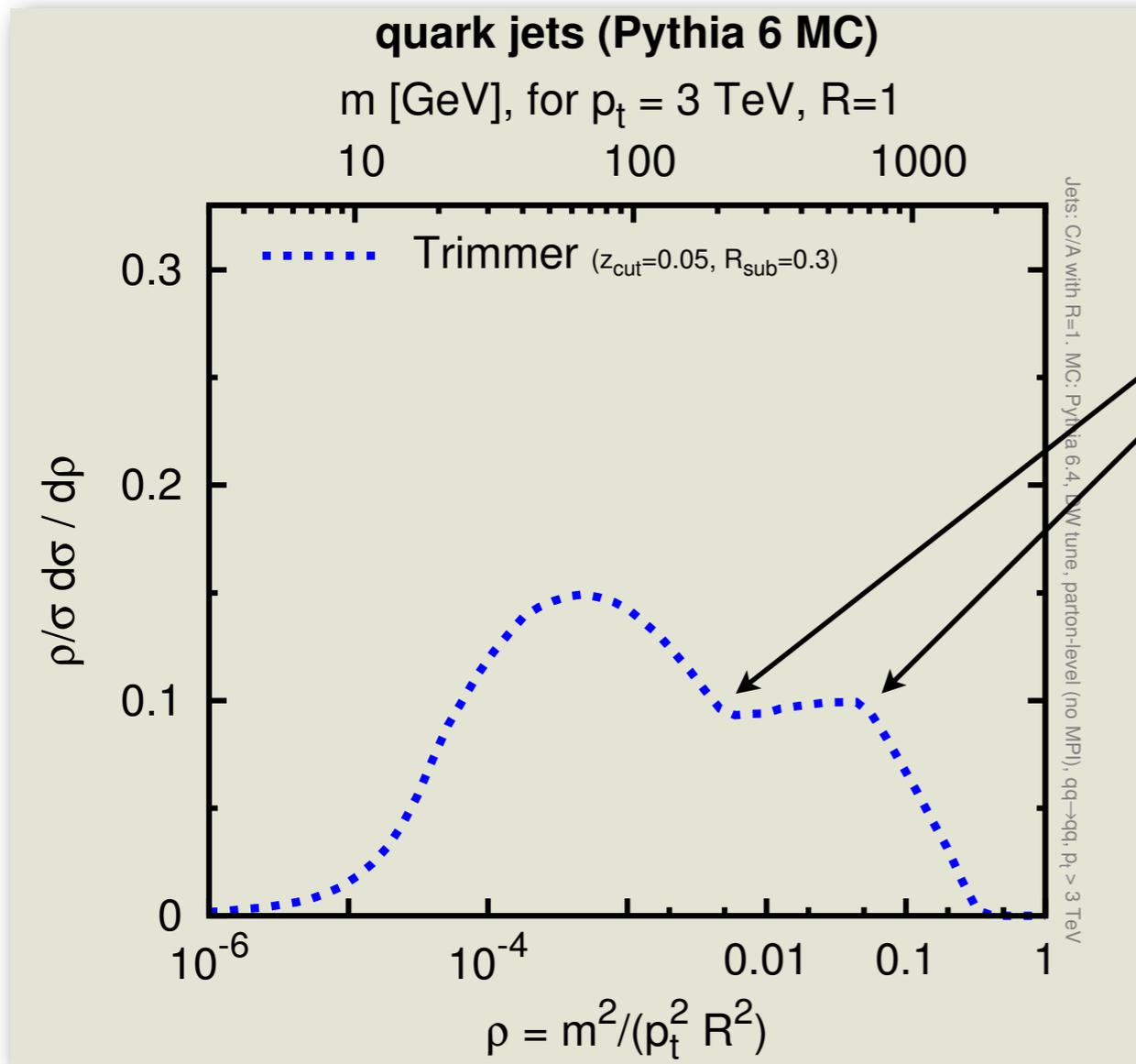
Different taggers
 can be
 quite similar

Now examine “taggers/groomers”



But only for a
limited range
of masses

What do we want to find out?



Where exactly are the kinks?
How do their locations depend
on $z_{\text{cut}}, R_{\text{sub}}$?

Kinks are especially
dangerous for data-
driver backgrounds

What physics is relevant in the
different regions?

Because then you have
an idea of how well you
control it

And maybe you can
make better taggers

The parameters & approximations

Trimming

Take all particles in a jet of radius R and recluster them into subjects with a jet definition with radius

$$R_{\text{sub}} < R$$

The subjects that satisfy the condition

$$p_t^{(\text{subject})} > Z_{\text{cut}} p_t^{(\text{jet})}$$

are kept and merged to form the trimmed jet.

Krohn, Thaler & Wang '09

Our approximations

- $\rho \ll 1$
logs of ρ get resummed
- pretend $R \ll 1$
- $Z_{\text{cut}} \ll 1$,
but $(\log z_{\text{cut}})$ not large

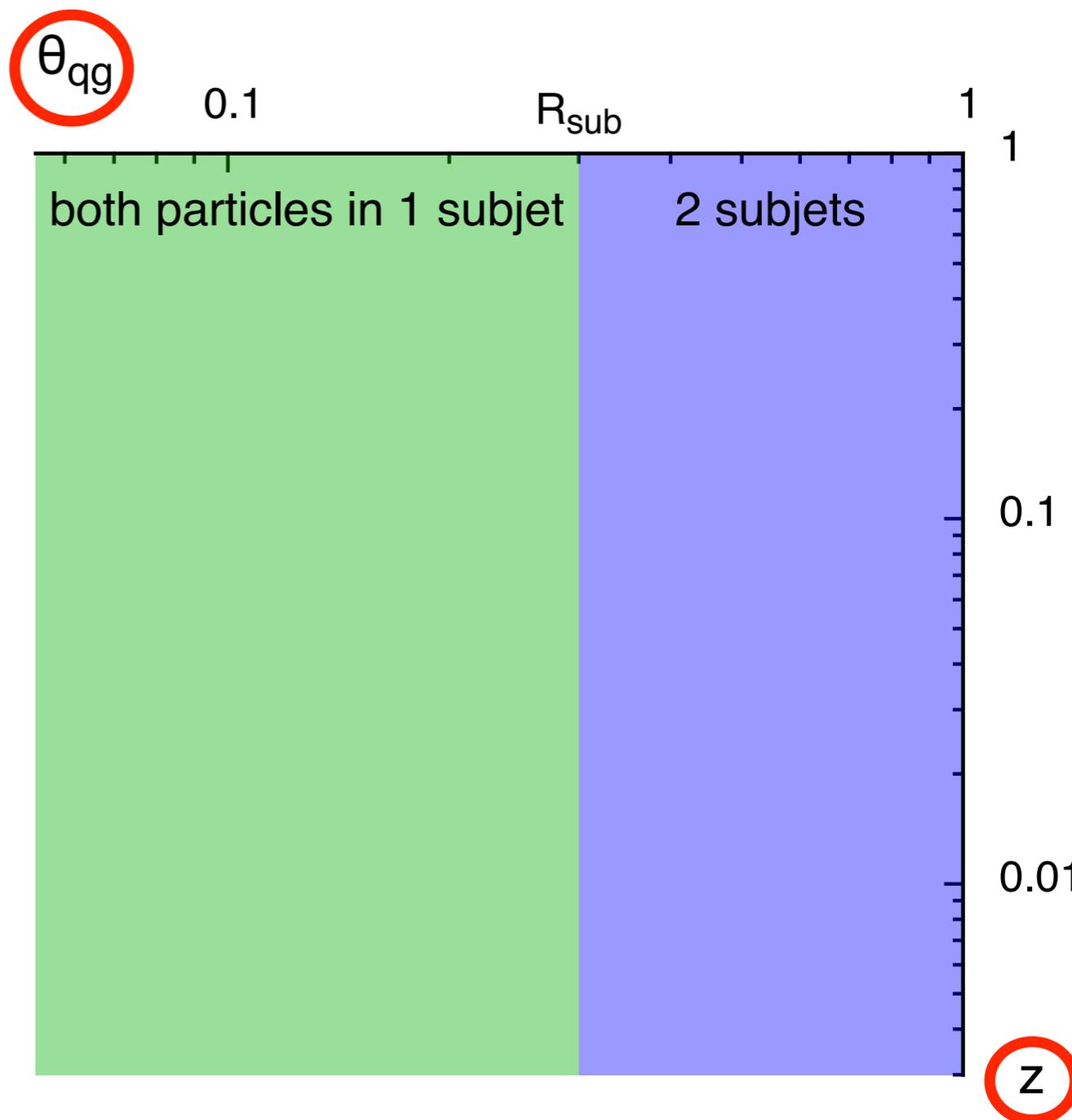
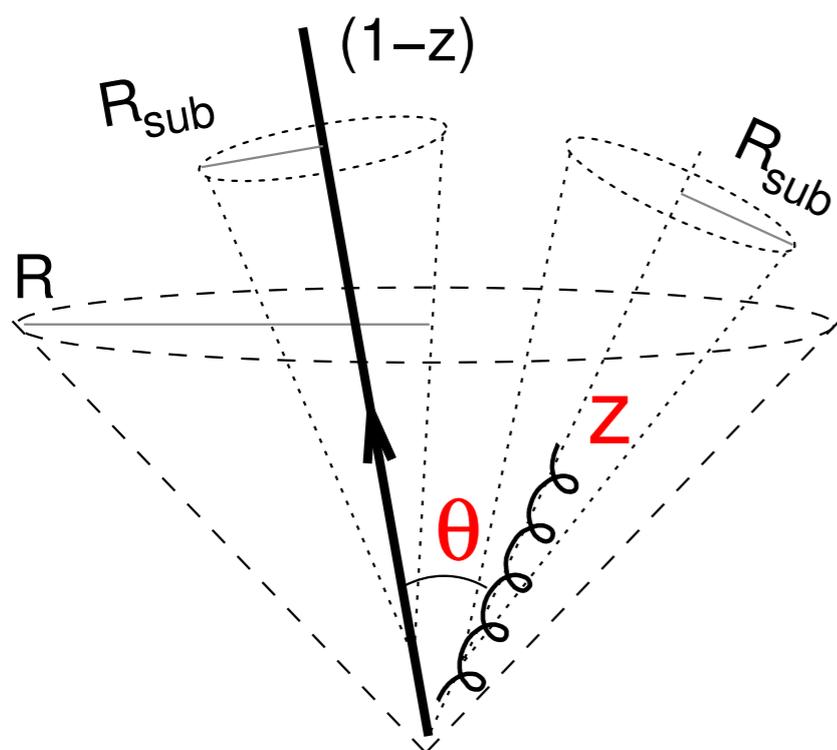
These approximations are not as “wild” as they might sound.

They can also be relaxed.

But our aim for now is to understand the taggers — we leave highest precision calculations till later.

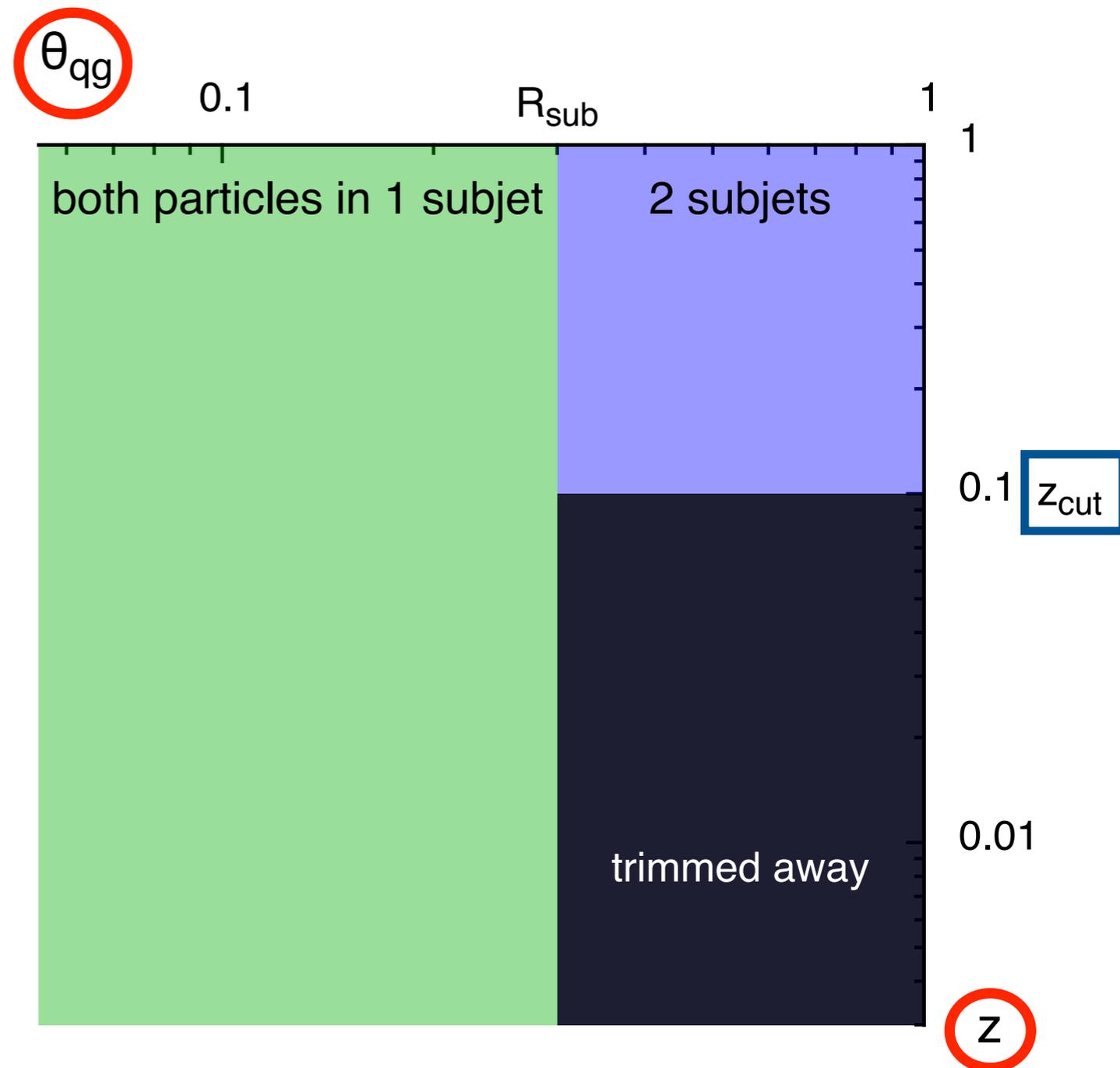
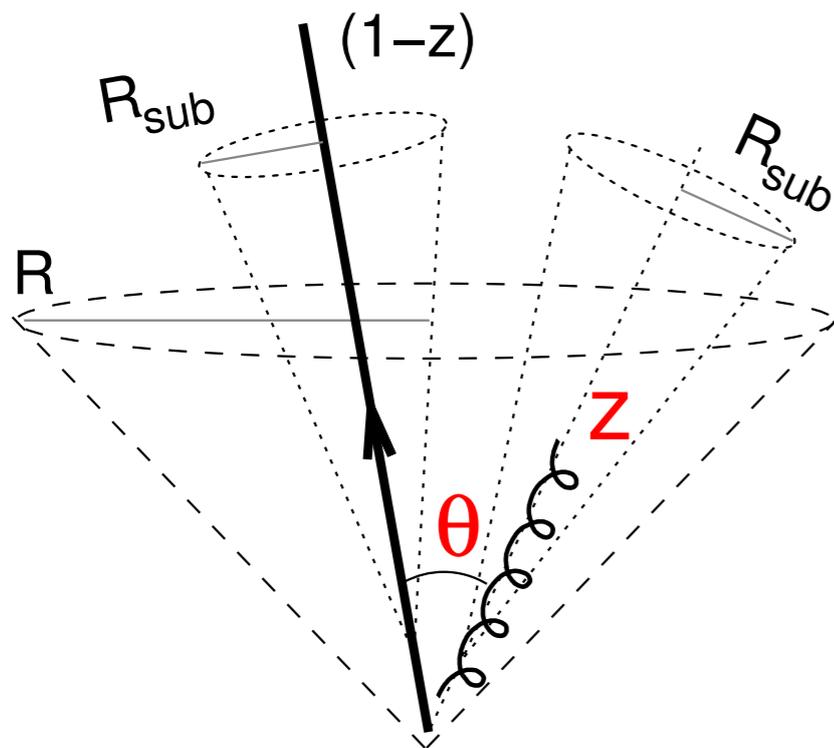
Leading Order — 2-body kinematic plane

At $O(\alpha_s)$, a quark jet emits a gluon. We study this as a function of the gluon momentum fraction z and the quark-gluon opening angle θ



Leading Order — 2-body kinematic plane

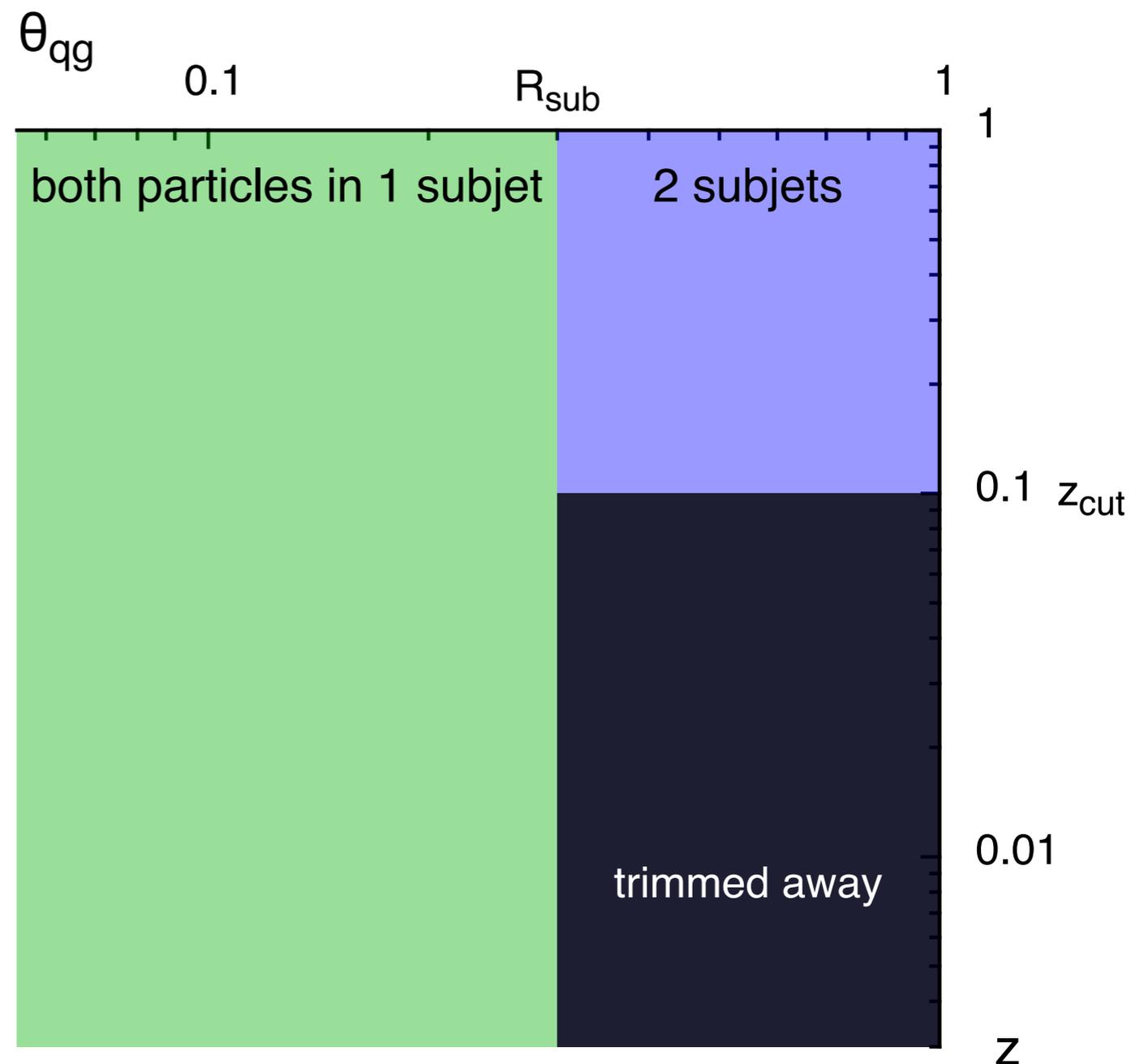
At $O(\alpha_s)$, a quark jet emits a gluon. We study this as a function of the gluon momentum fraction z and the quark-gluon opening angle θ



matrix element

$$\frac{\alpha_s C_F}{\pi} \frac{d\theta^2}{\theta^2} \frac{dz}{z}$$

emission probability \sim constant
in $\log \theta - \log z$ plane



jet mass

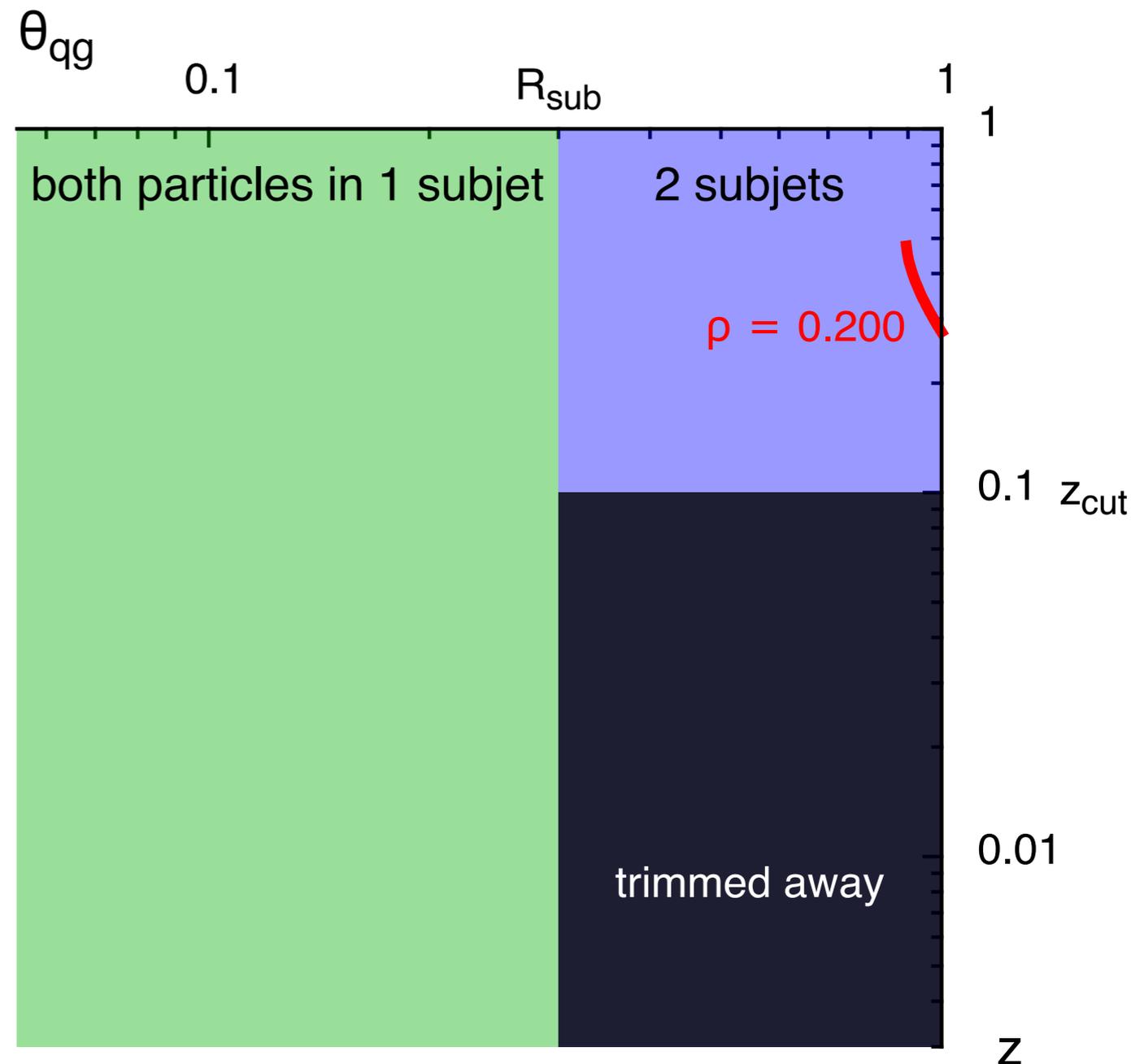
$$\rho = z(1 - z)\theta^2$$

length of **fixed- ρ contour** gives
LO differential cross section

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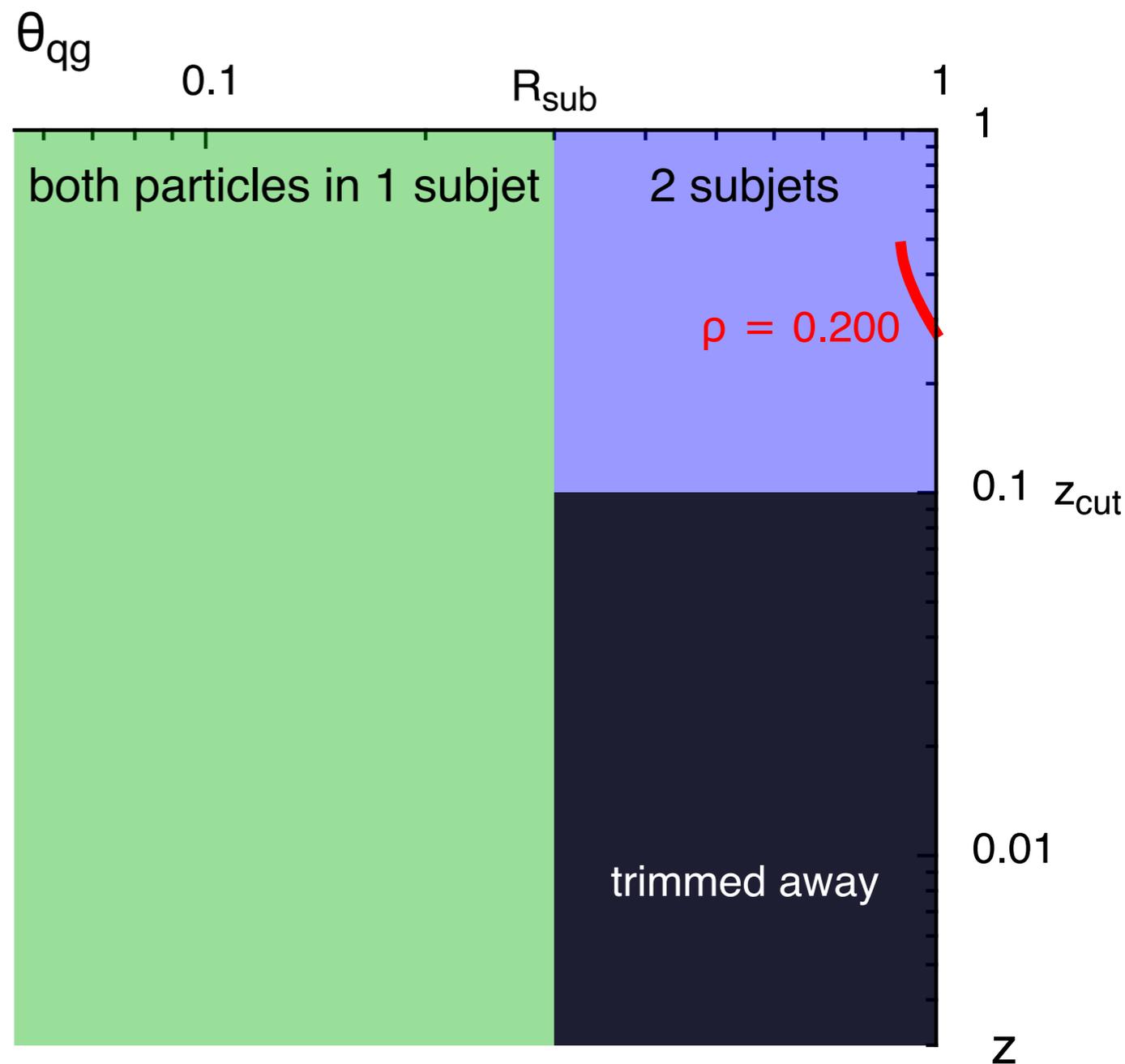
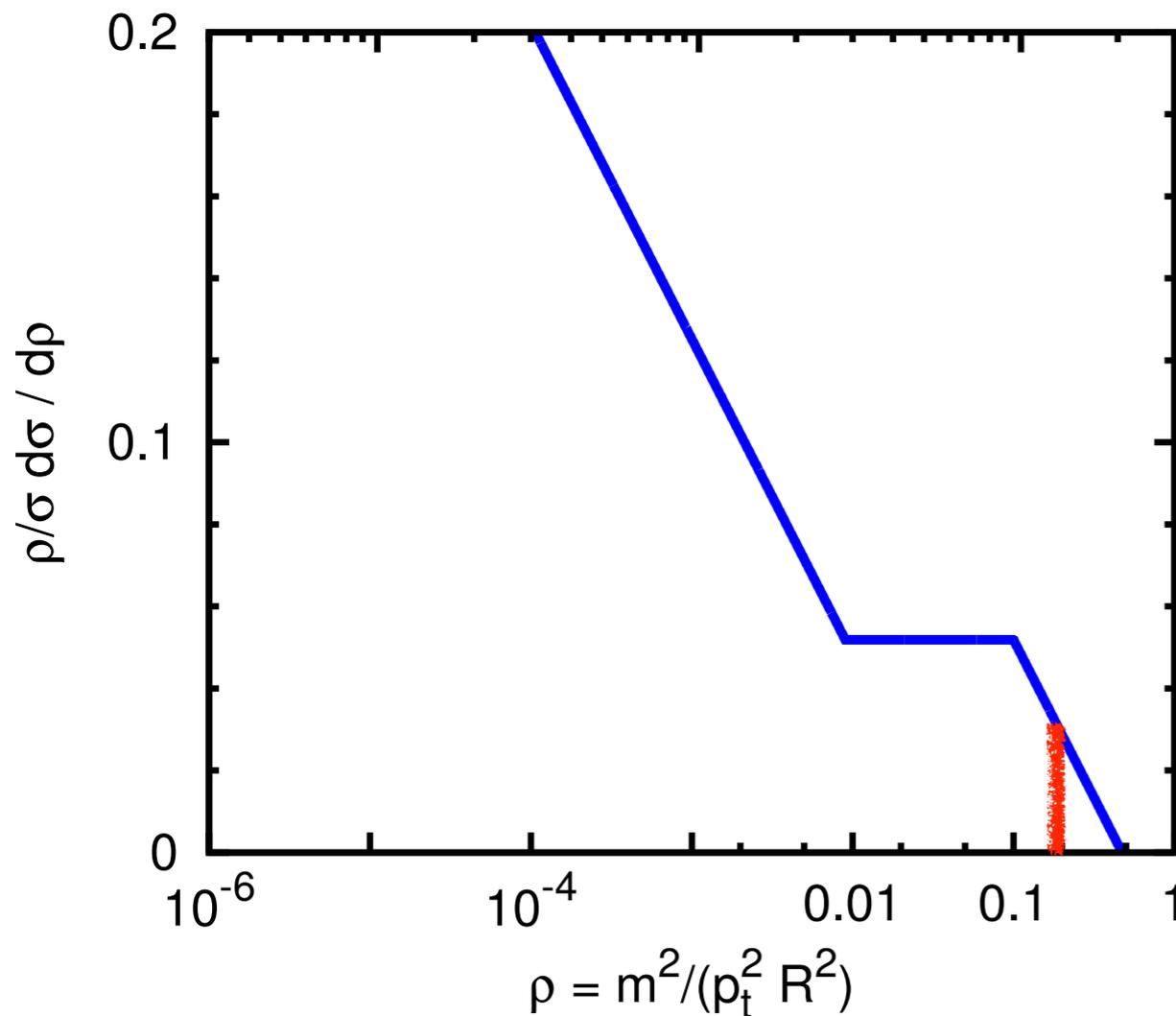
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trimmed quark jets: LO

m [GeV], for $p_t = 3$ TeV, $R=1$

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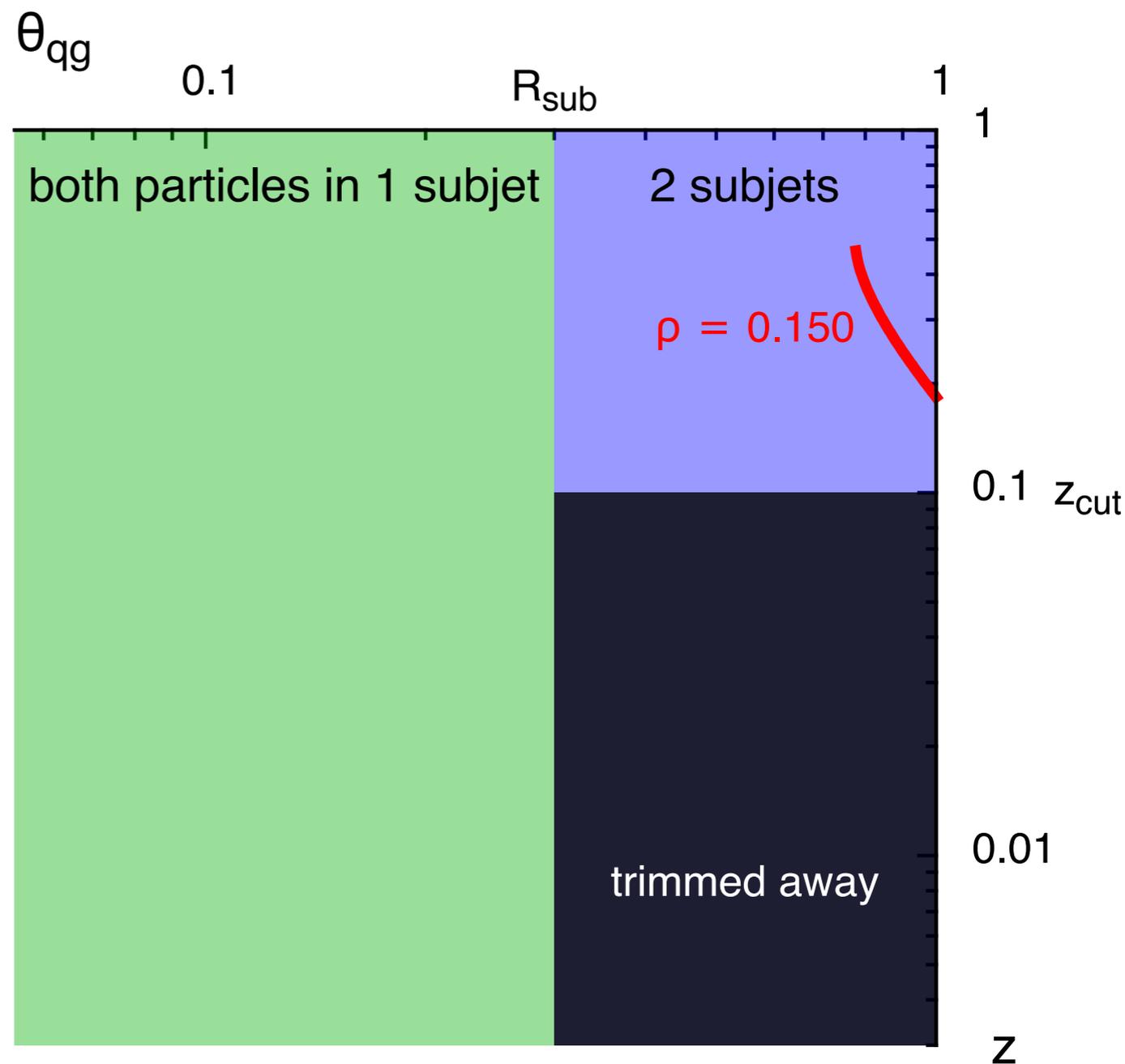
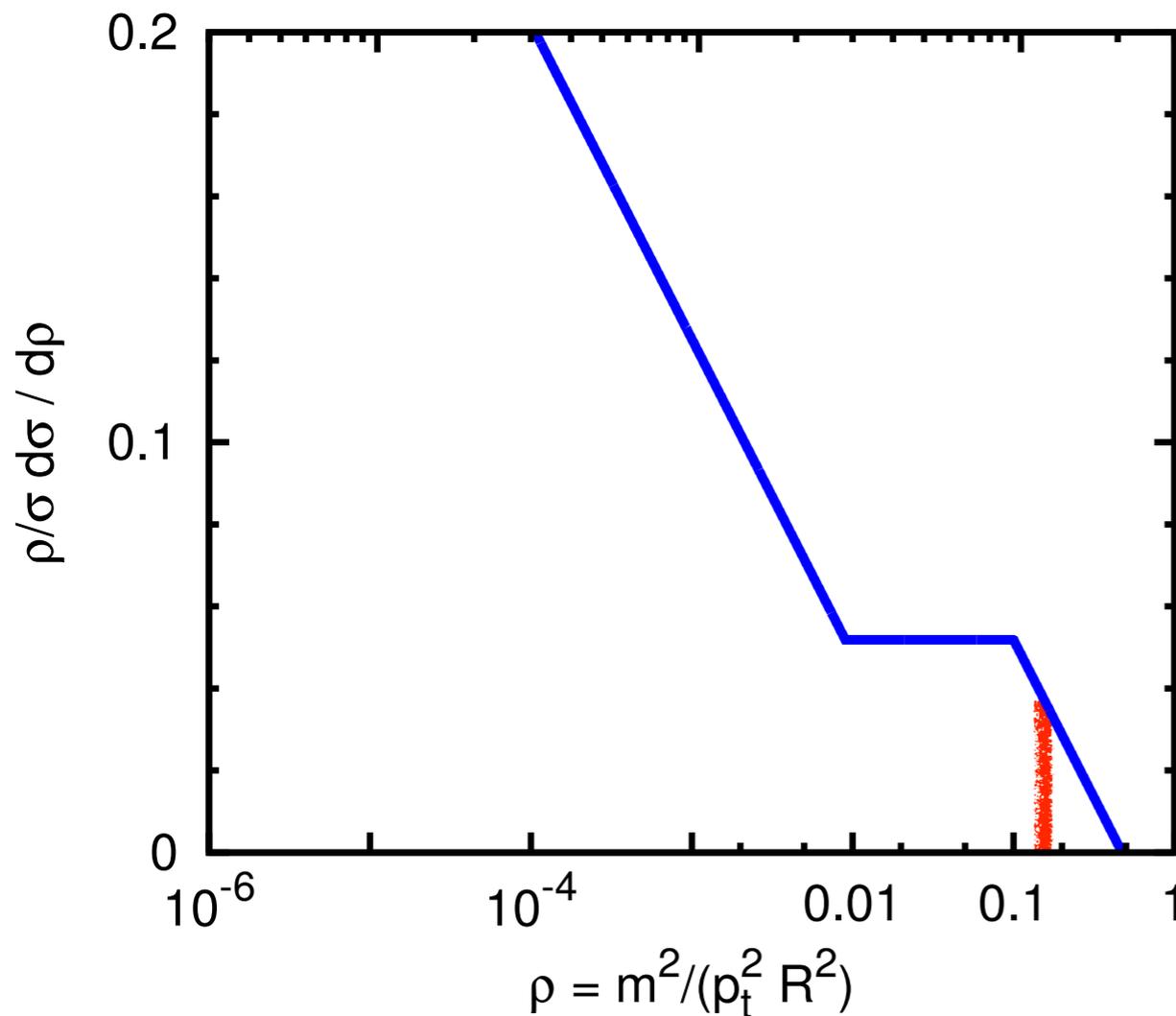
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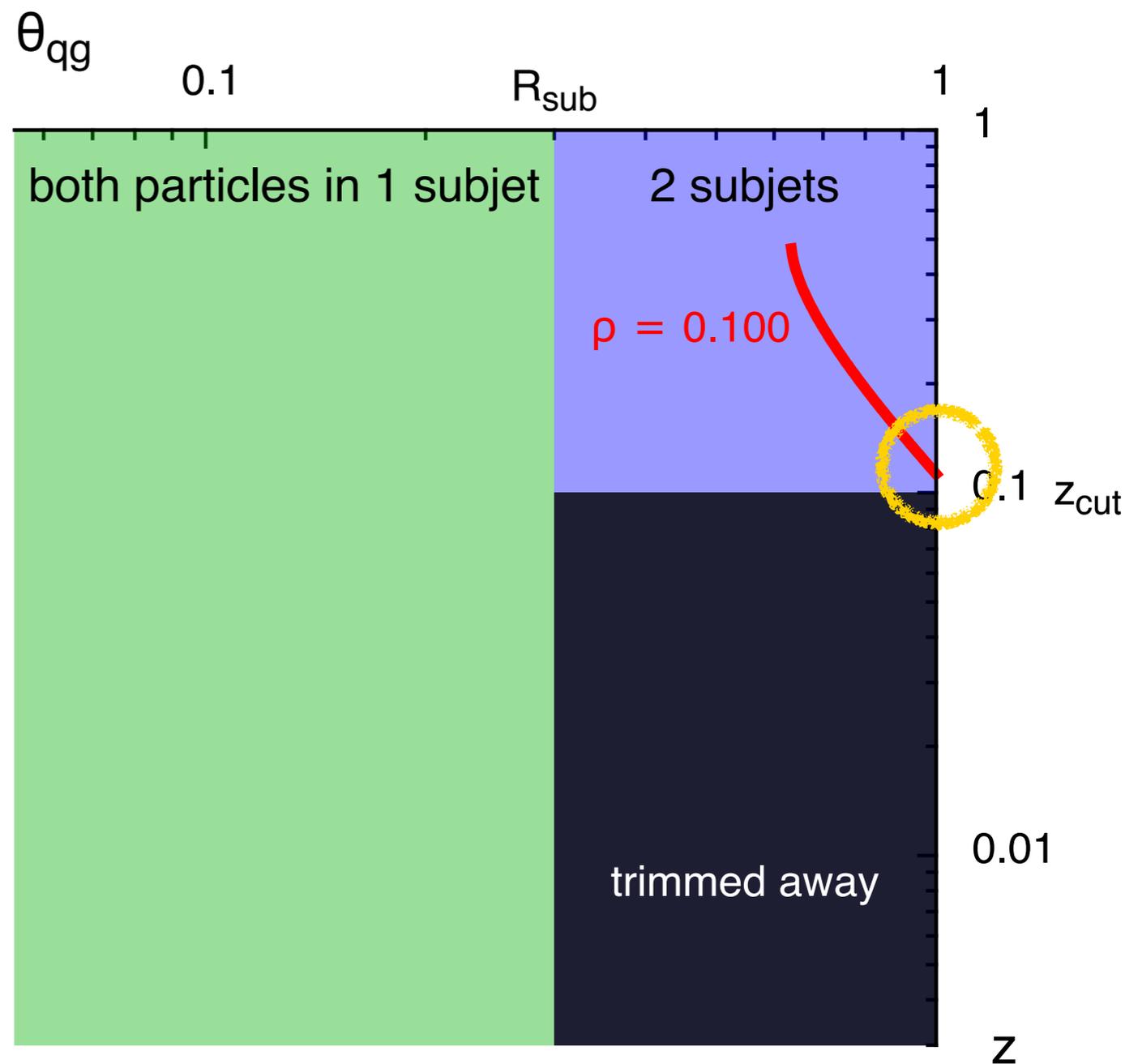
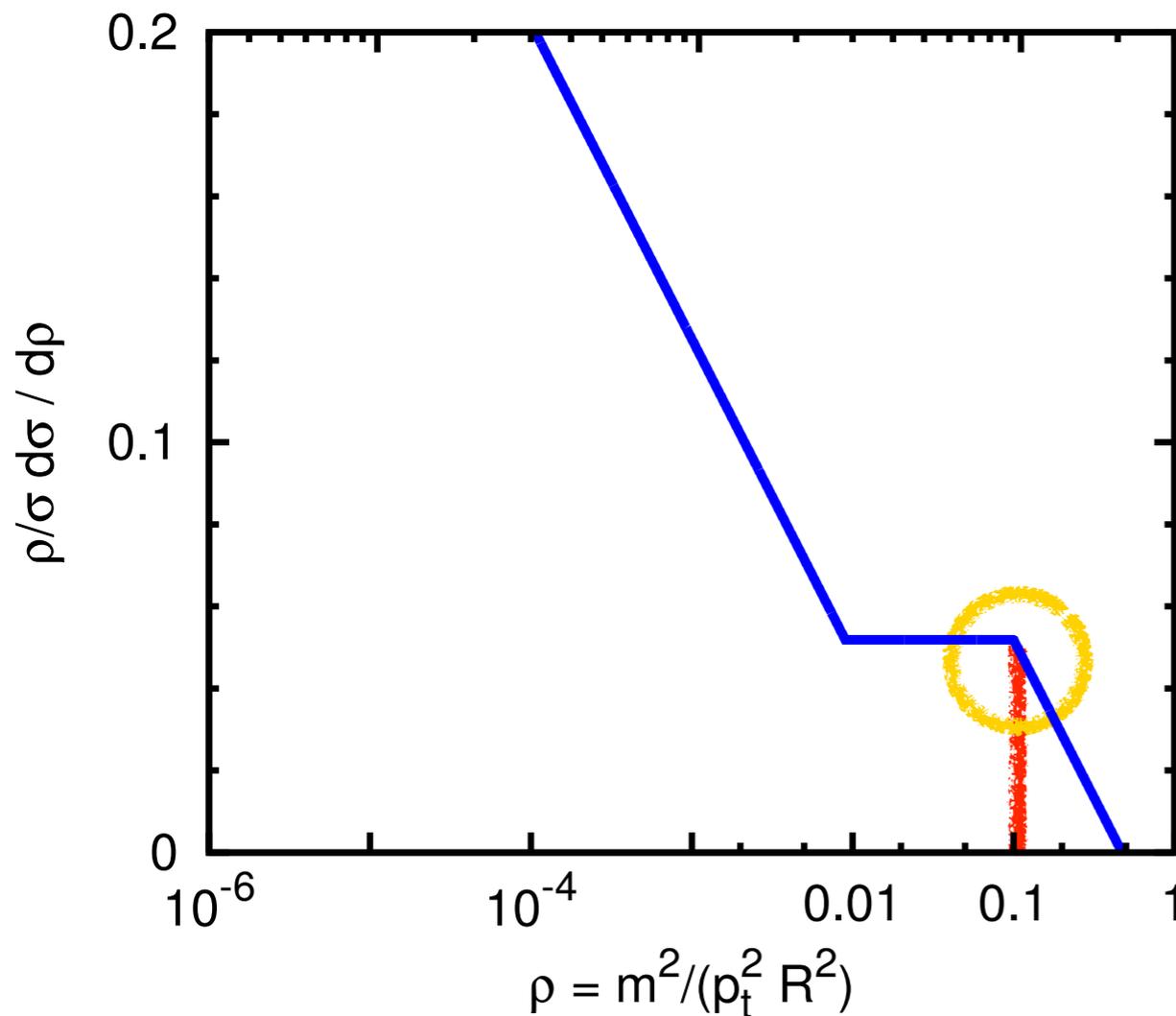
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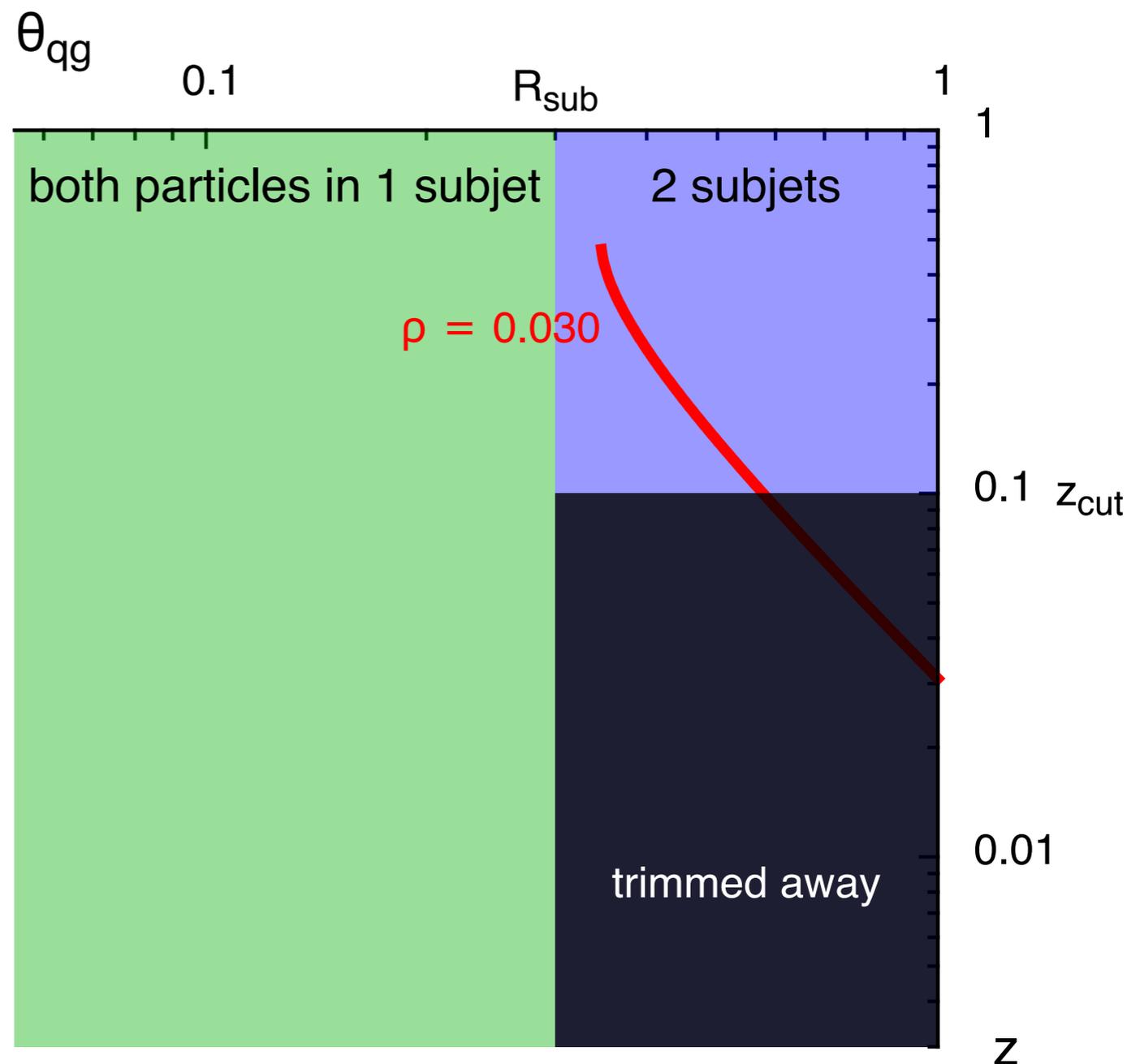
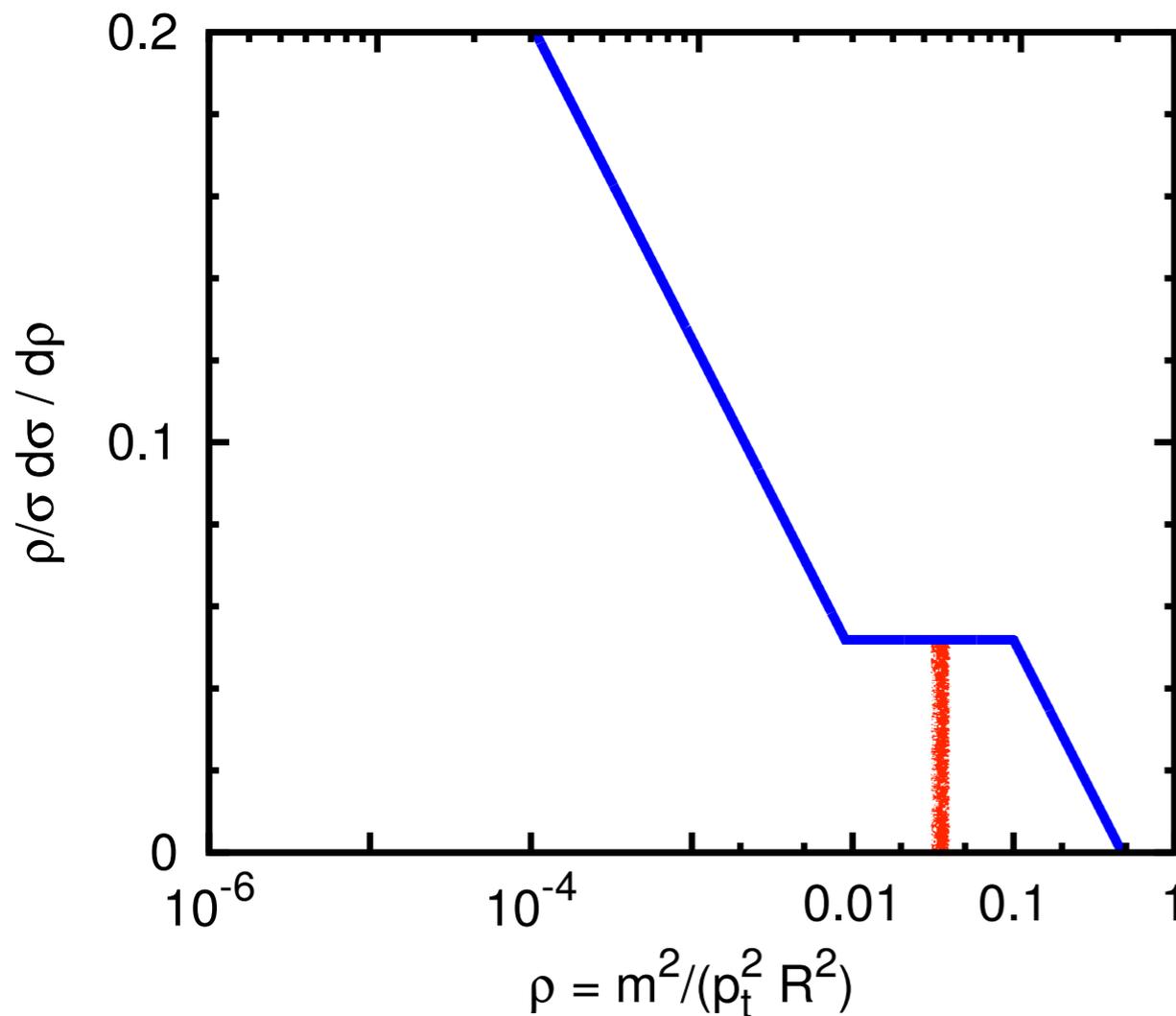
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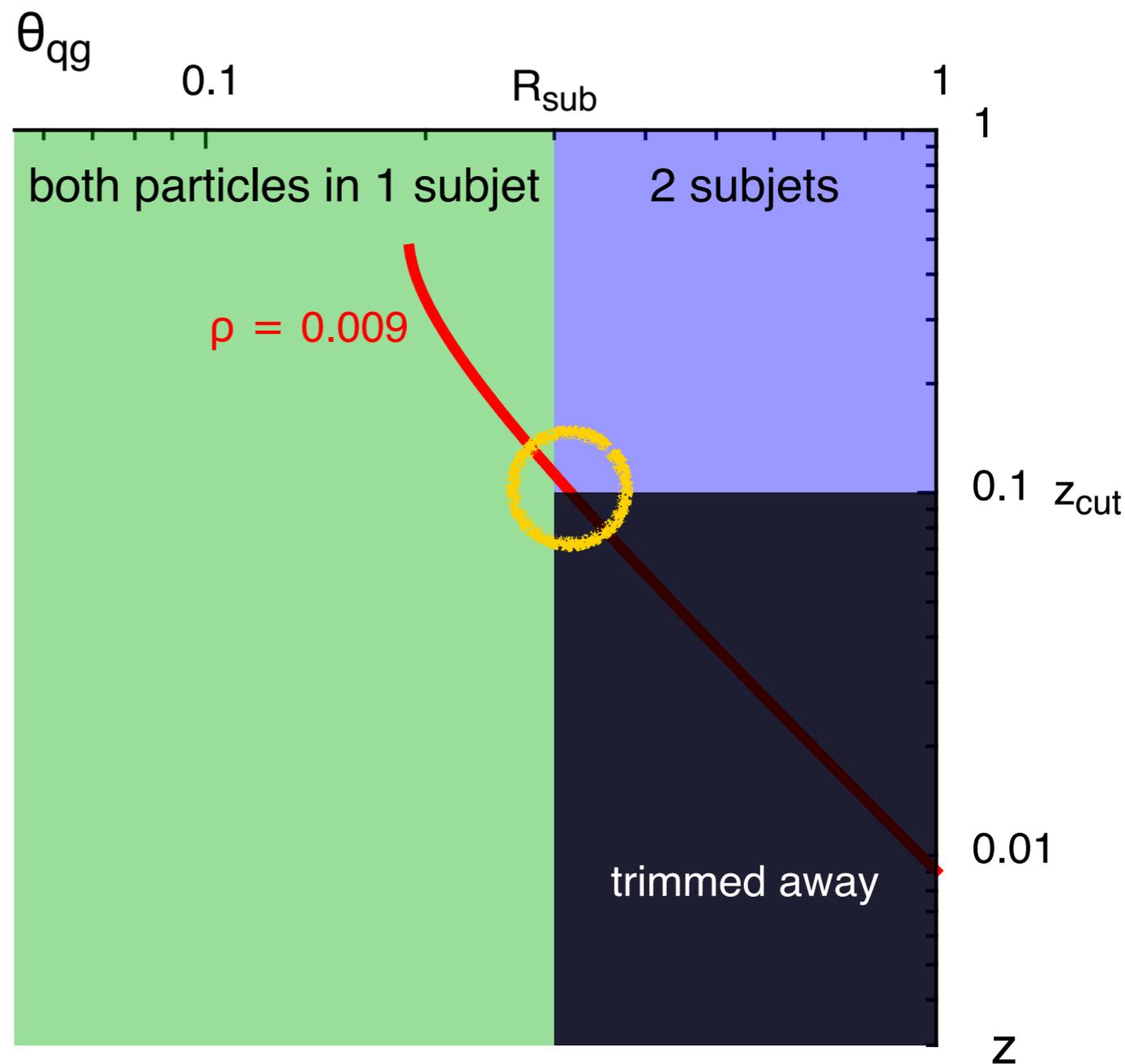
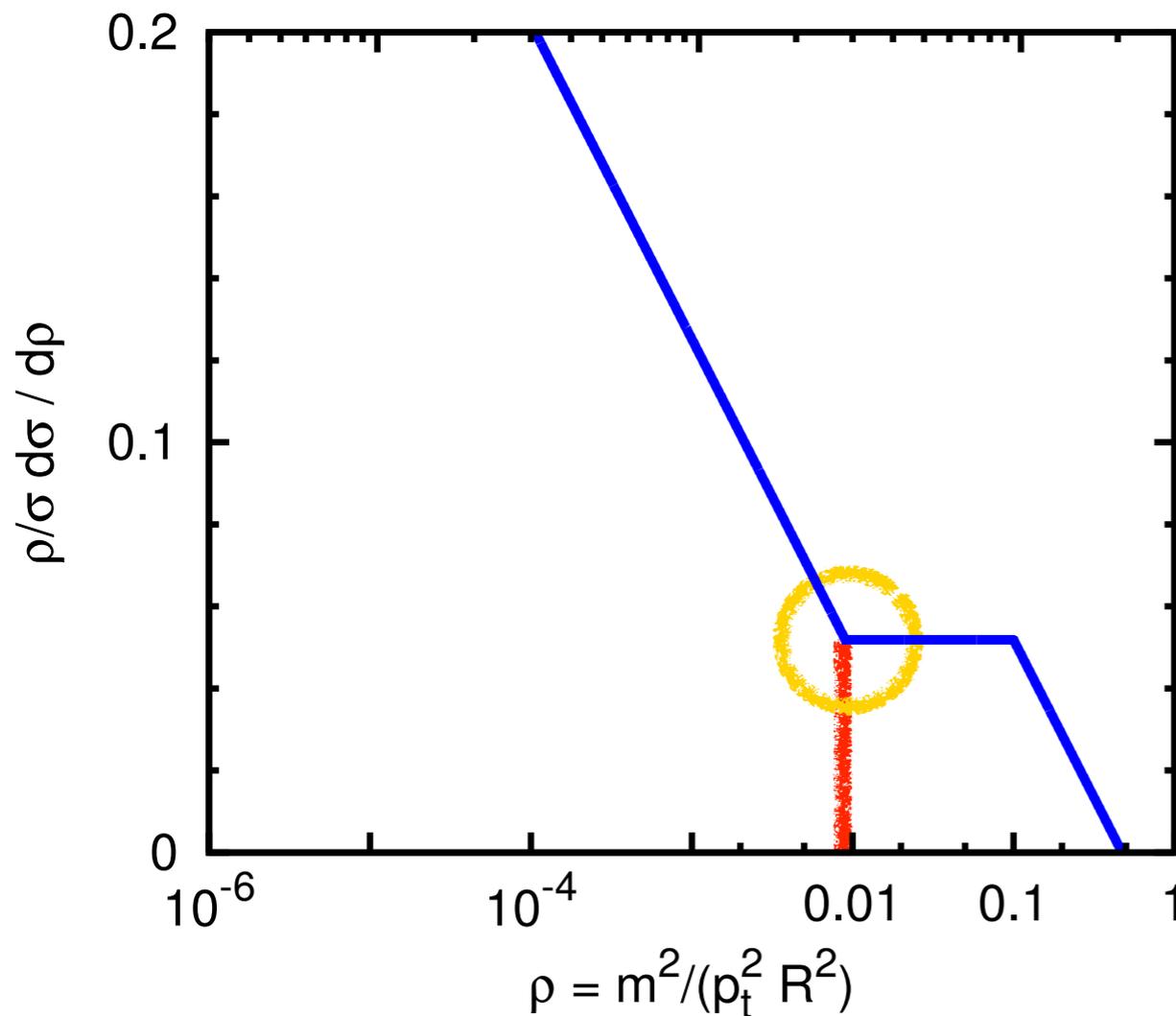
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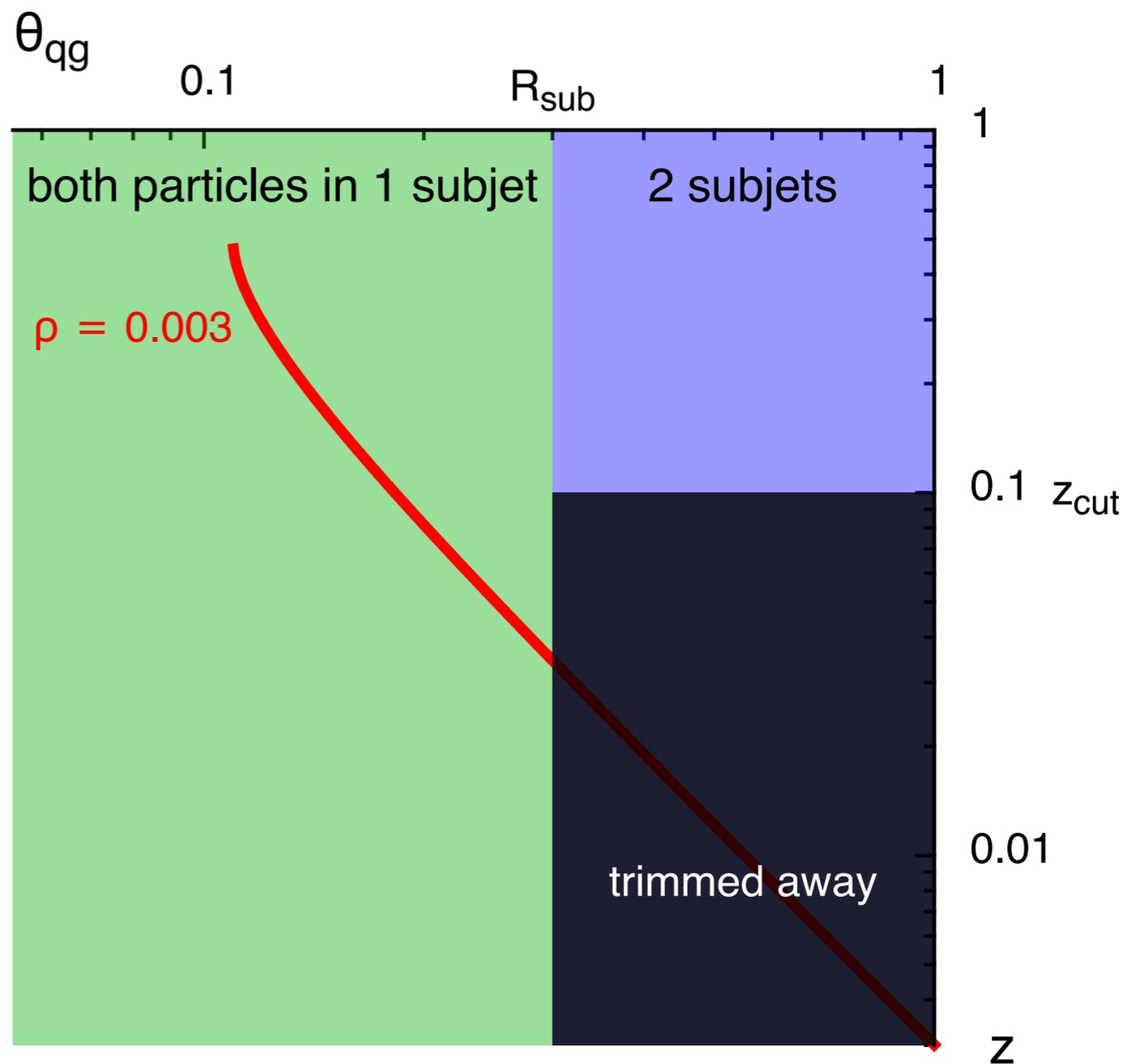
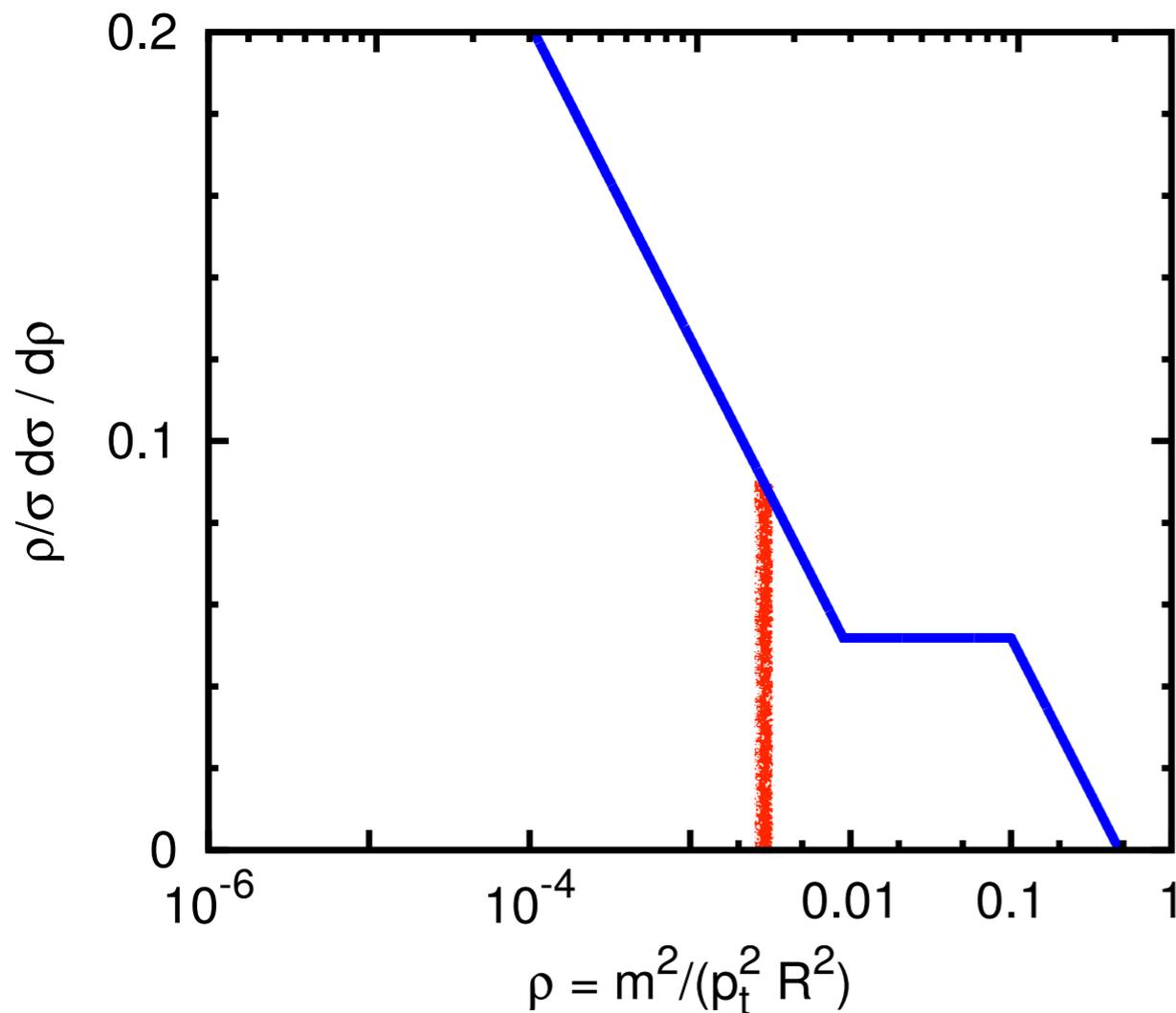
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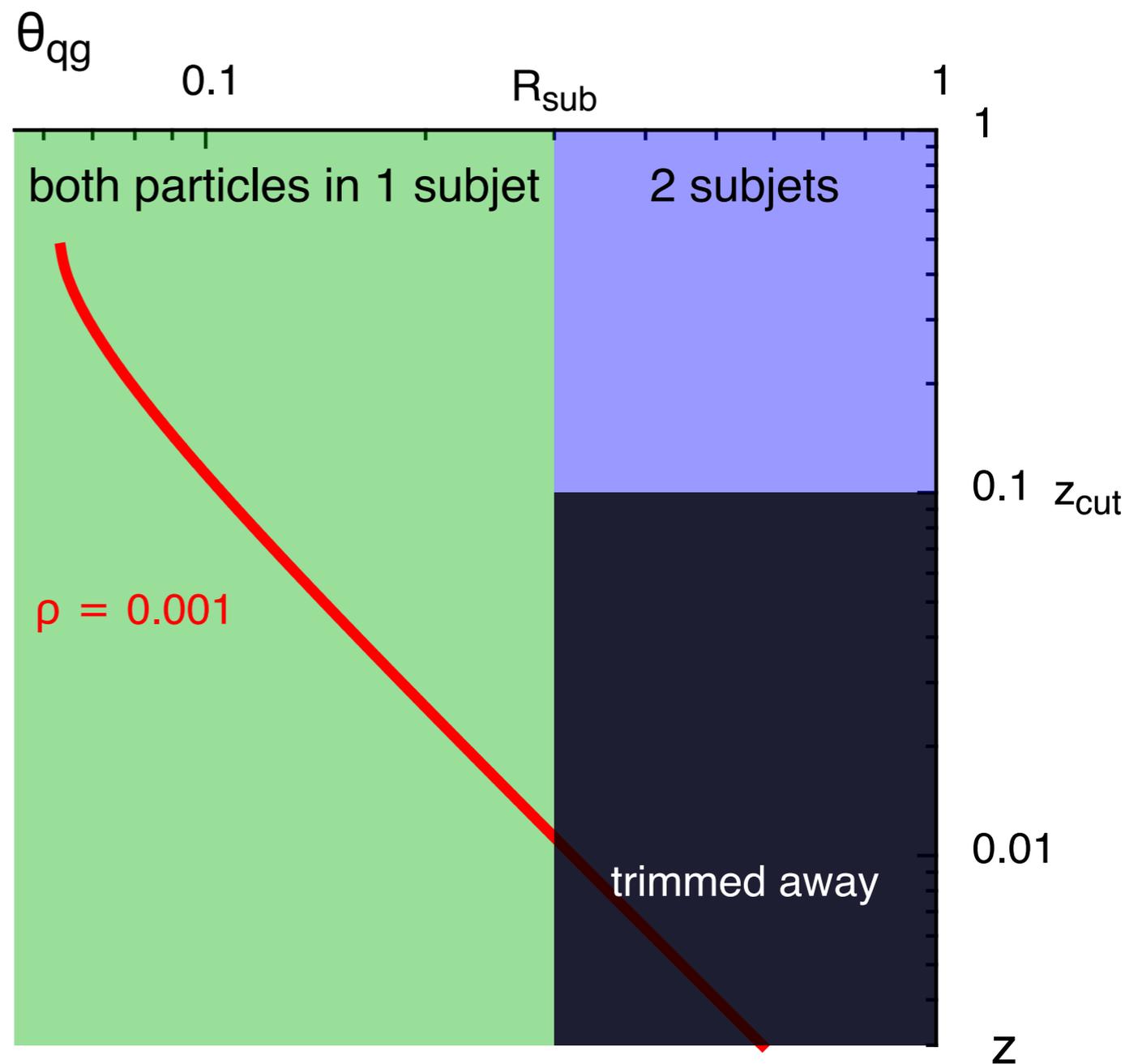
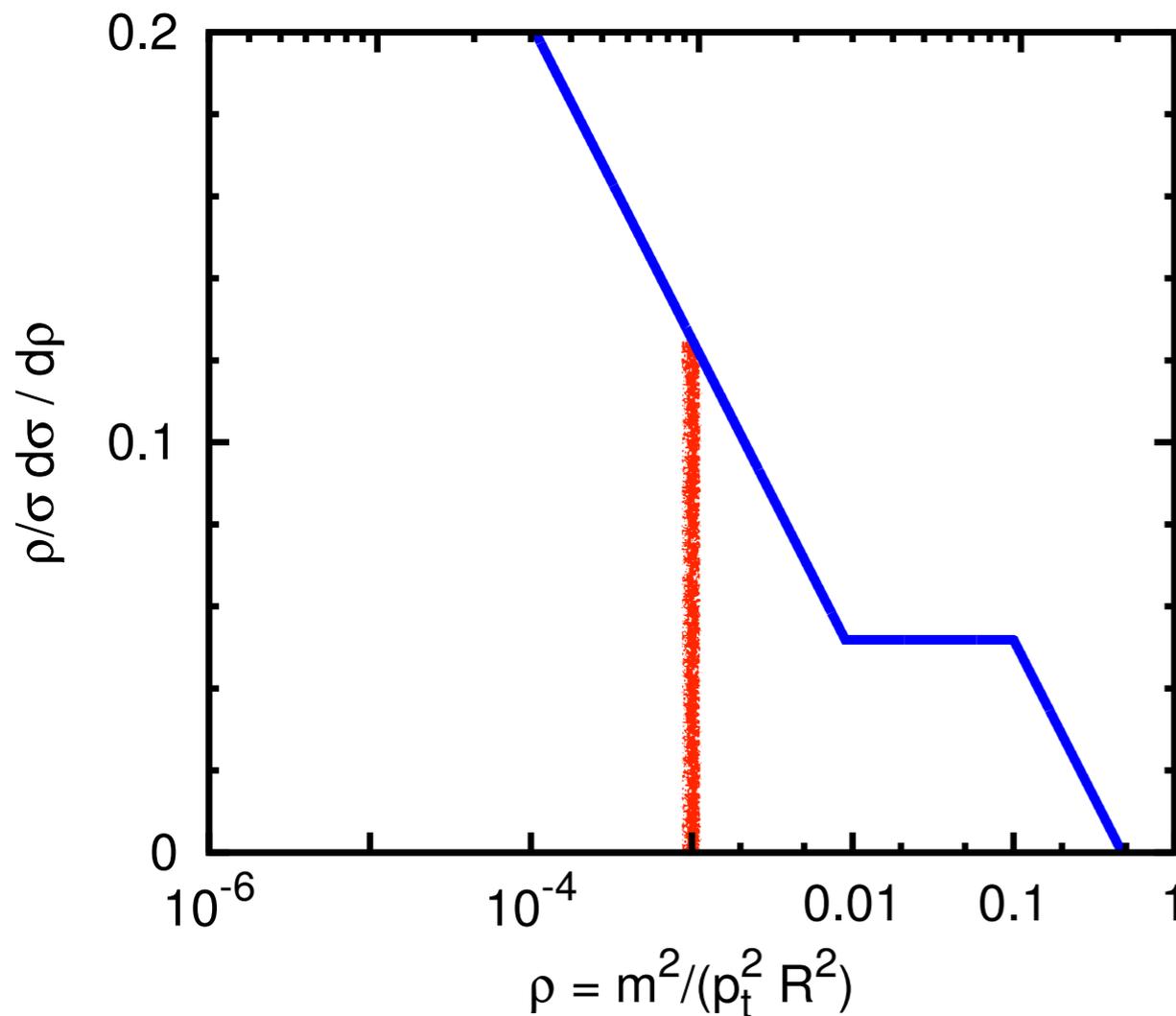
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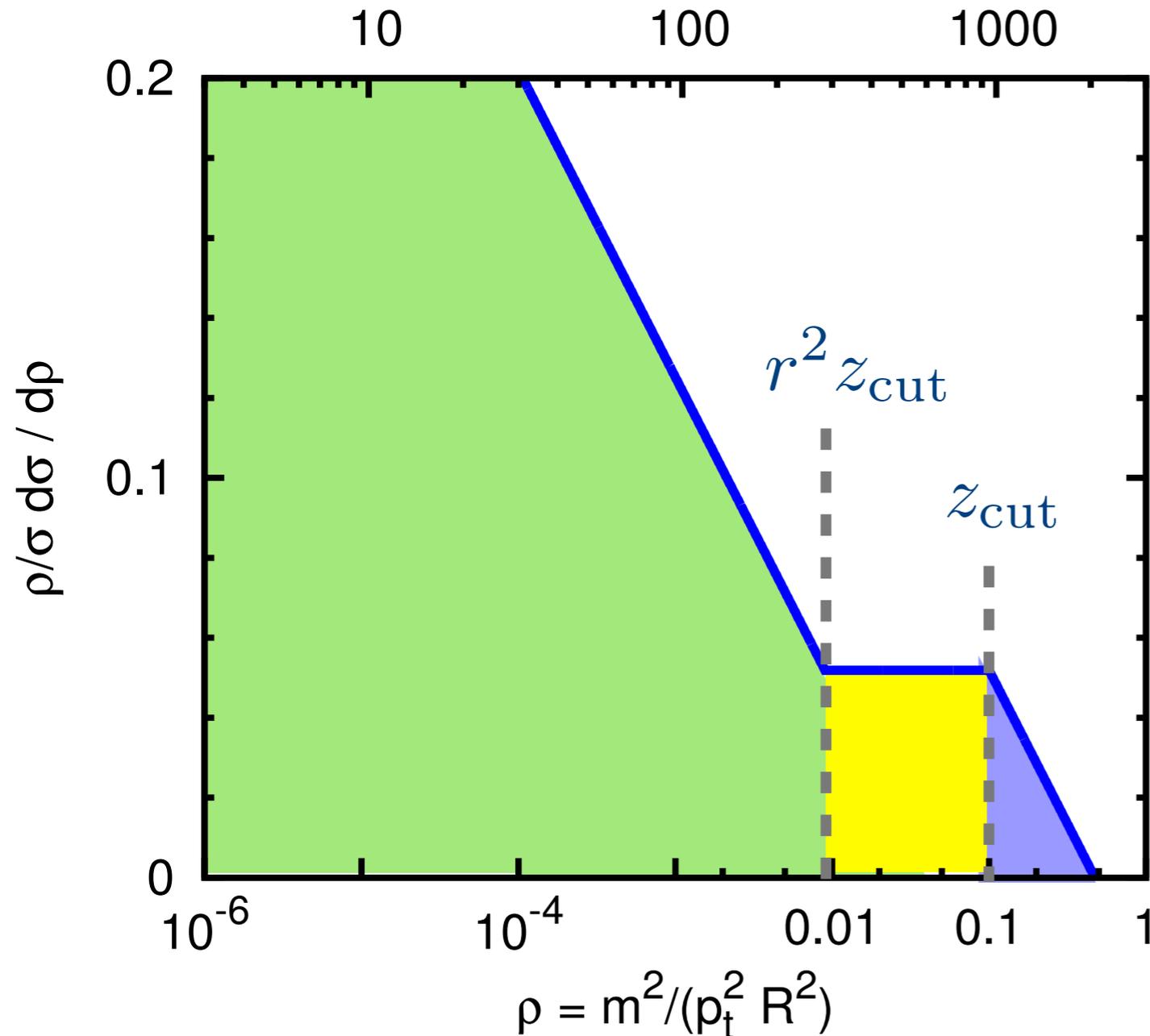
m [GeV], for $p_t = 3$ TeV, $R=1$

10 100 1000



trimmed quark jets: LO

m [GeV], for $p_t = 3$ TeV, $R=1$



$$\frac{\rho \, d\sigma^{(\text{trim,LO})}}{\sigma \, d\rho} =$$

$$\frac{\alpha_s C_F}{\pi} \left(\ln \frac{r^2}{\rho} - \frac{3}{4} \right)$$

$$\frac{\alpha_s C_F}{\pi} \left(\ln \frac{1}{z_{\text{cut}}} - \frac{3}{4} \right)$$

$$\frac{\alpha_s C_F}{\pi} \left(\ln \frac{1}{\rho} - \frac{3}{4} \right)$$

$$r = \frac{R_{\text{sub}}}{R}$$

continue with all-order
resummation of terms

$$\alpha_s^n \ln^m \rho$$

Inputs

QCD pattern
of multiple
soft/collinear
emission

Analysis of
taggers'
behaviour for
1, 2, 3, ... n,
emissions

Establish which
simplifying
approximations
to use for
tagger & matrix
elements

Output

approx.
formula for
tagger's mass
distribution for
 $\rho \ll 1$

$$\frac{\rho}{\sigma} \frac{d\sigma}{d\rho} =$$

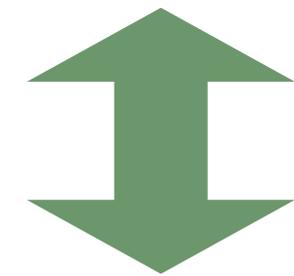
$$\sum_{n=1}^{\infty} c_{nm} \alpha_s^n \ln^m \rho$$

keeping only terms with
largest powers of $\ln \rho$,
e.g. $m = 2n, 2n-1$

Trimming

$$\rho^{\text{trim}}(k_1, k_2, \dots, k_n) \simeq \sum_i^n \rho^{\text{trim}}(k_i) \\ \sim \max_i \{ \rho^{\text{trim}}(k_i) \}$$

**Trimmed jet reduces
(\sim) to sum of
trimmed emissions**



Matrix element

$$\sum_n \frac{1}{n!} \prod_i^n \frac{d\theta_i^2}{\theta_i^2} \frac{dz_i}{z_i} \frac{\alpha_s(\theta_i z_i p_t^{\text{jet}}) C_F}{\pi}$$

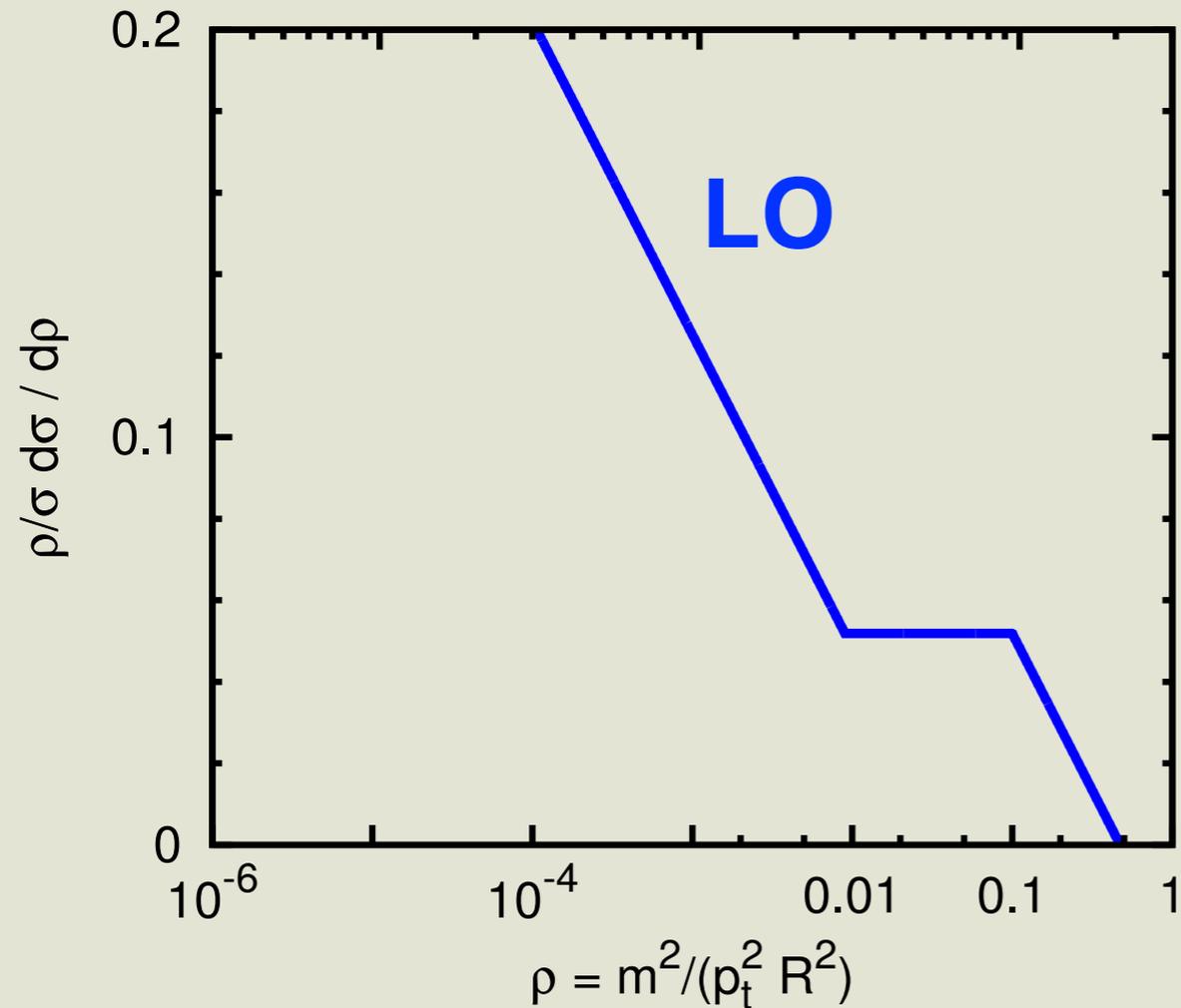
**can use QED-like
independent
emissions, as if
gluons don't split**

$$\frac{d\sigma^{\text{trim,resum}}}{d\rho} = \frac{d\sigma^{\text{trim,LO}}}{d\rho}$$

trimmed quark jets: LO

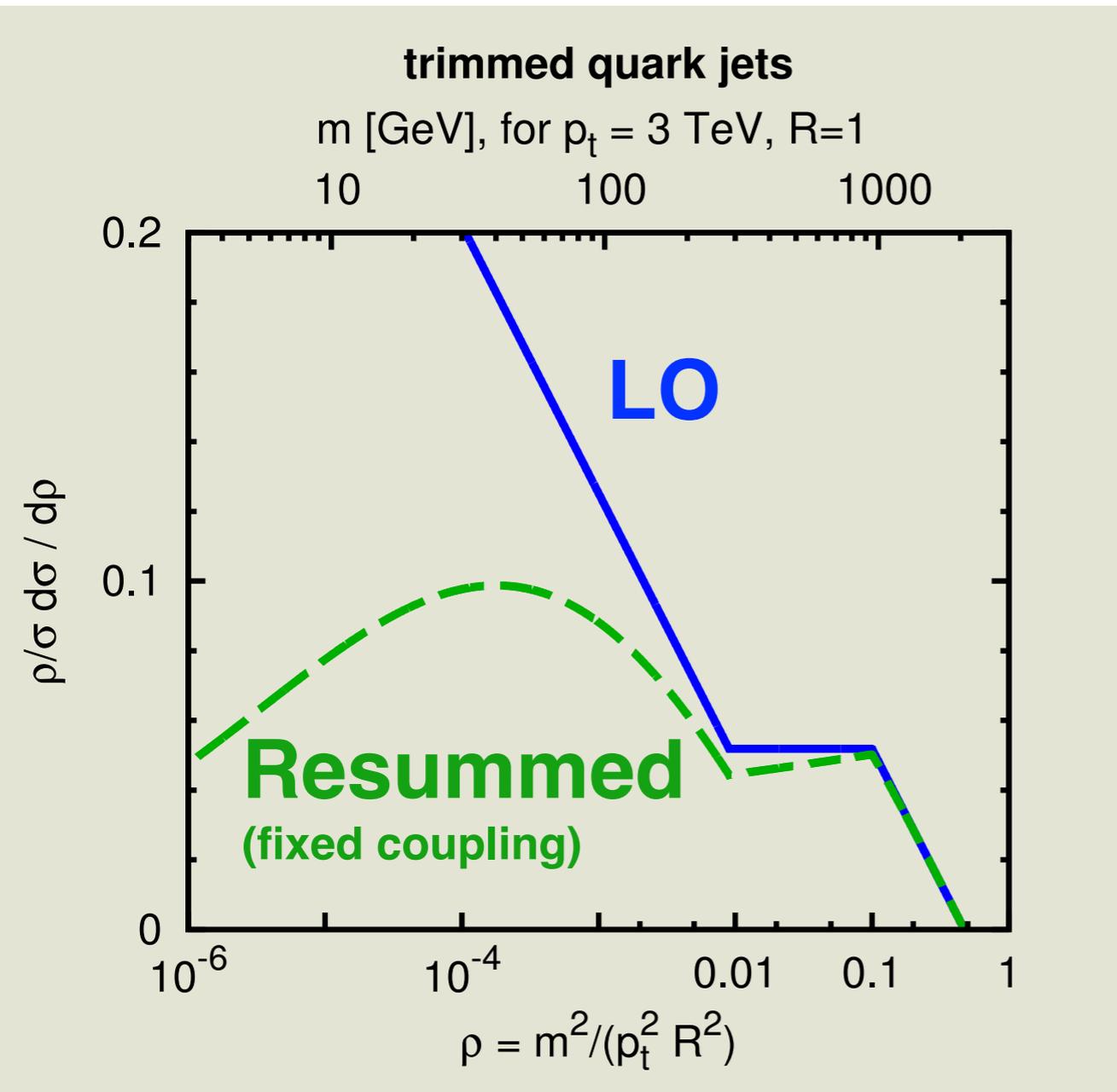
m [GeV], for $p_t = 3$ TeV, $R=1$

10 100 1000



Trimming at all orders

$$\frac{d\sigma^{\text{trim,resum}}}{d\rho} = \frac{d\sigma^{\text{trim,LO}}}{d\rho} \exp \left[- \int_{\rho} d\rho' \frac{1}{\sigma} \frac{d\sigma^{\text{trim,LO}}}{d\rho'} \right]$$

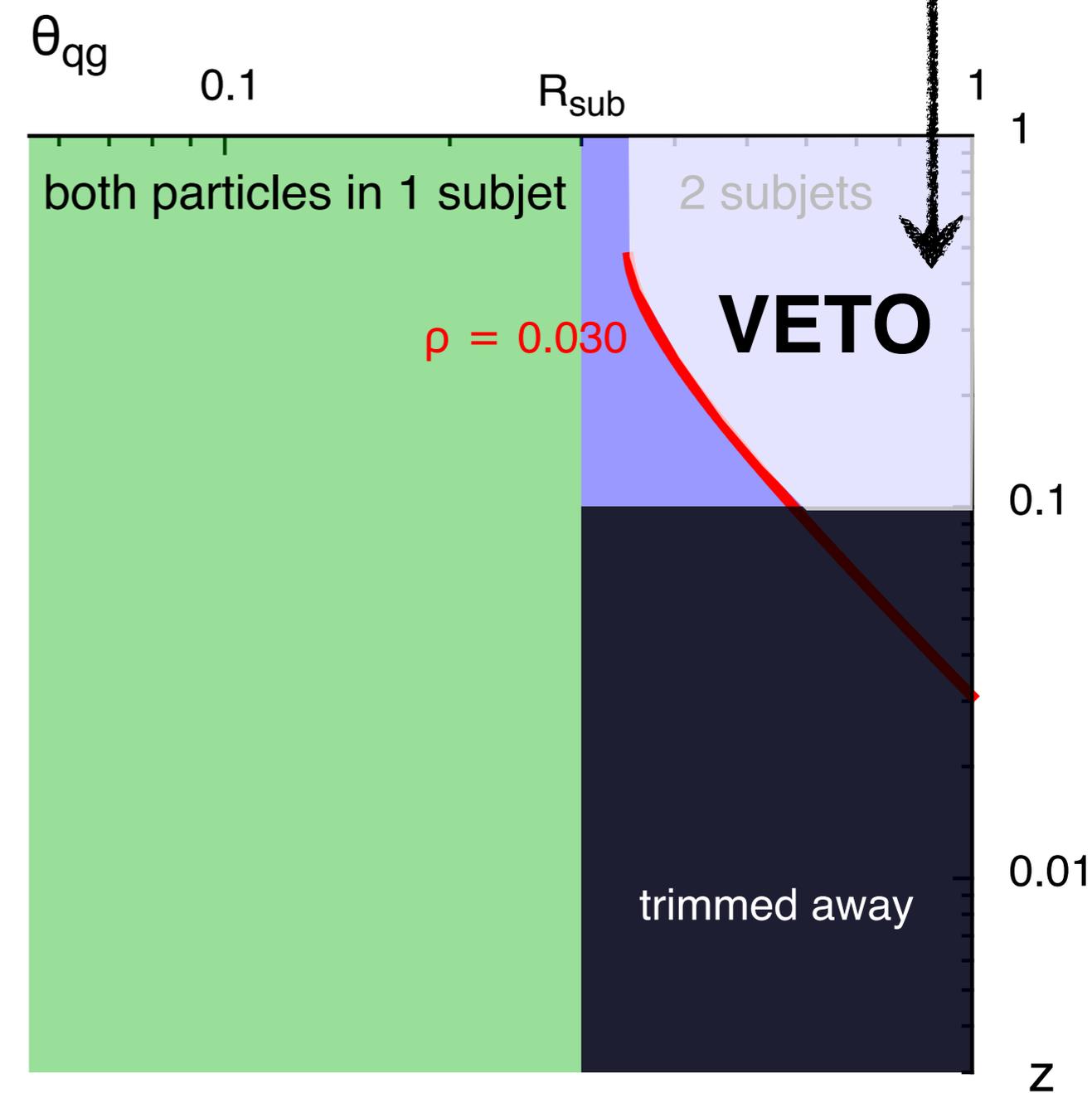
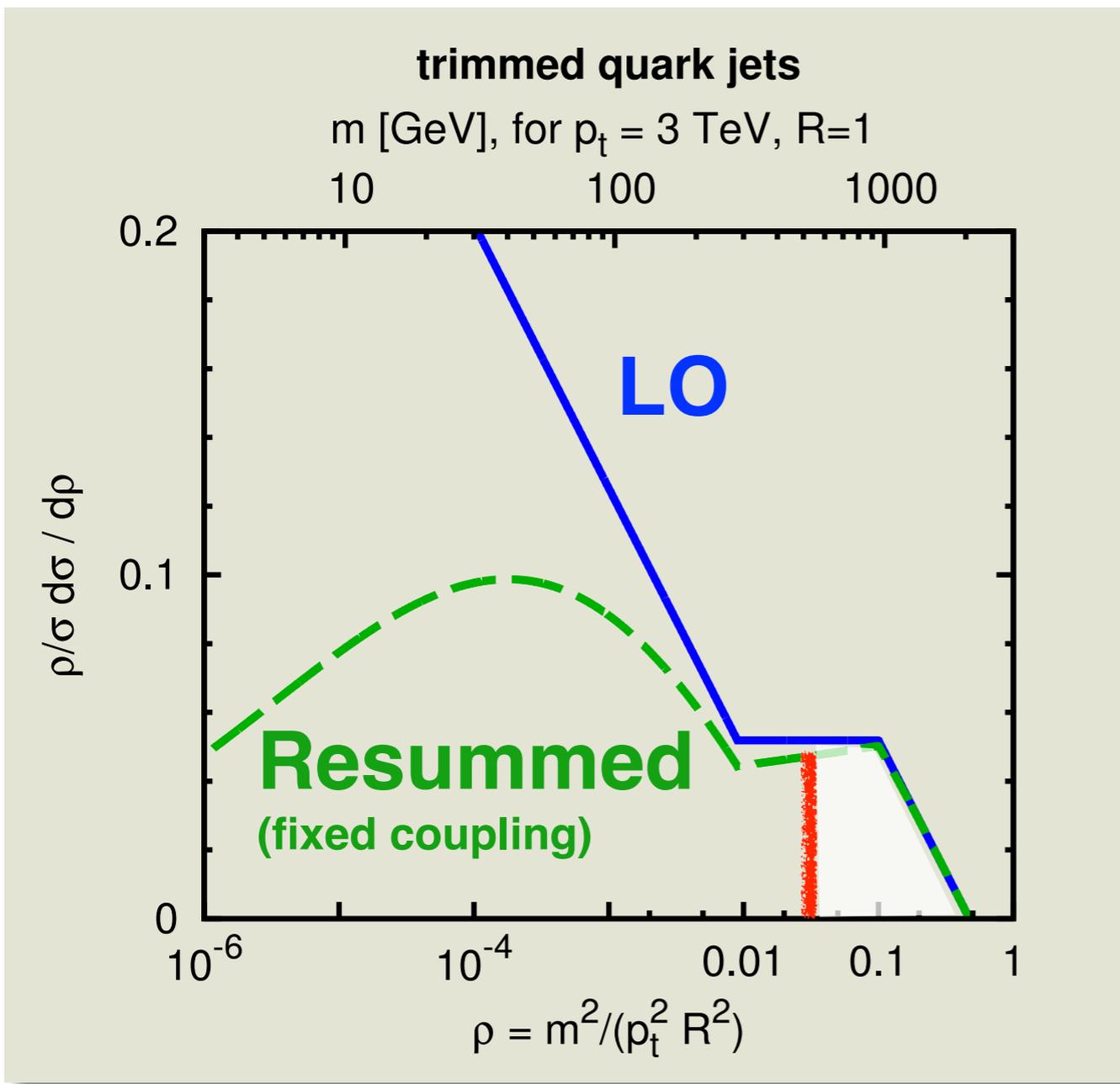


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Sudakov

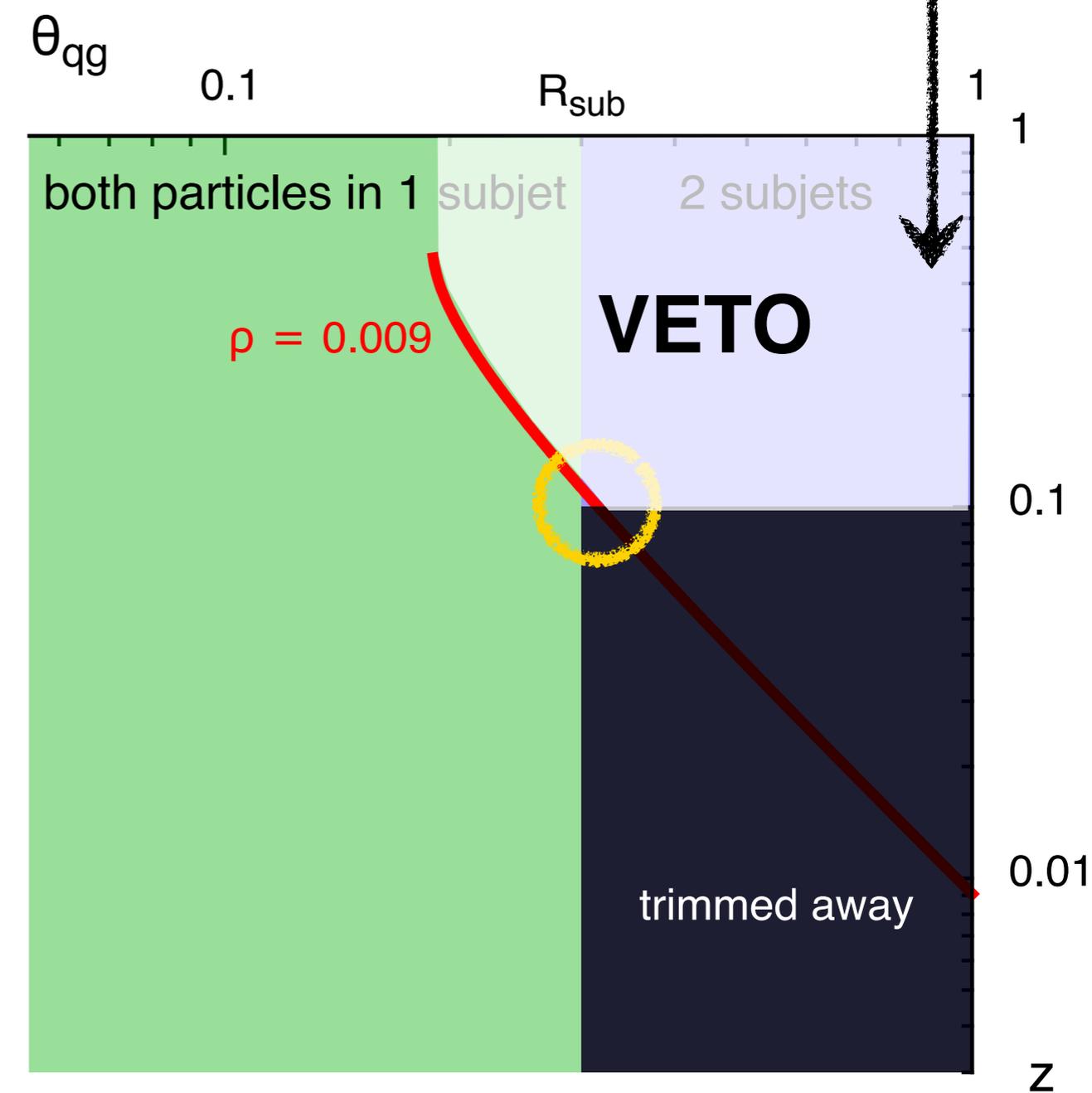
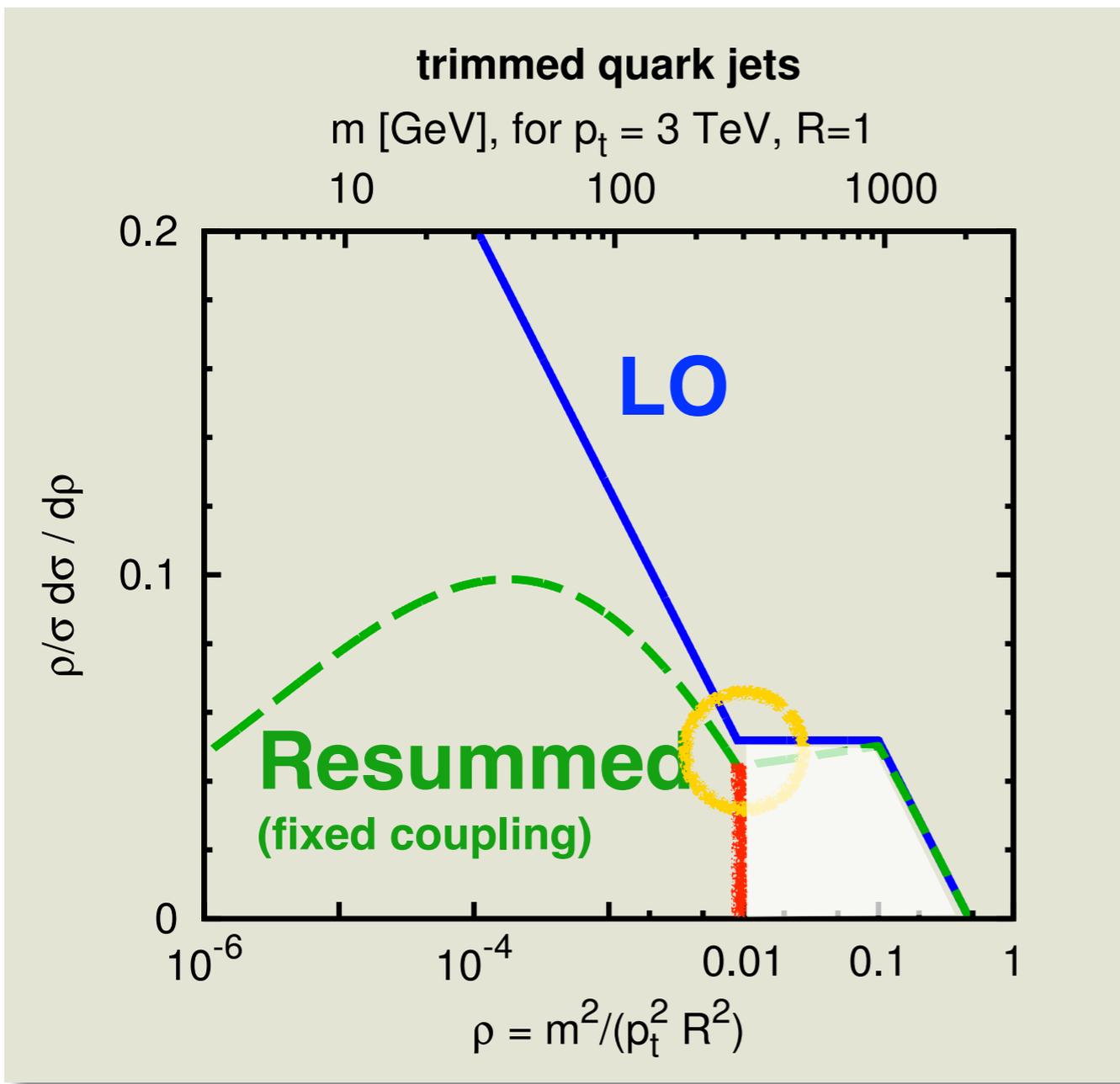


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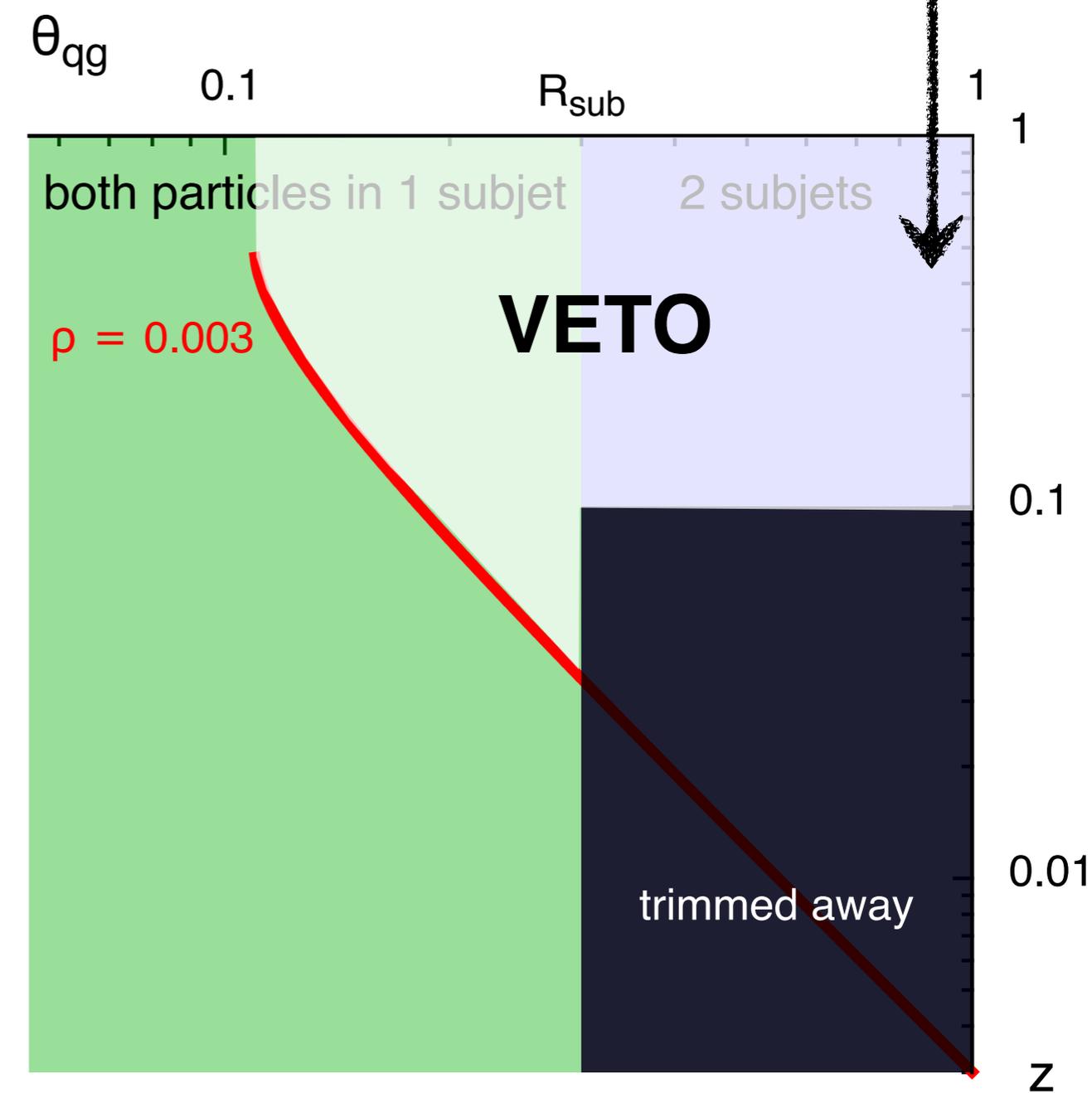
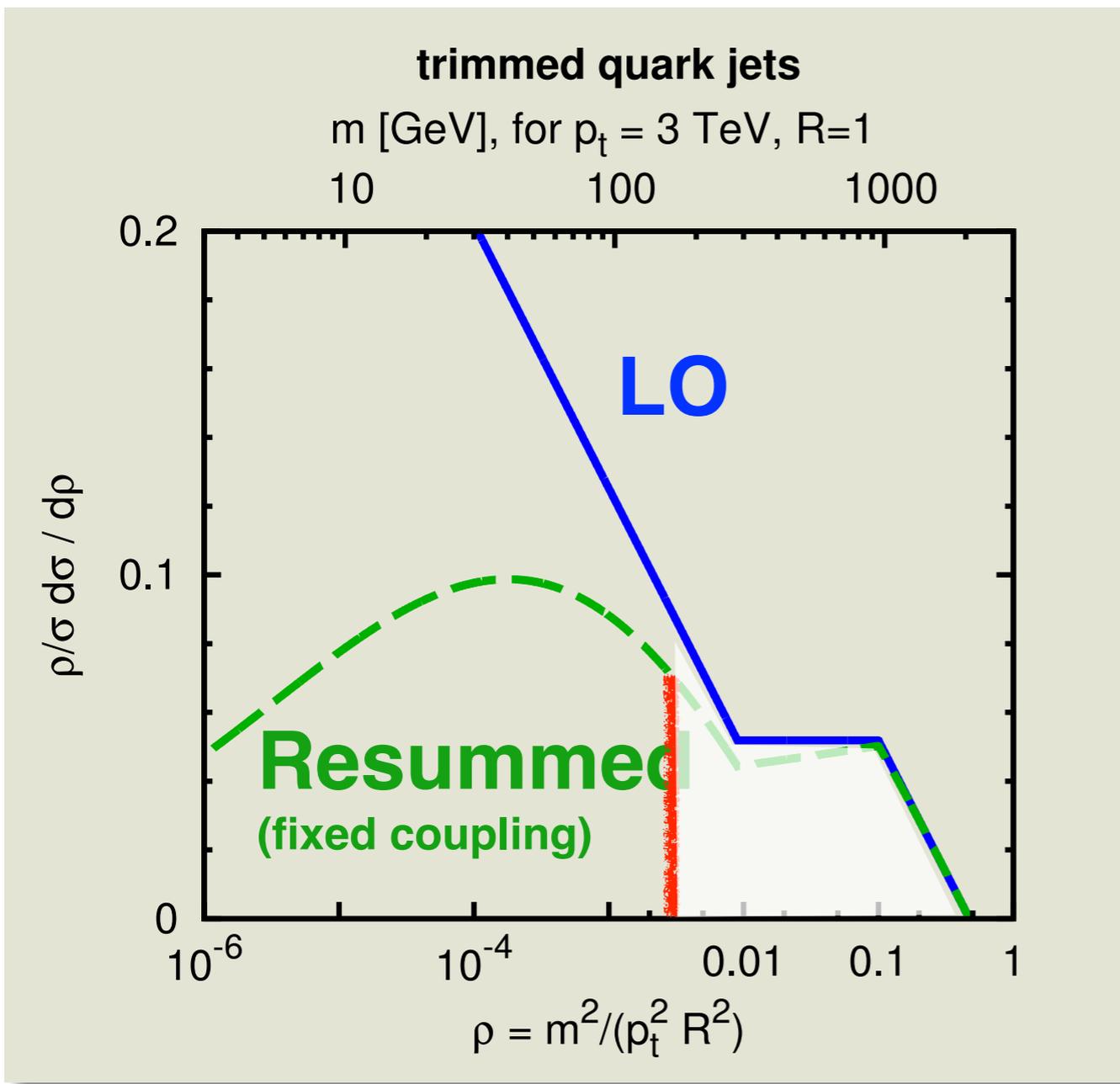


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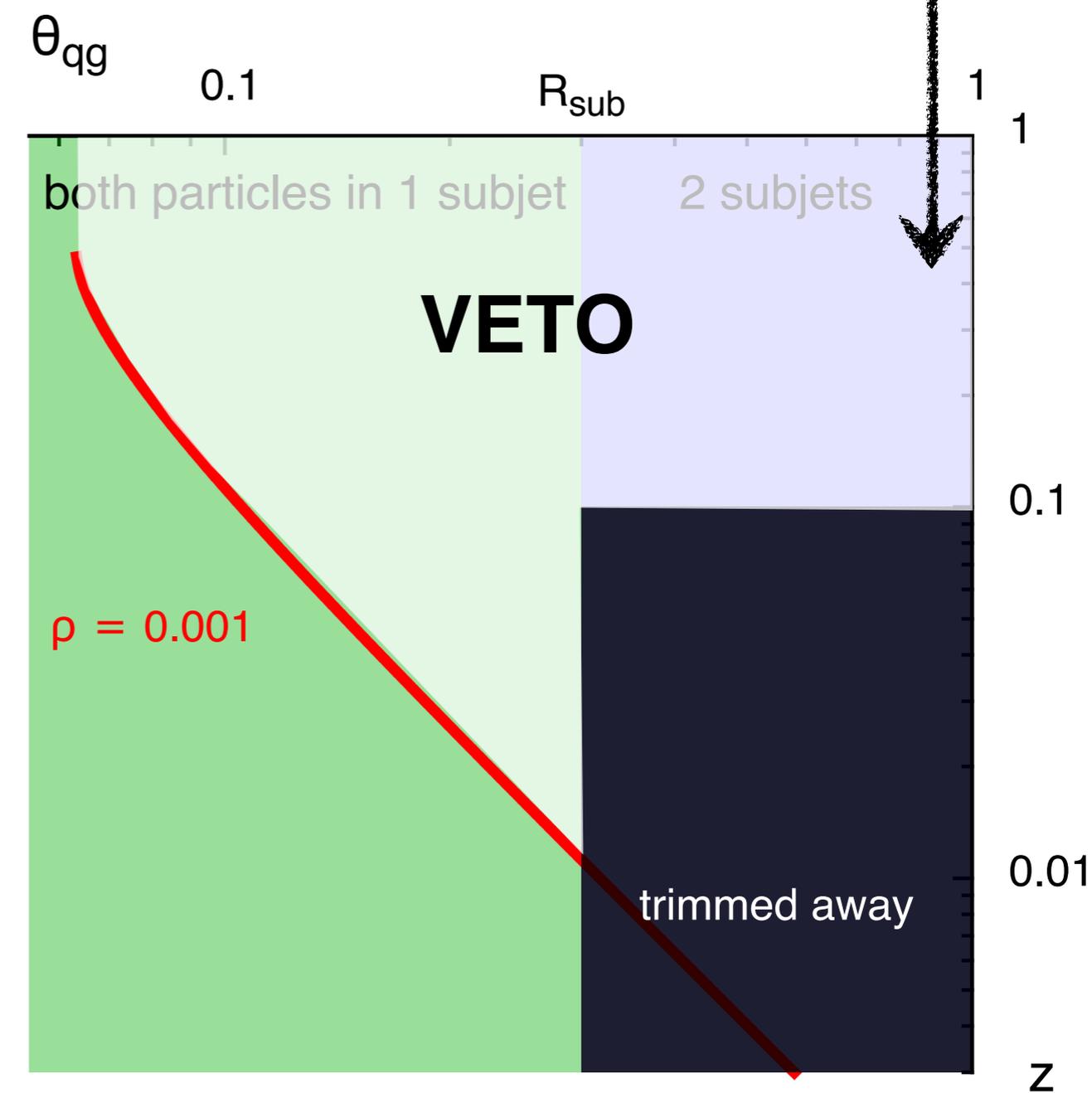
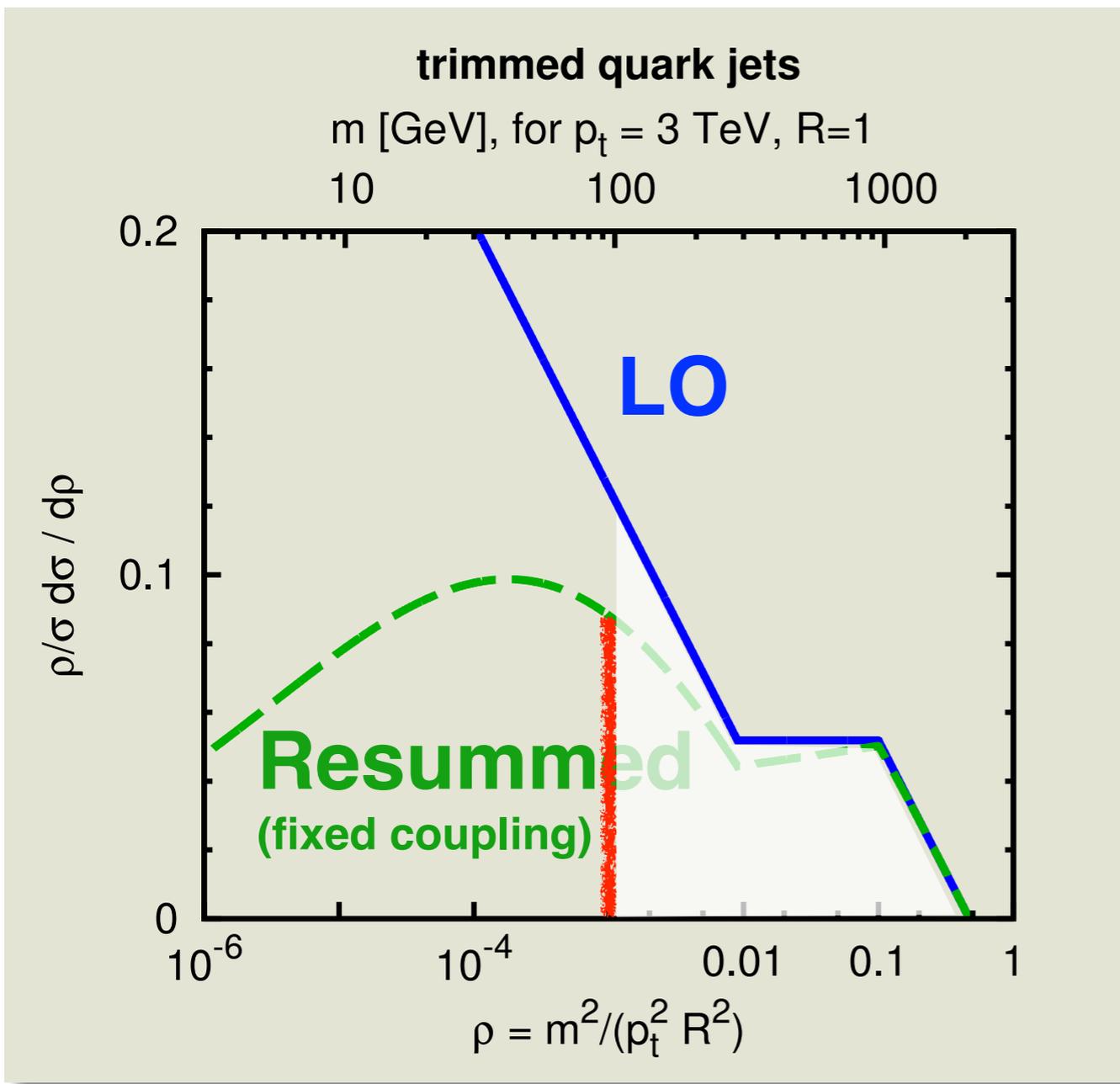


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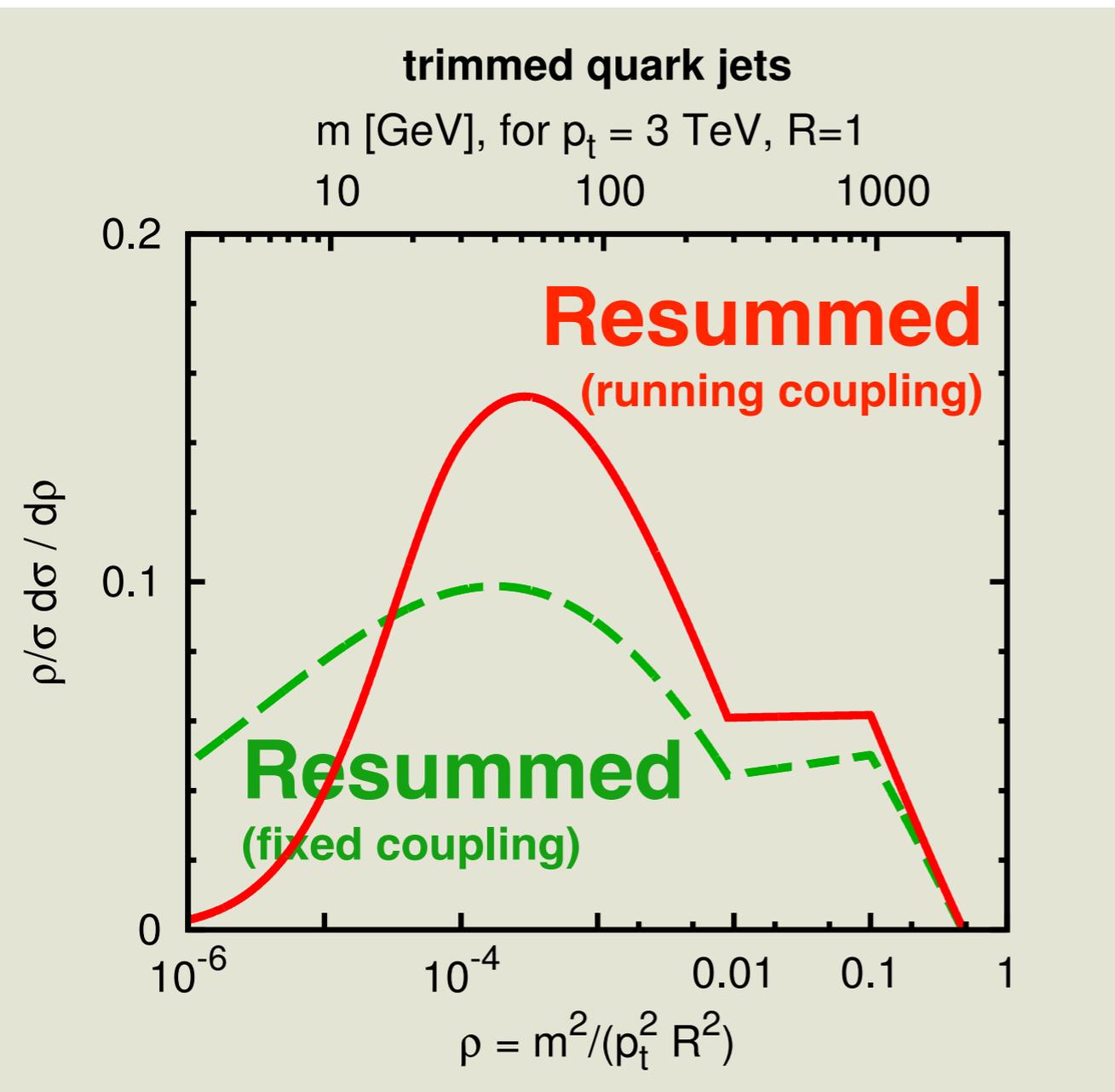
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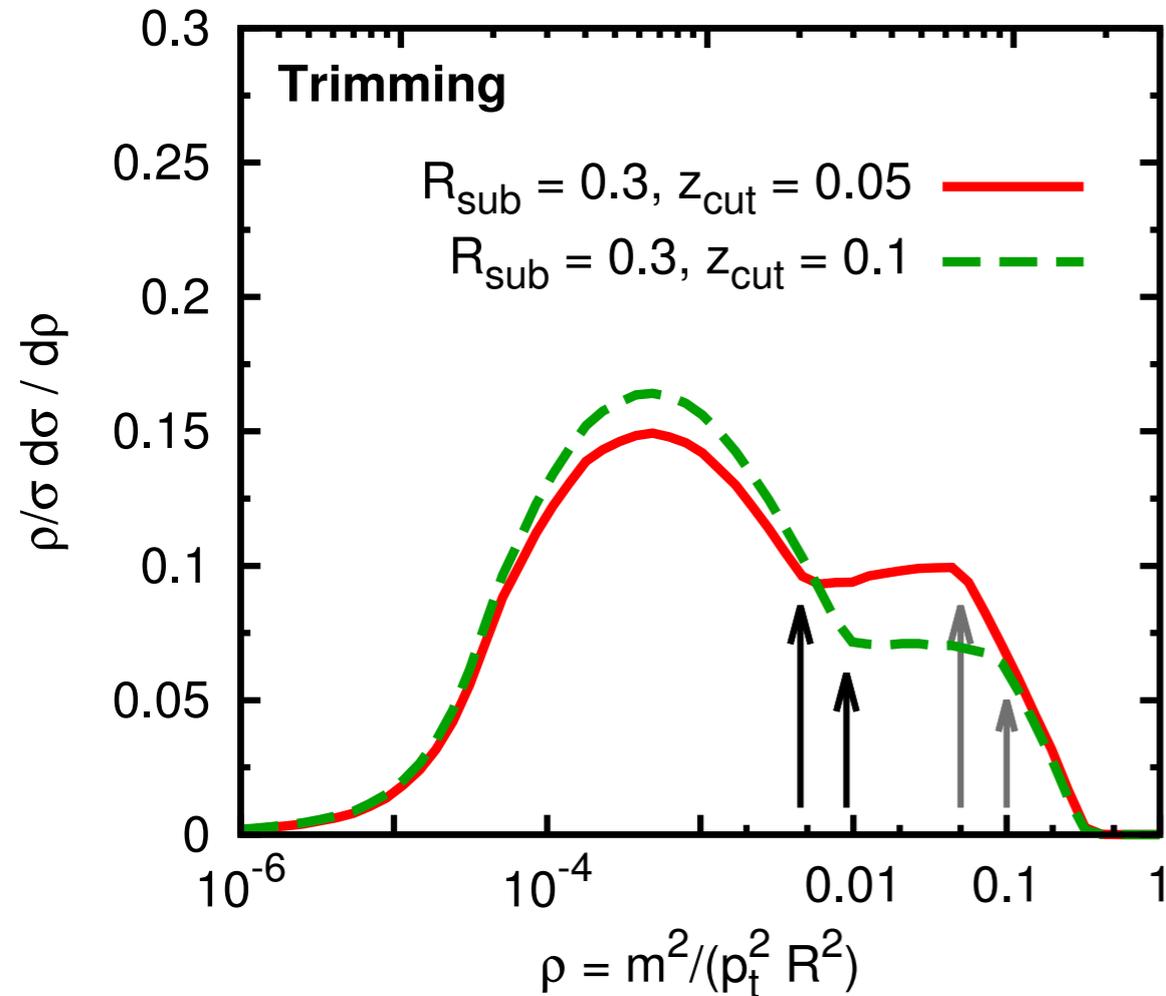
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Full resummation also
needs treatment of
running coupling

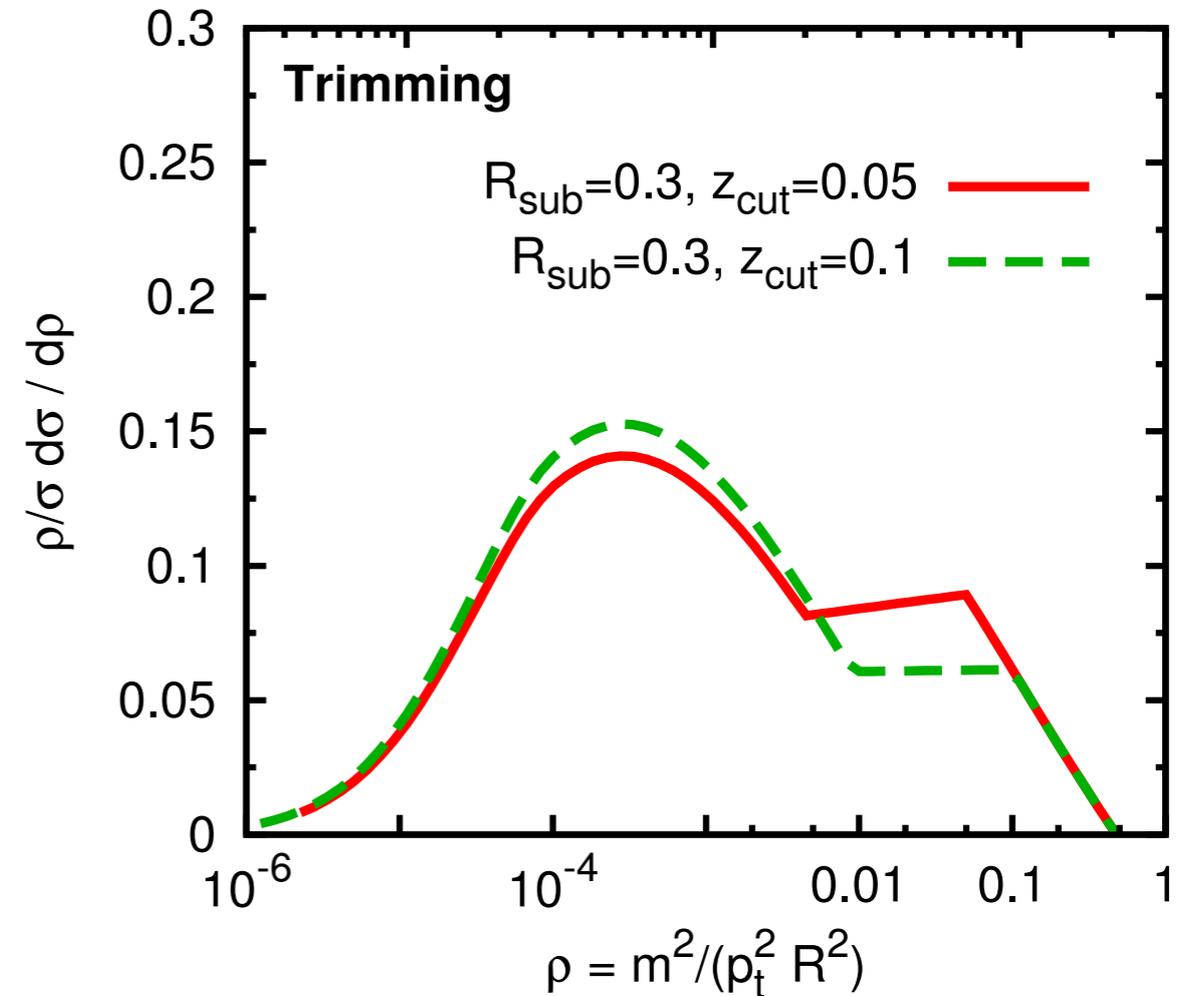
Monte Carlo

m [GeV], for $p_t = 3$ TeV, $R = 1$
 10 100 1000



Analytic

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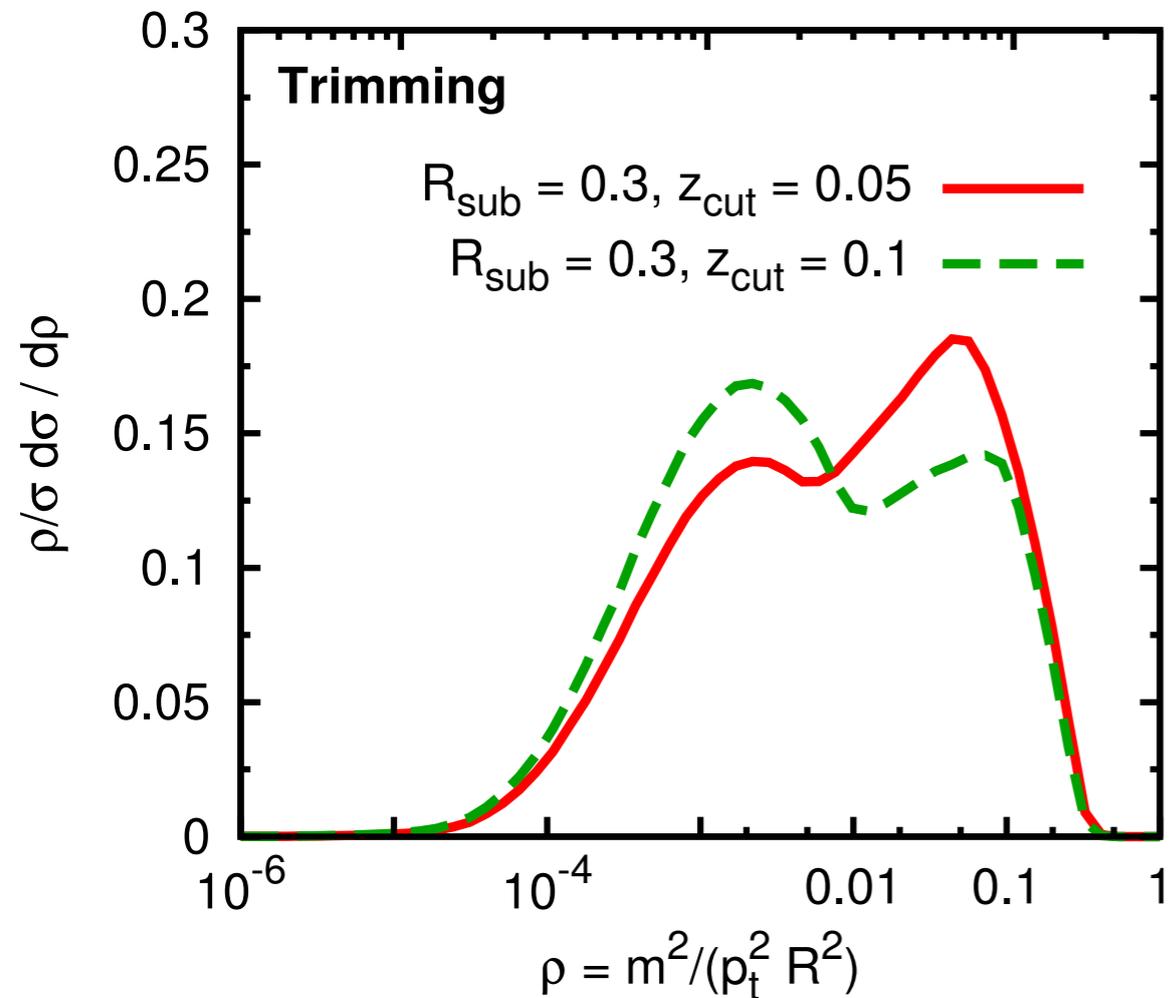


Non-trivial agreement!
 (also for dependence on parameters)

Monte Carlo

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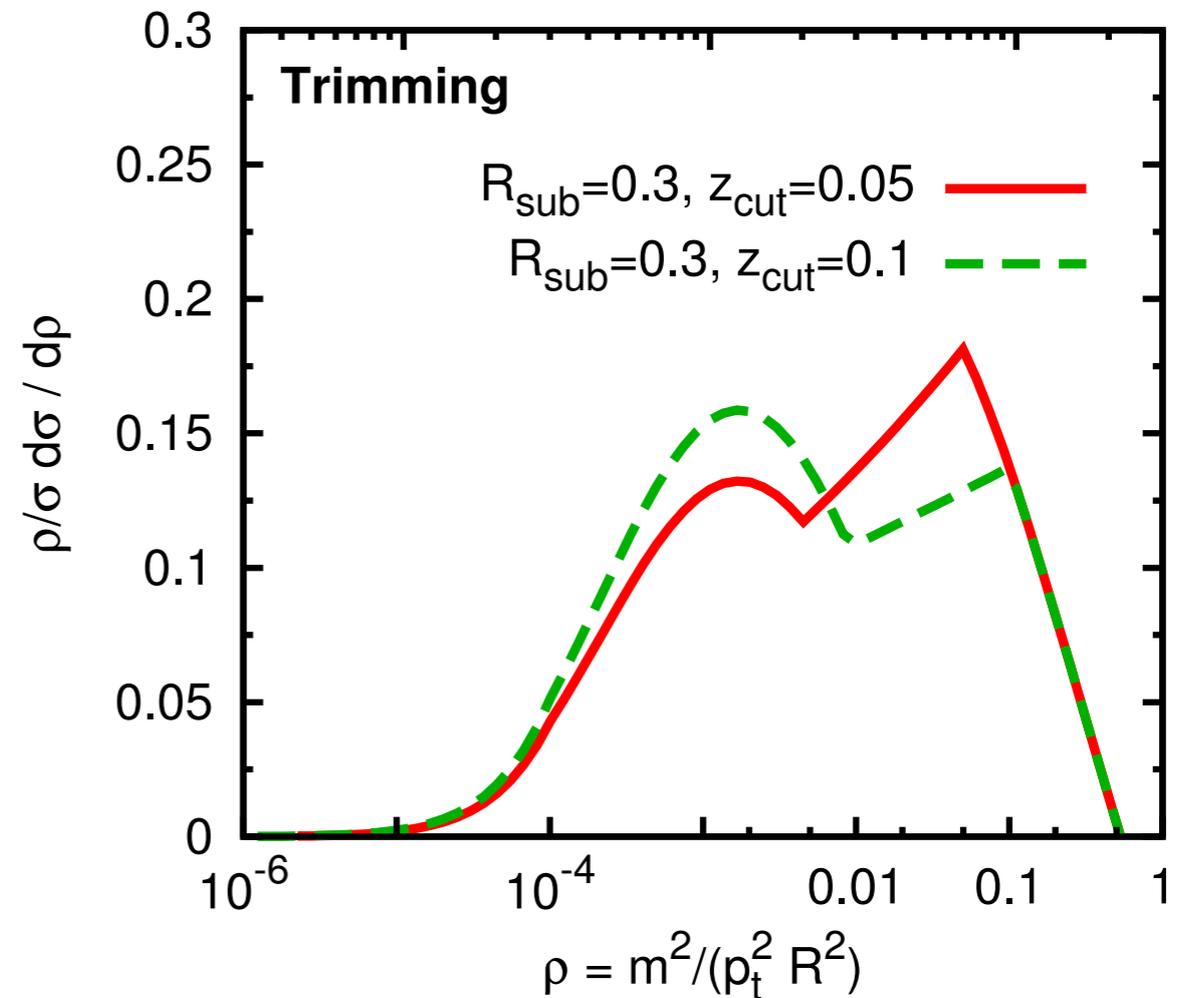
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Analytic

m [GeV], for $p_t = 3$ TeV, $R = 1$

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What logs, what accuracy?

Theorists state accuracy for the “cumulant” $\Sigma(\rho)$:

$$\Sigma(\rho) = \int_0^\rho d\rho' \frac{1}{\sigma} \frac{d\sigma}{d\rho'}$$

Use shorthand $L = \log 1/\rho$

Trimming’s **leading logs** (LL, in Σ) are:

$$\alpha_s L^2, \alpha_s^2 L^4, \dots \text{ I.e. } \alpha_s^n L^{2n}$$

Just like the
jet mass

We also have **next-to-leading logs** (NLL): $\alpha_s^n L^{2n-1}$

What logs, what accuracy?

Theorists state accuracy for the “cumulant” $\Sigma(\rho)$:

$$\Sigma(\rho) = \int_0^\rho d\rho' \frac{1}{\sigma} \frac{d\sigma}{d\rho'}$$

Use shorthand $L = \log 1/\rho$

Trimming’s **leading logs** (LL, in Σ) are:

$$\alpha_s L^2, \alpha_s^2 L^4, \dots \text{ I.e. } \alpha_s^n L^{2n}$$

Just like the jet mass

We also have **next-to-leading logs** (NLL): $\alpha_s^n L^{2n-1}$

Could we do better? Yes: NLL in $\ln \Sigma$:

$$\ln \Sigma: \alpha_s^n L^{n+1} \text{ and } \alpha_s^n L^n$$

Trimmed mass is like plain jet mass (with $R \rightarrow R_{\text{sub}}$), and this accuracy involves **non-global logs, clustering logs**

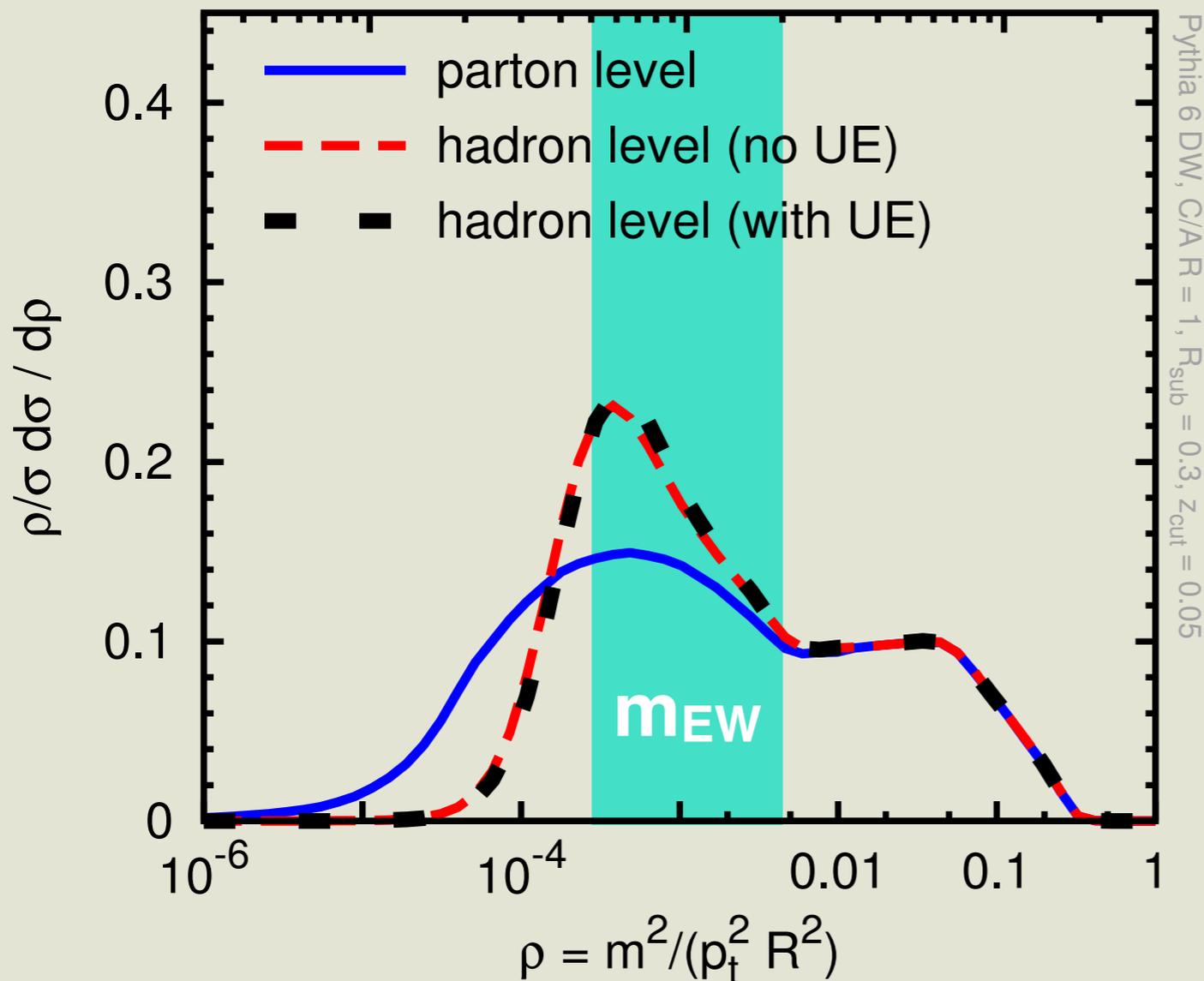
Everything so far was at parton level

Are partons sufficient?

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 3$ TeV, $R=1$

10 100 1000



hadronisation adds roughly

$$\Delta m^2 \sim \mu_{\text{NP}} p_t^{\text{jet}} R_{\text{sub}} \sim (30 \text{ GeV})^2$$

to the trimmed-jet squared mass

non-perturbative QCD important for EW-scale phenomenology...

It's even worse for plain jet mass but better for other taggers...

Past years → a **vast trove of ideas** for jet substructure tagging.

But maybe it's **time to** try to **go back to “basics”**

→ detailed understanding about how our methods work.

Trimming was a particularly illustrative case:

- has non-trivial structure, relevant for phenomenology
- can mostly be understood from LO calculation & standard resummation techniques — quite similar to jet mass
- non-perturbative effects are relevant

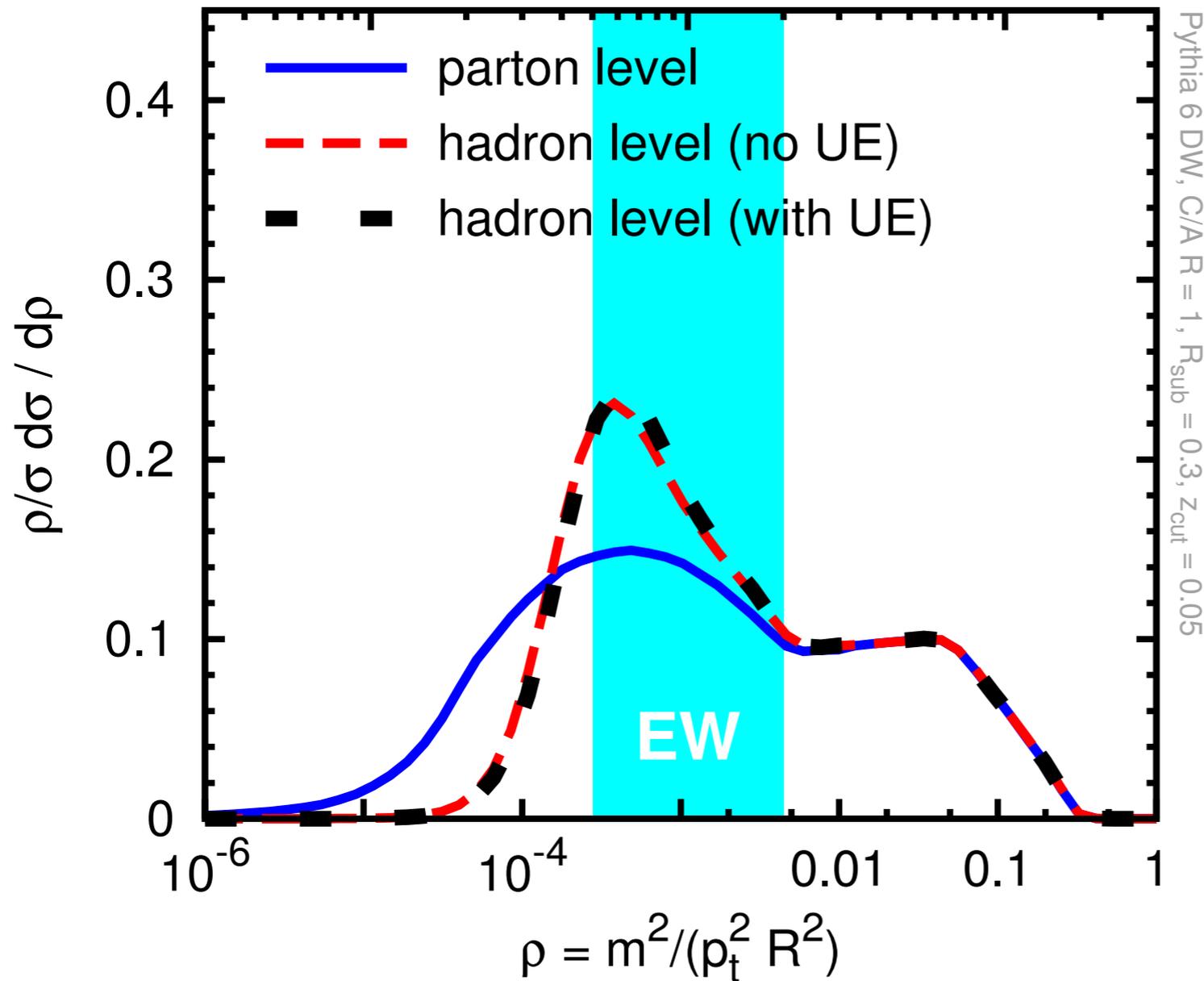
Now over to Simone, who will discuss **pruning** and **MDT**

EXTRAS

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 3.0$ TeV, $R = 1$

10 100 1000

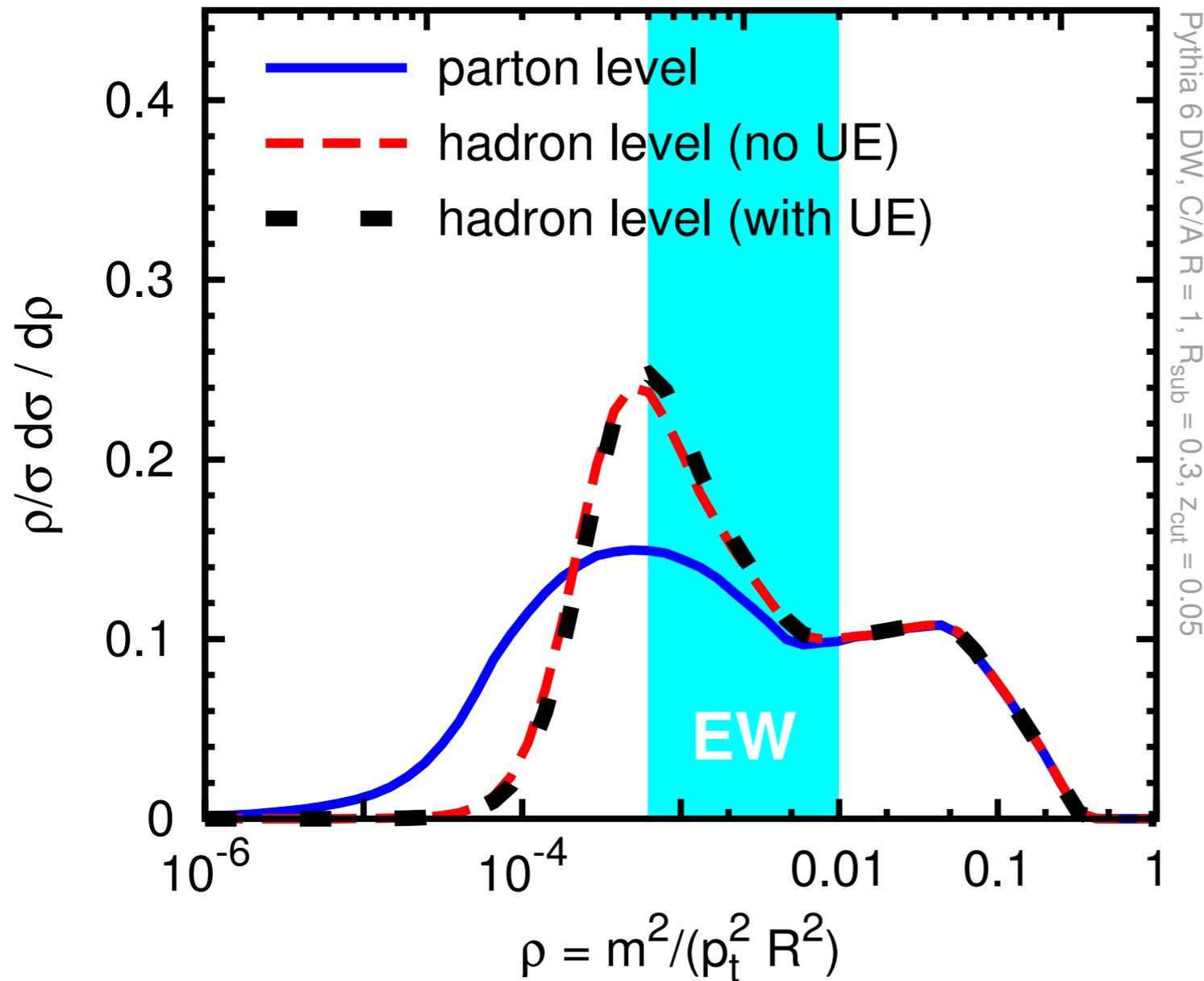


3000 GeV

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 2.0$ TeV, $R = 1$

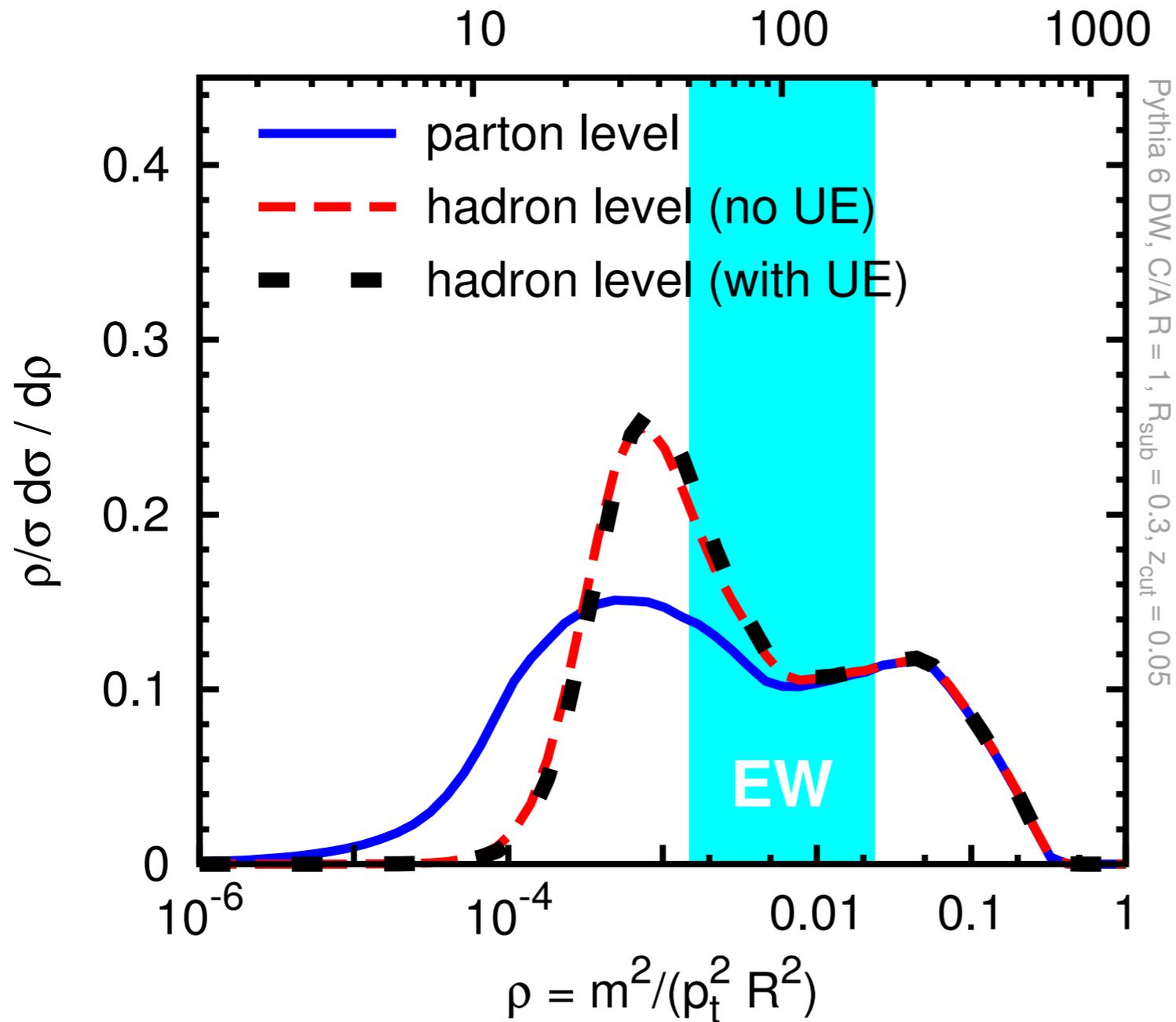
10 100 1000



2000 GeV

trimming: hadronisation (quark jets)

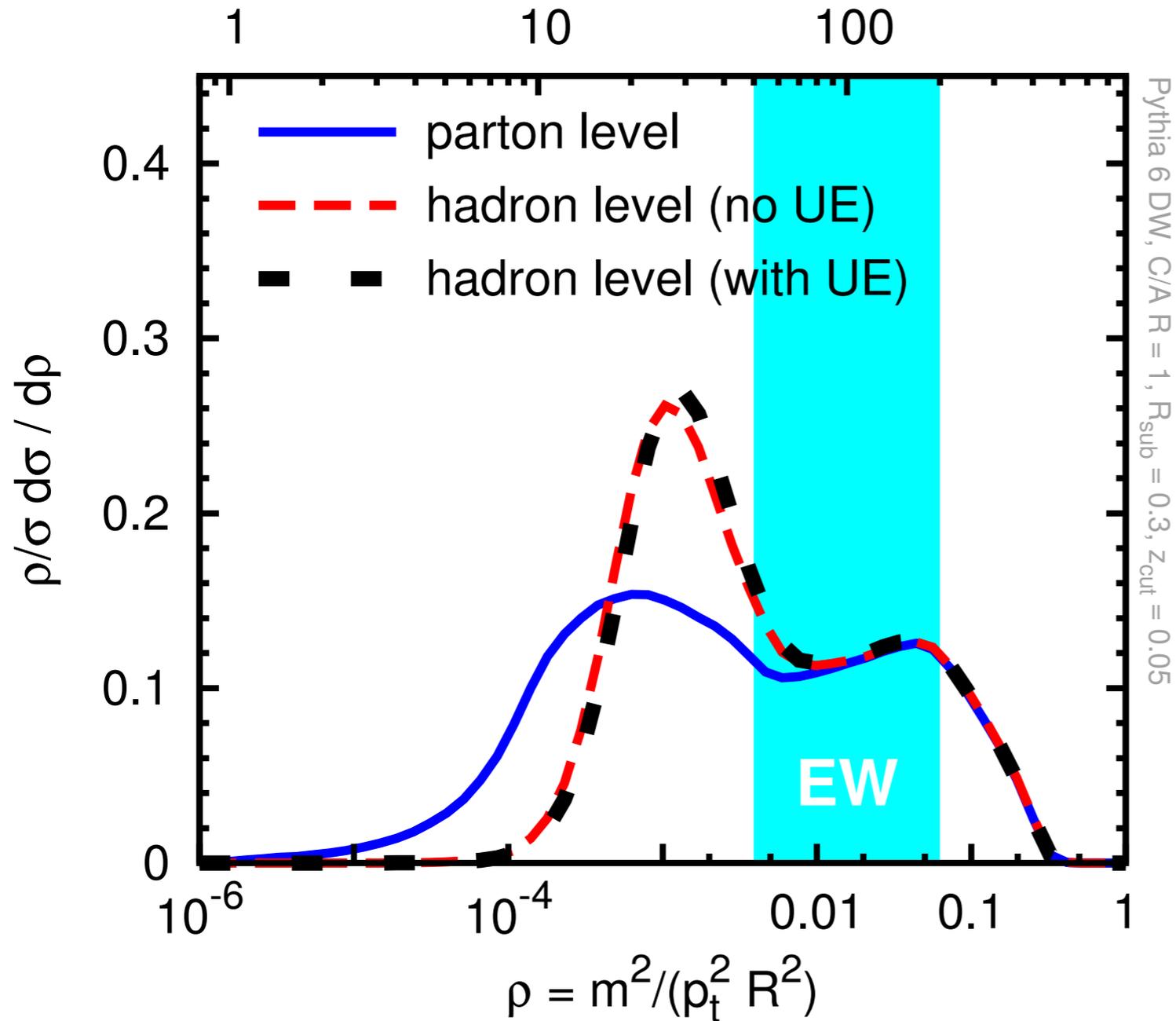
m [GeV], for $p_t = 1.3$ TeV, $R = 1$



1300 GeV

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 0.8$ TeV, $R = 1$

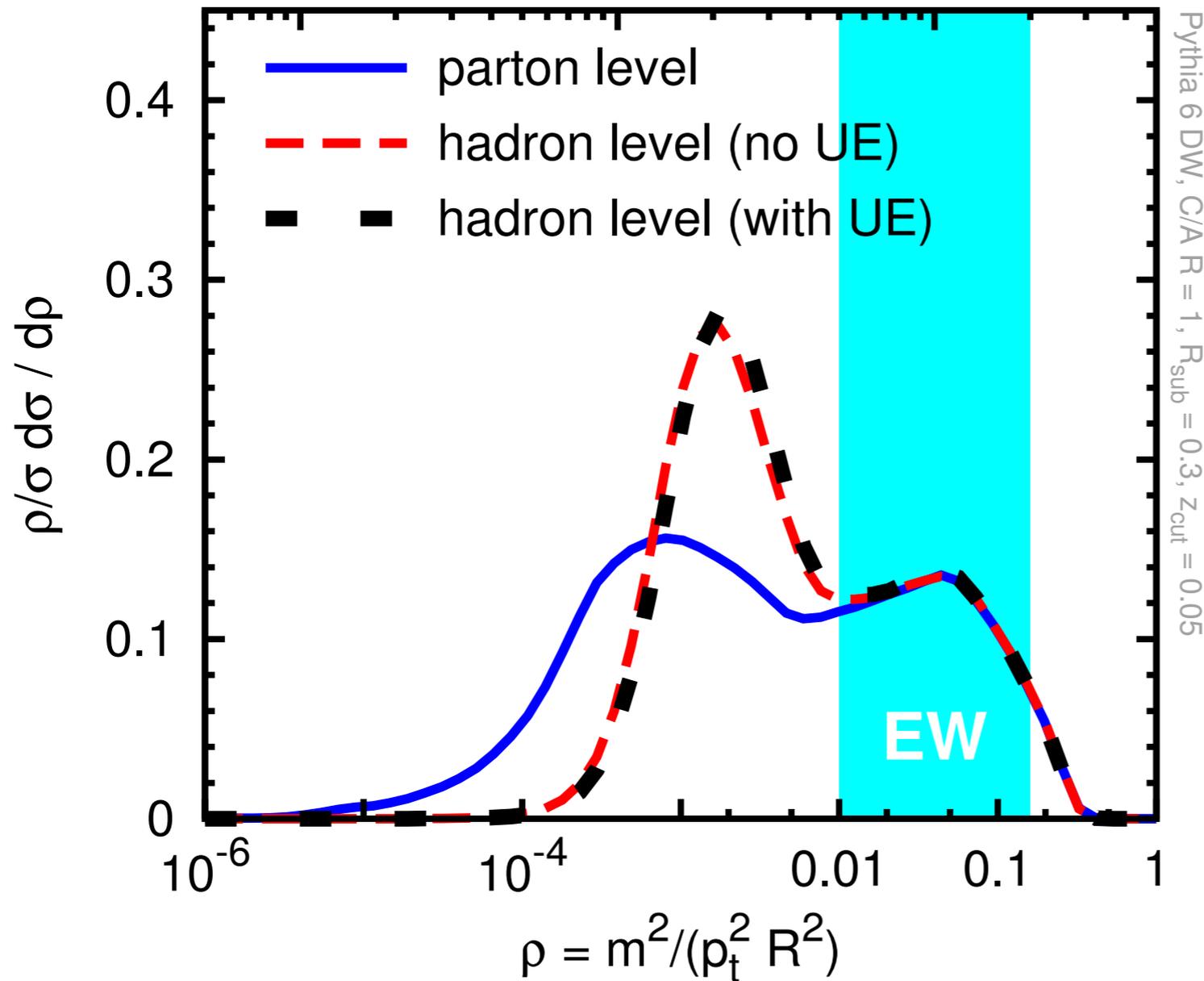


800 GeV

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 0.5$ TeV, $R = 1$

1 10 100

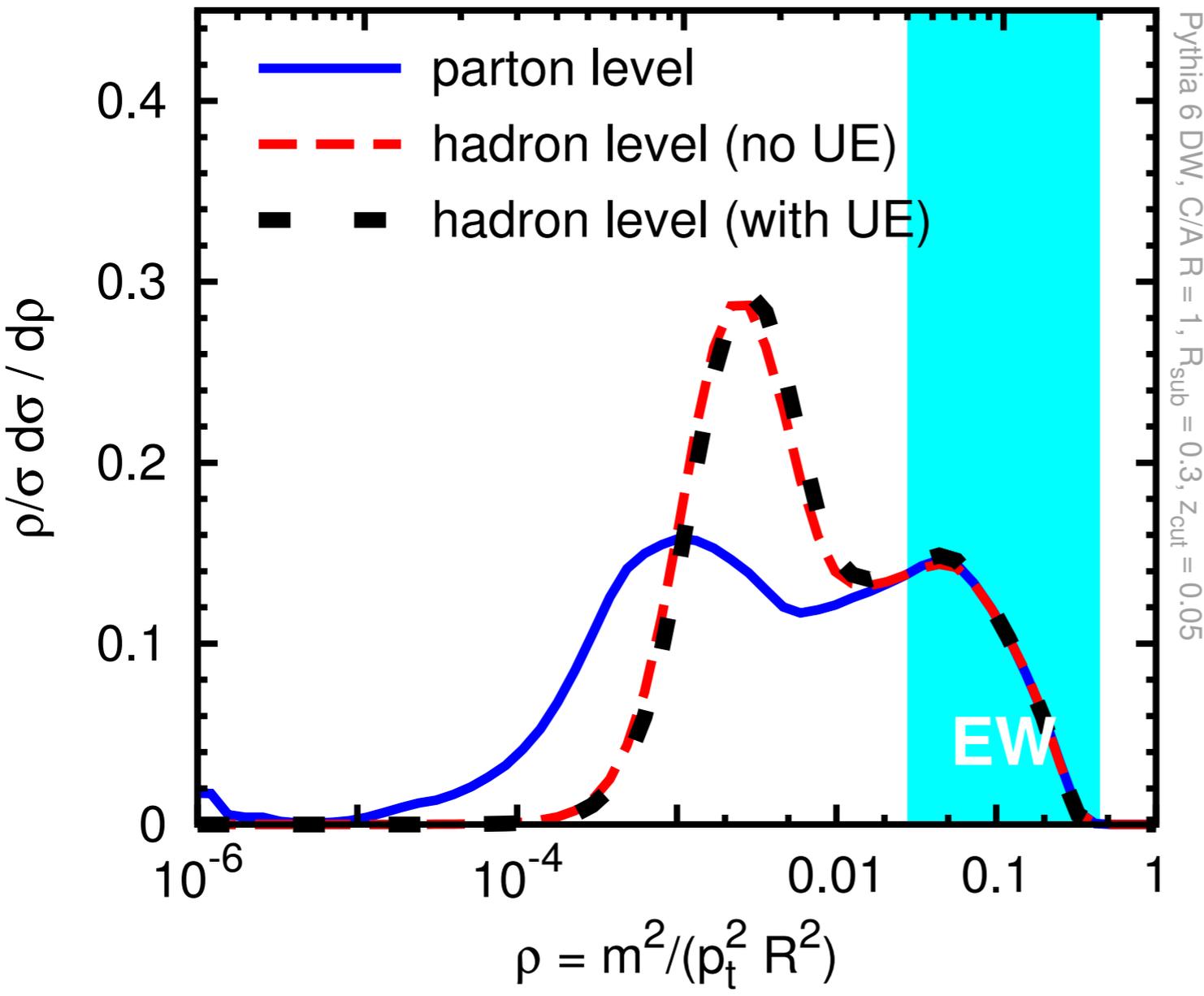


500 GeV

trimming: hadronisation (quark jets)

m [GeV], for $p_t = 0.3$ TeV, $R = 1$

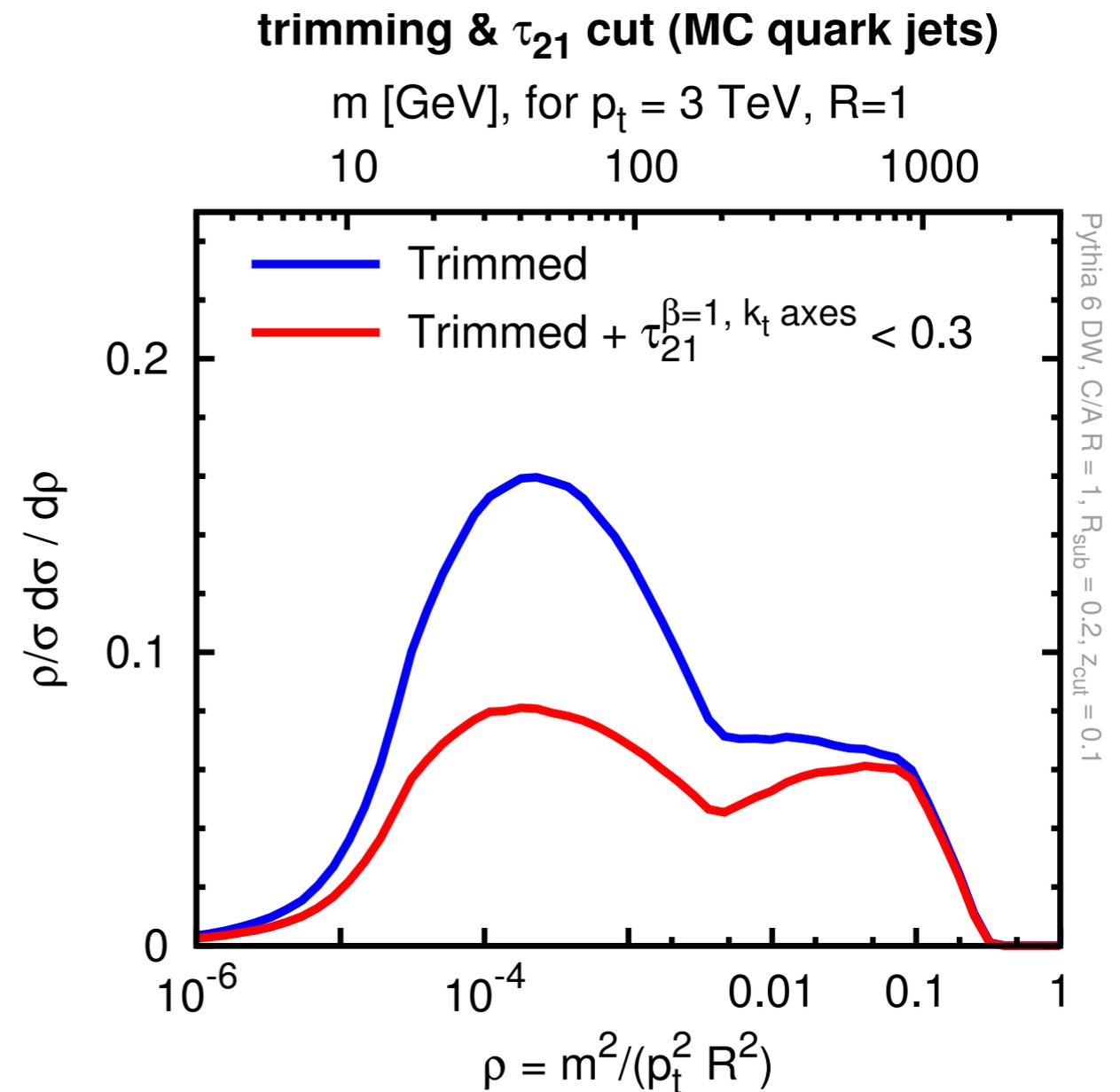
1 10 100



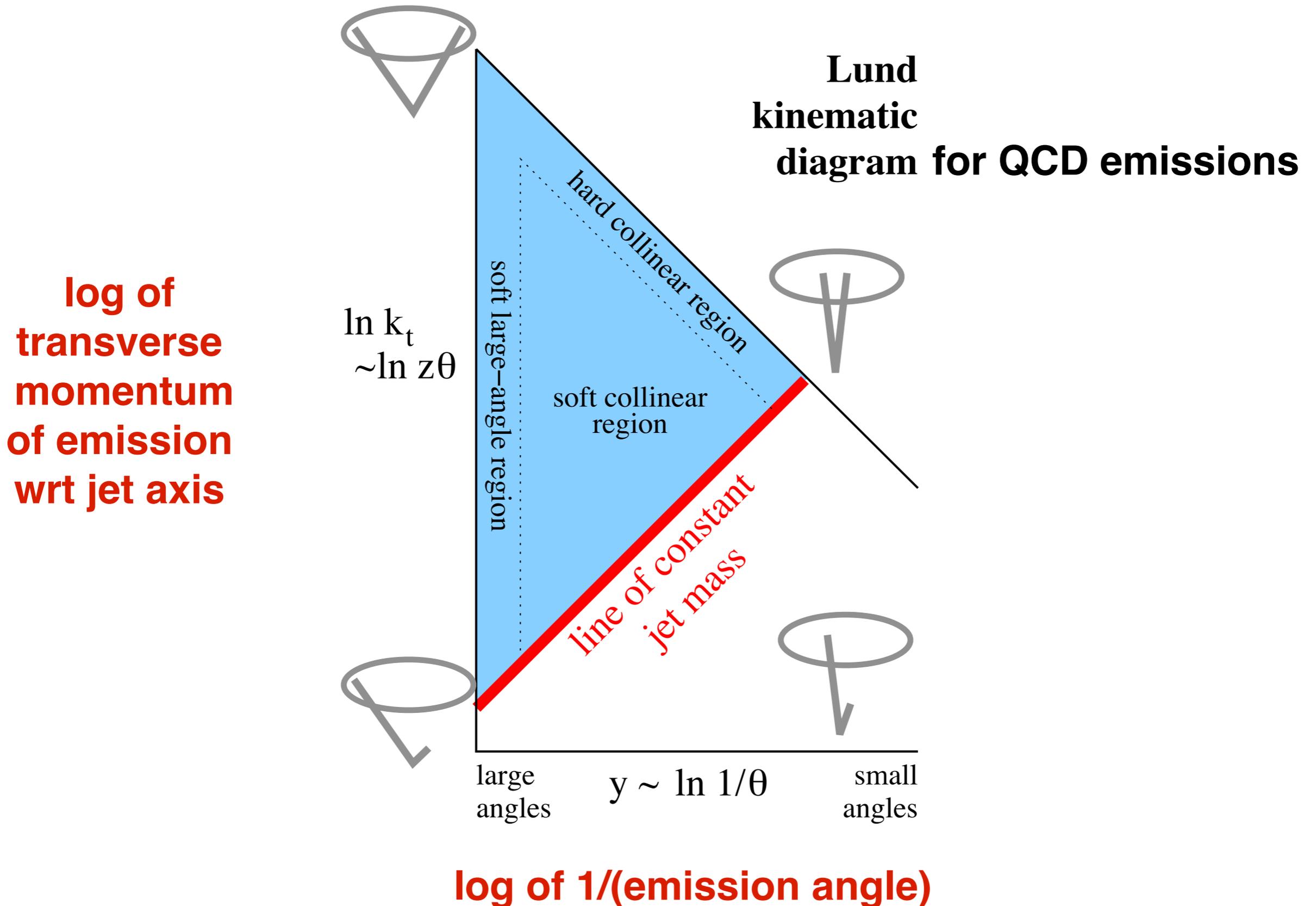
300 GeV

cuts on N-subjettiness, etc.?

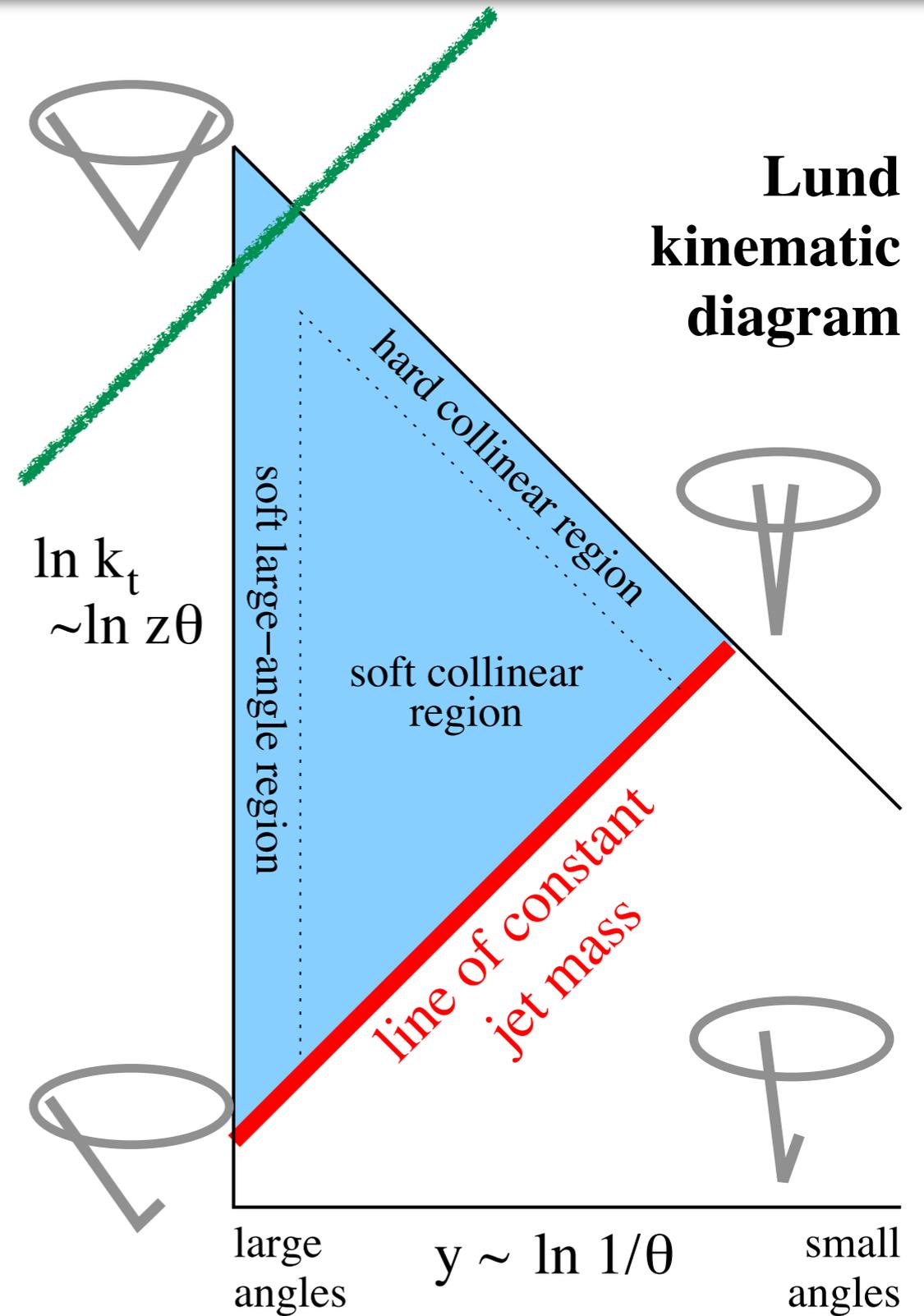
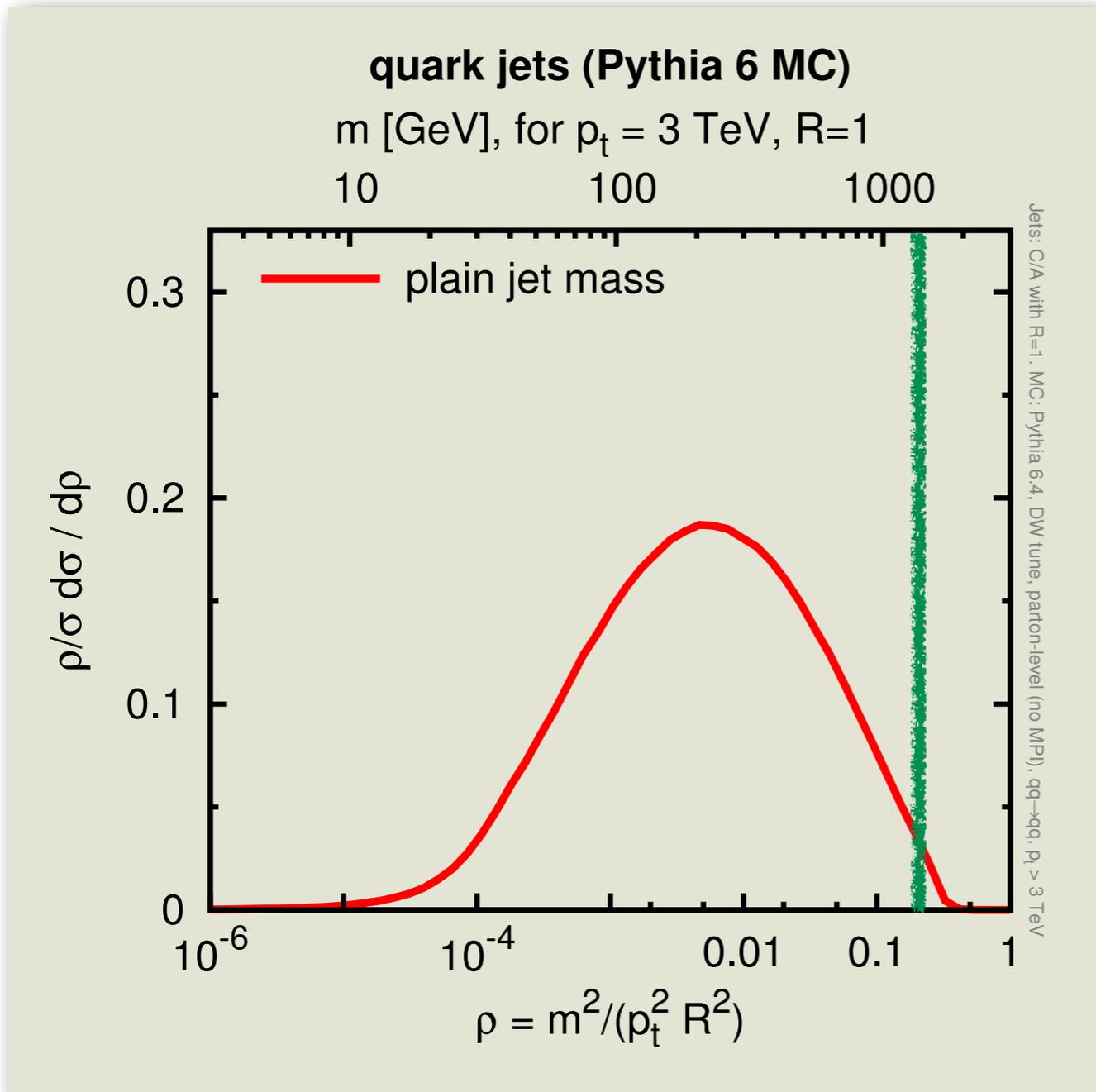
- These cuts are nearly always for a jet whose mass is somehow groomed. All the structure from the grooming persists.
- So tagging & shape must probably be calculated together



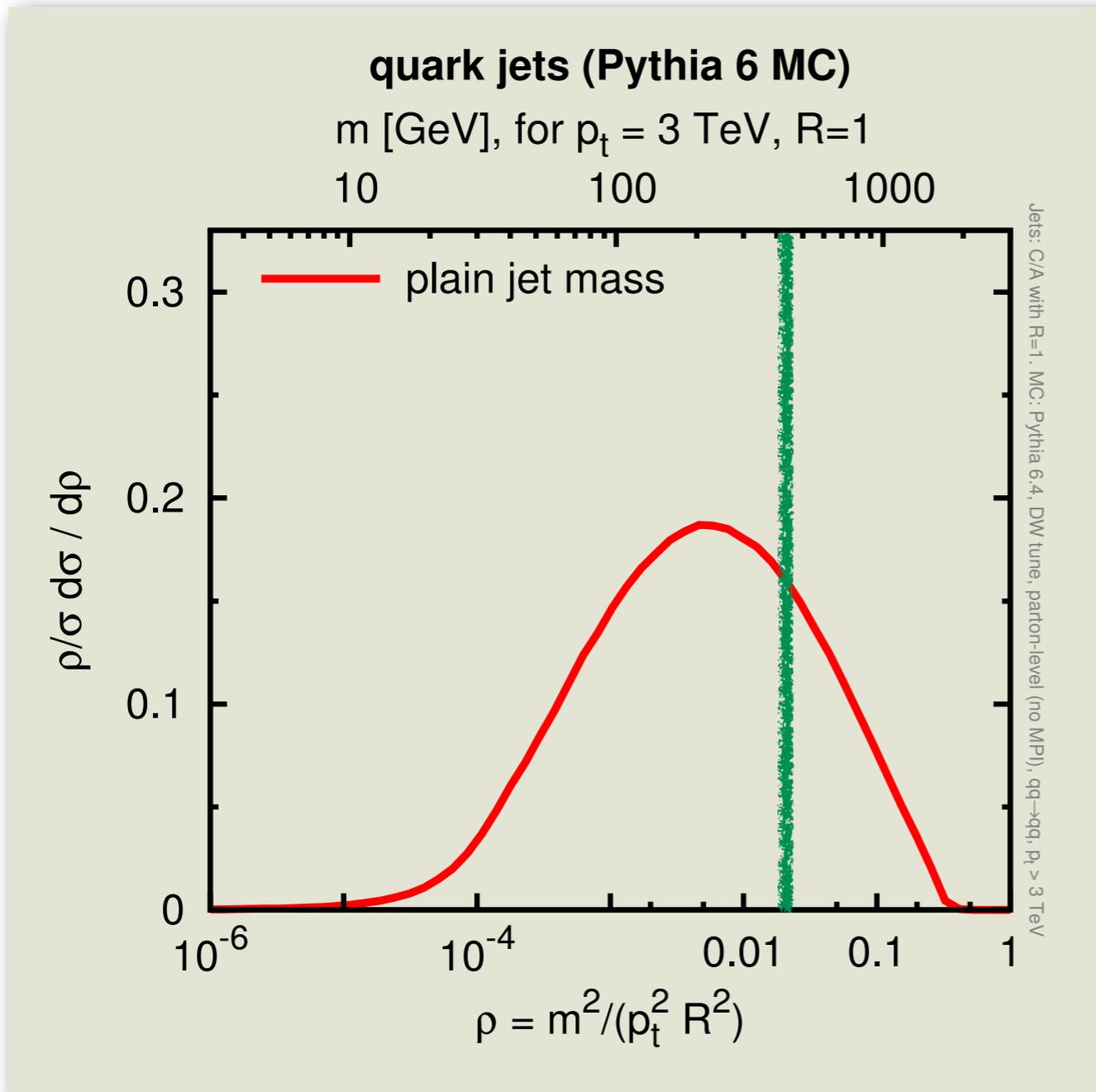
kinematic plane and jet masses



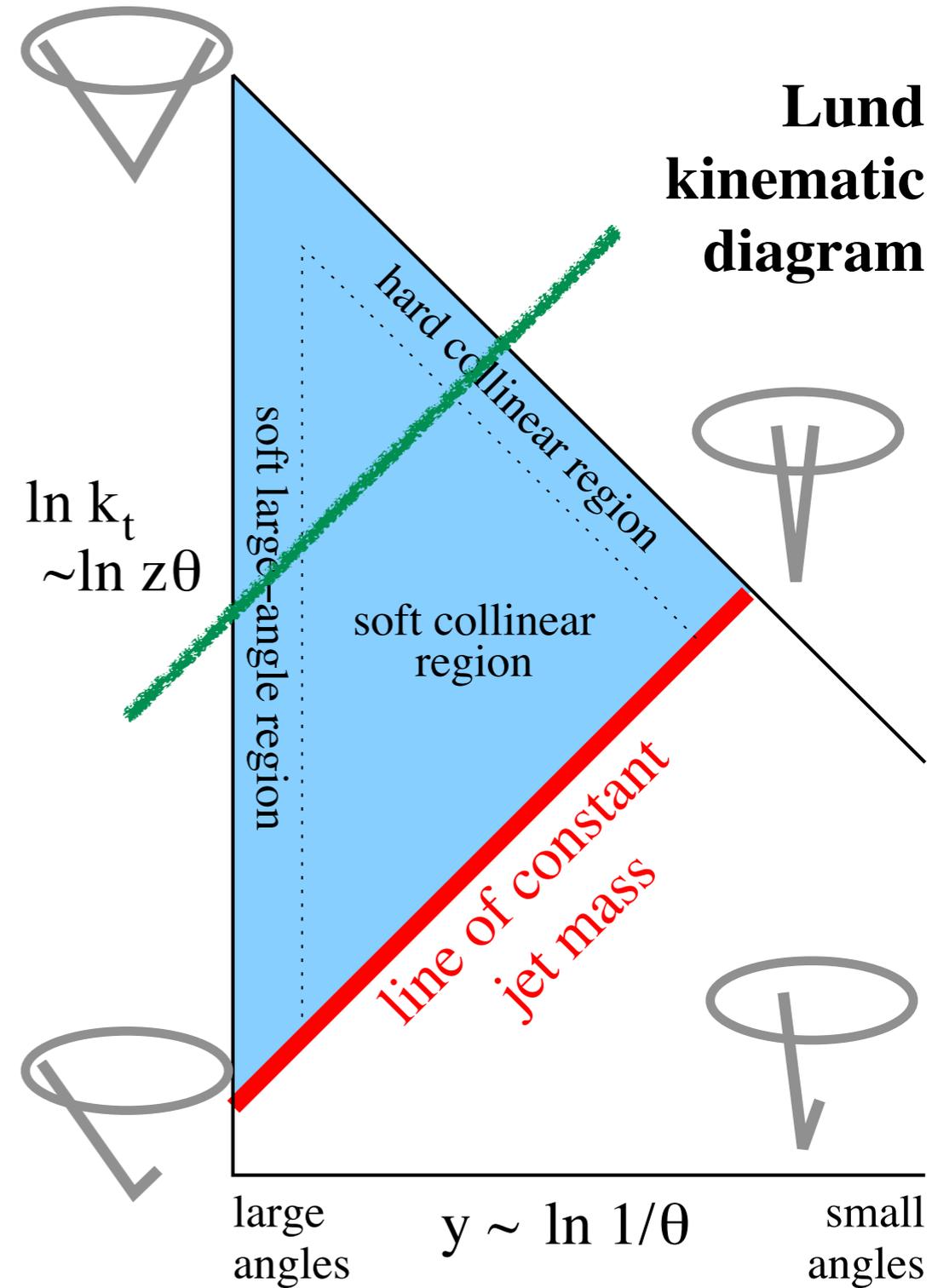
kinematic plane and jet masses



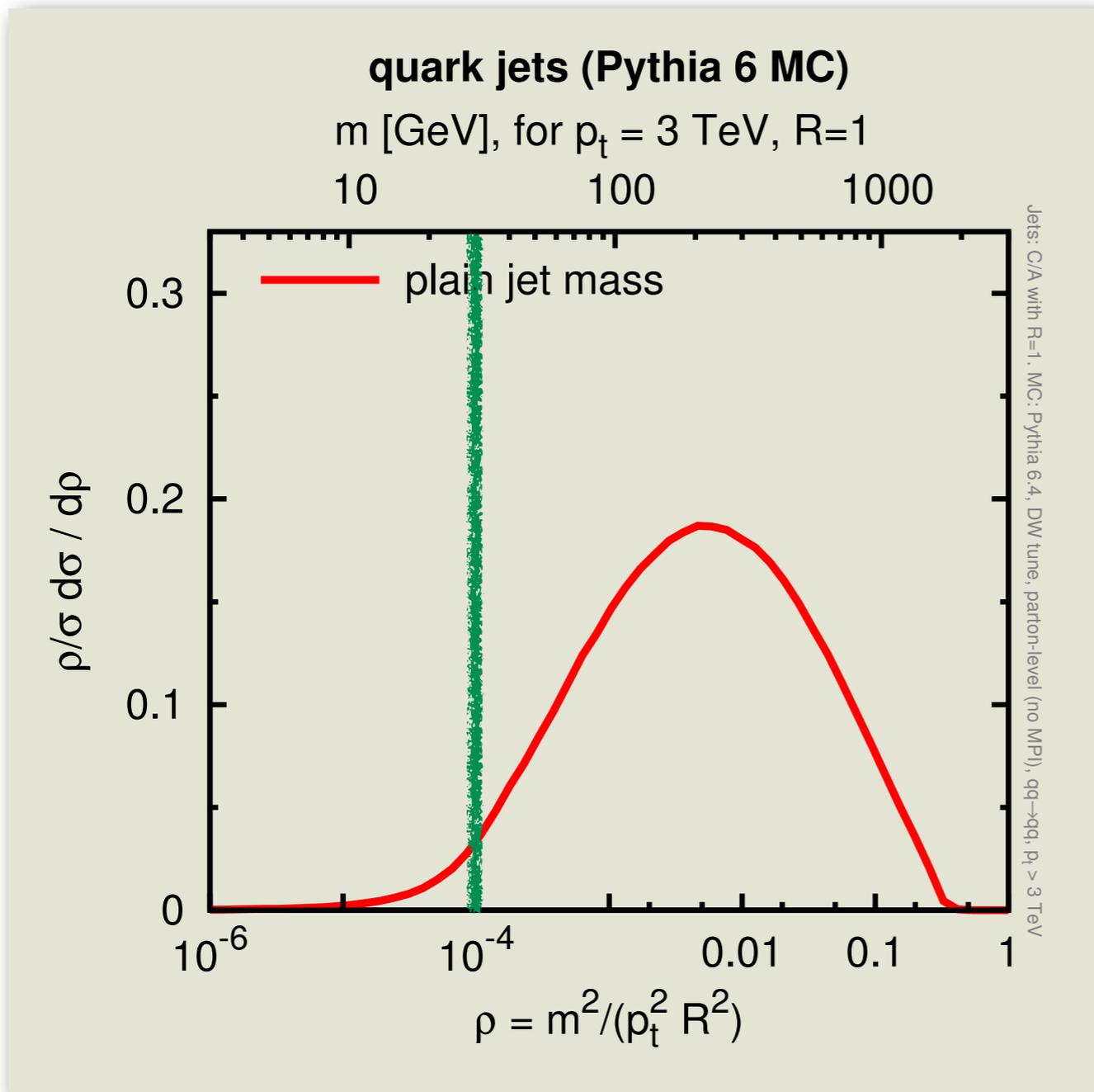
kinematic plane and jet masses



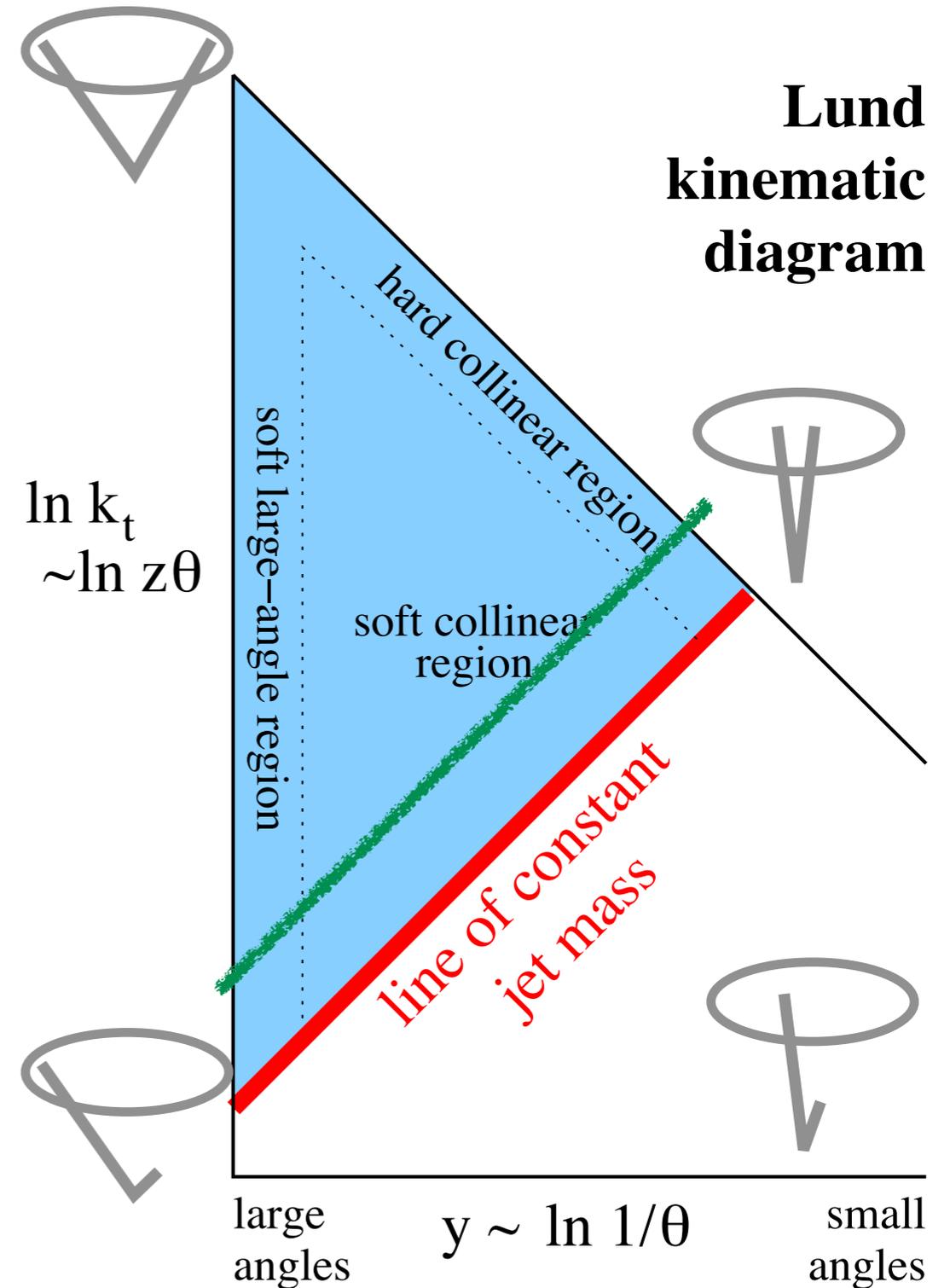
← increase in
 phasespace



kinematic plane and jet masses



← **Sudakov suppression** ← **increase in phase space**



Some key calculations related to jet mass

- Catani, Turnock, Trentadue & Webber, '91: **heavy-jet mass in e^+e^-**
- Dasgupta & GPS, '01: **hemisphere jet mass in e^+e^-** (and DIS)
- Appleby & Seymour, '02
Delenda, Appleby, Dasgupta & Banfi '06: **impact of jet boundary**
- Gehrmann, Gehrmann de Ridder, Glover '08; Weinzierl '08
Chien & Schwartz '10: **heavy-jet mass in e^+e^- to higher accuracy**
- Dasgupta, Khelifa-Kerfa, Marzani & Spannowsky '12,
Chien & Schwartz '12,
Jouttenus, Stewart, Tackmann, Waalewijn '13:
jet masses at hadron colliders

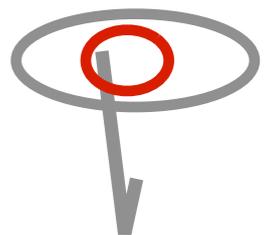
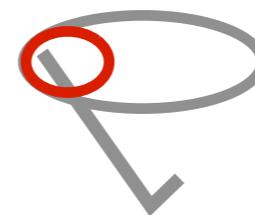
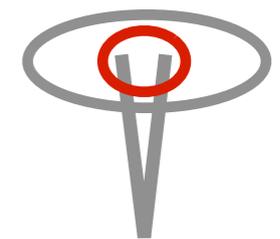
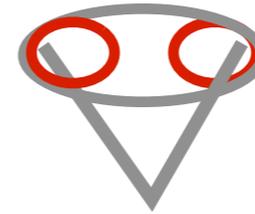
Take all particles in a jet of radius R and recluster them into **subjects** with a jet definition with radius

$$R_{\text{sub}} < R$$

The subjects that satisfy the condition

$$p_t^{(\text{subject})} > z_{\text{cut}} p_t^{(\text{jet})}$$

are kept and merged to form the trimmed jet.



Krohn, Thaler & Wang '09

Take all particles in a jet of radius R and recluster them into **subjects** with a jet definition with radius

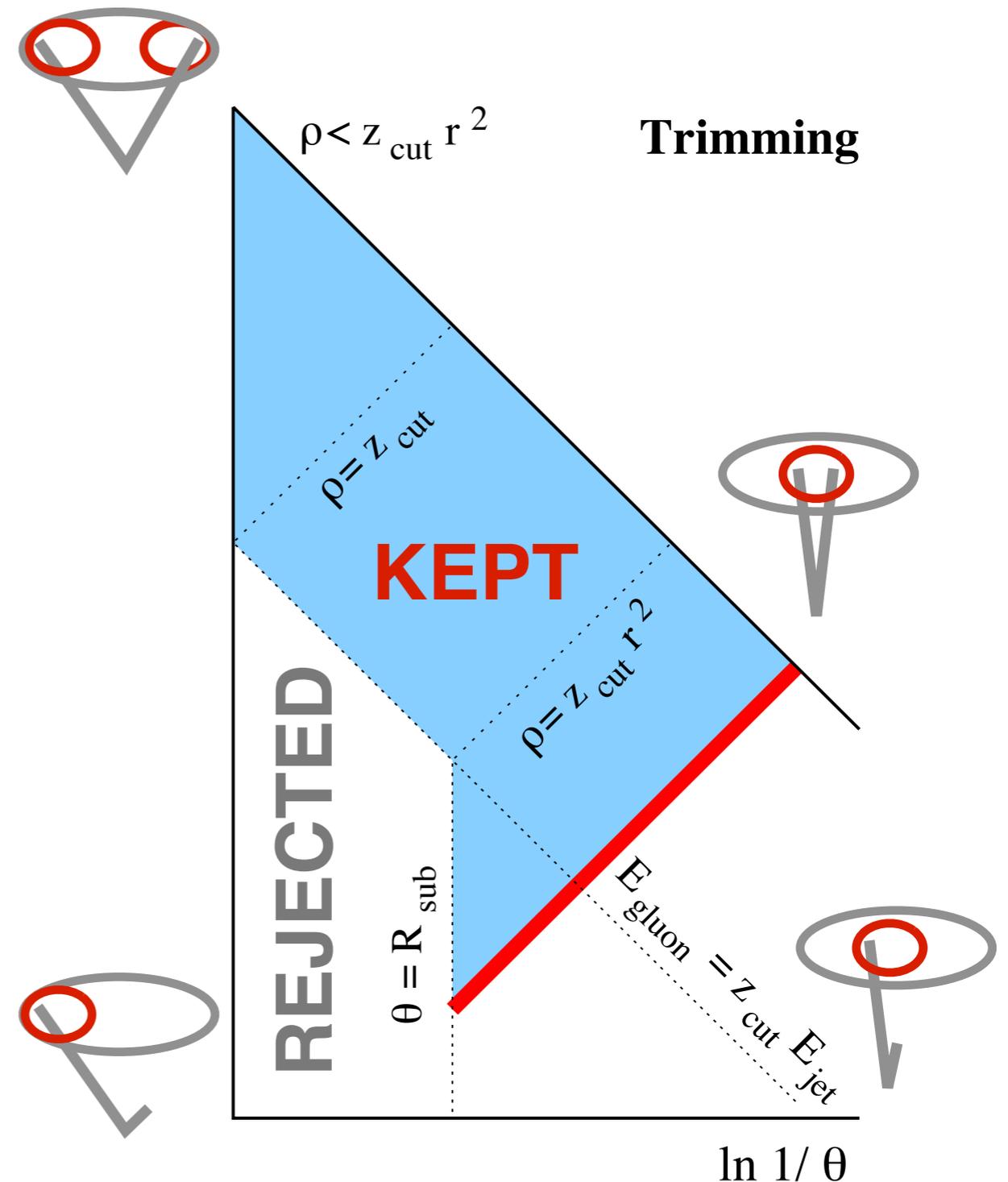
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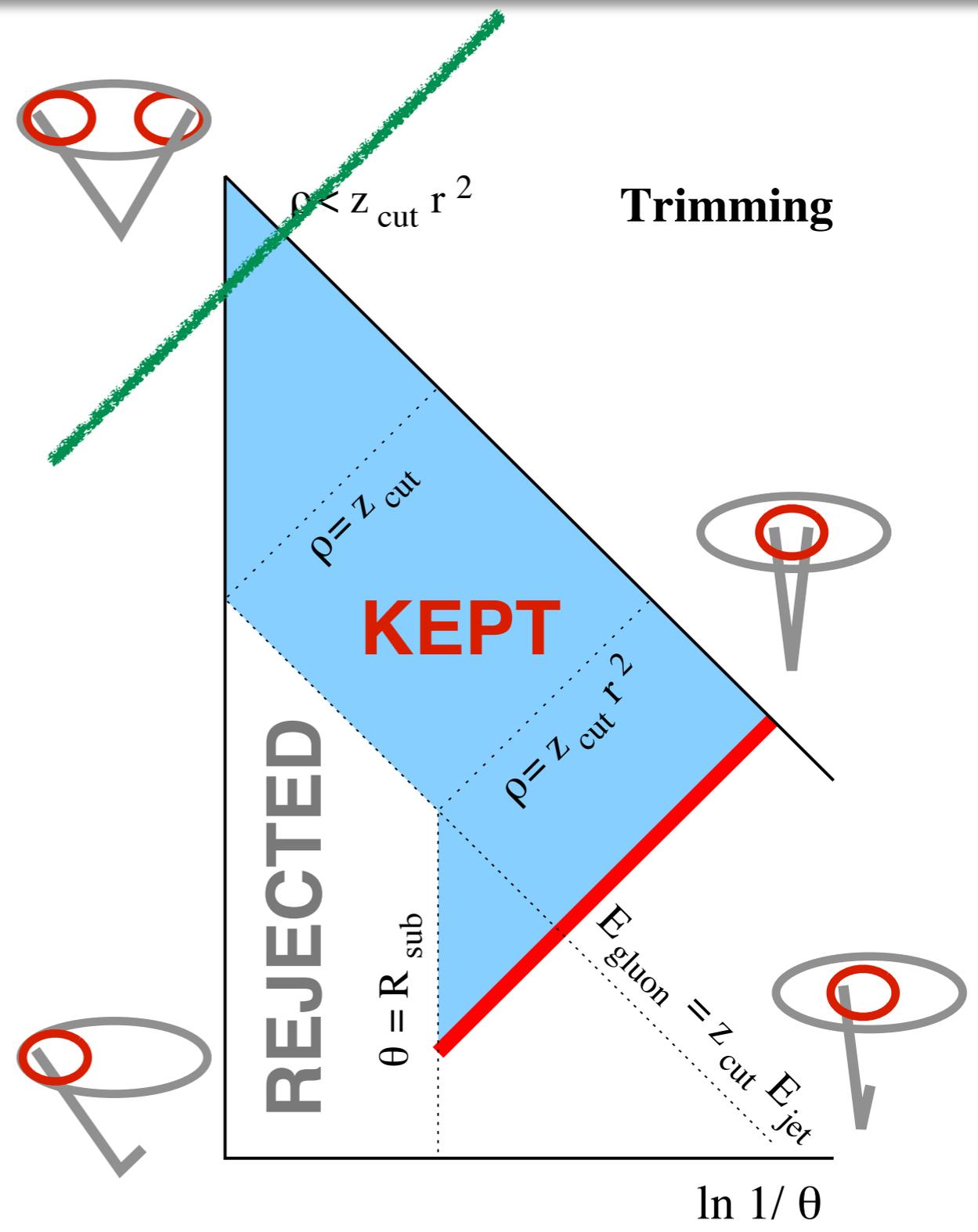
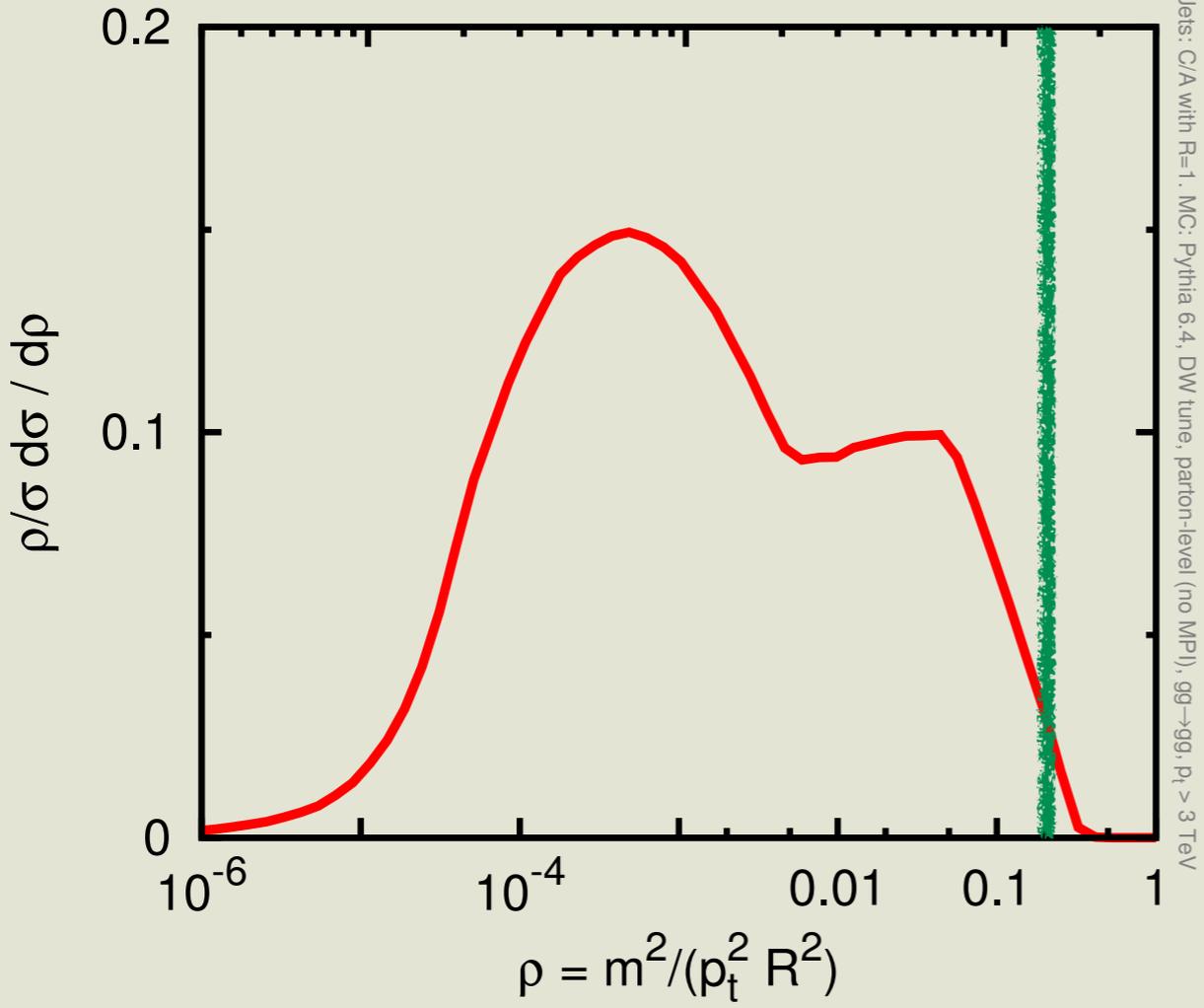
Krohn, Thaler & Wang '09



trimmed quark jets (Pythia 6 MC)

m [GeV], for $p_t = 3$ TeV, $R=1$

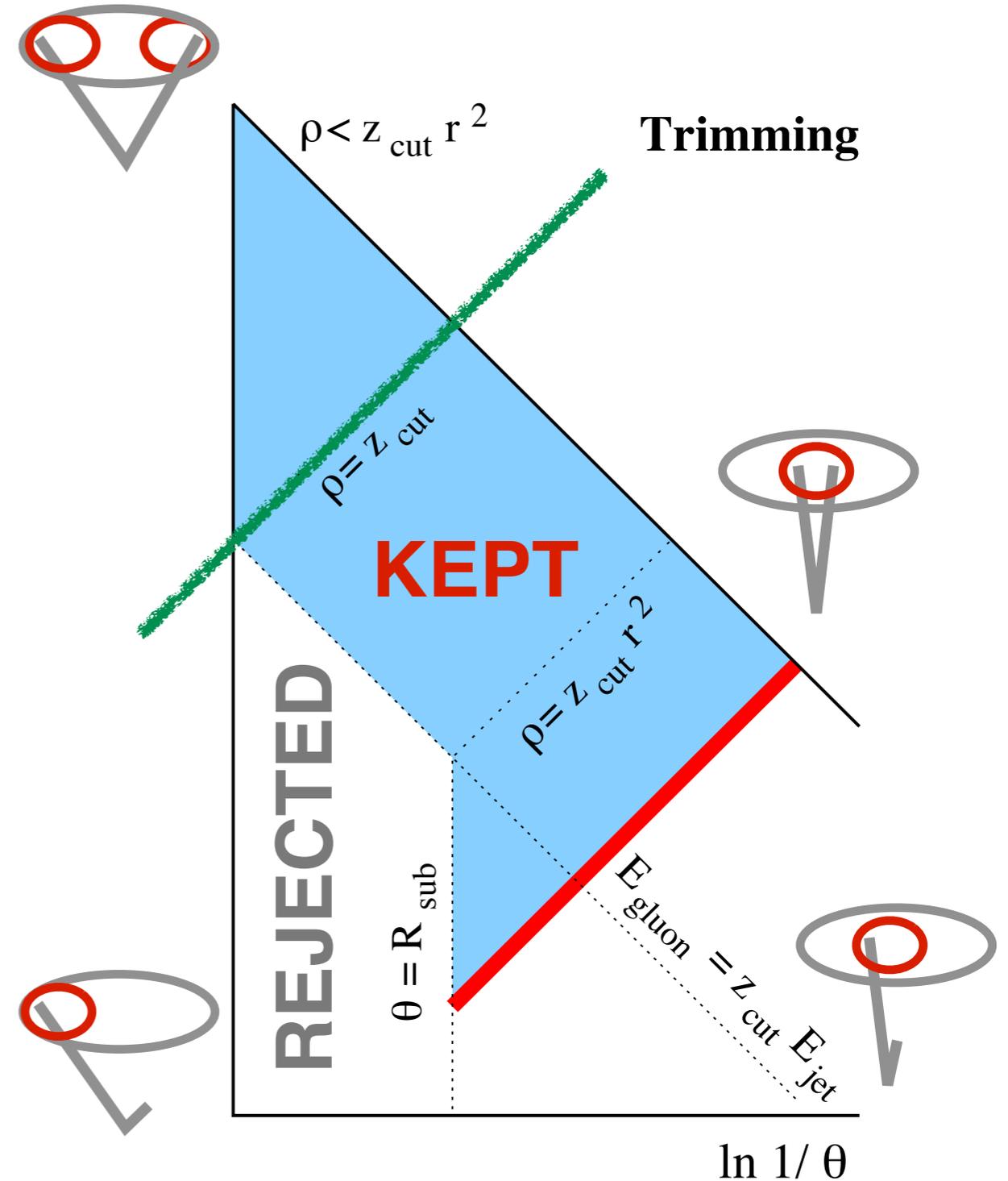
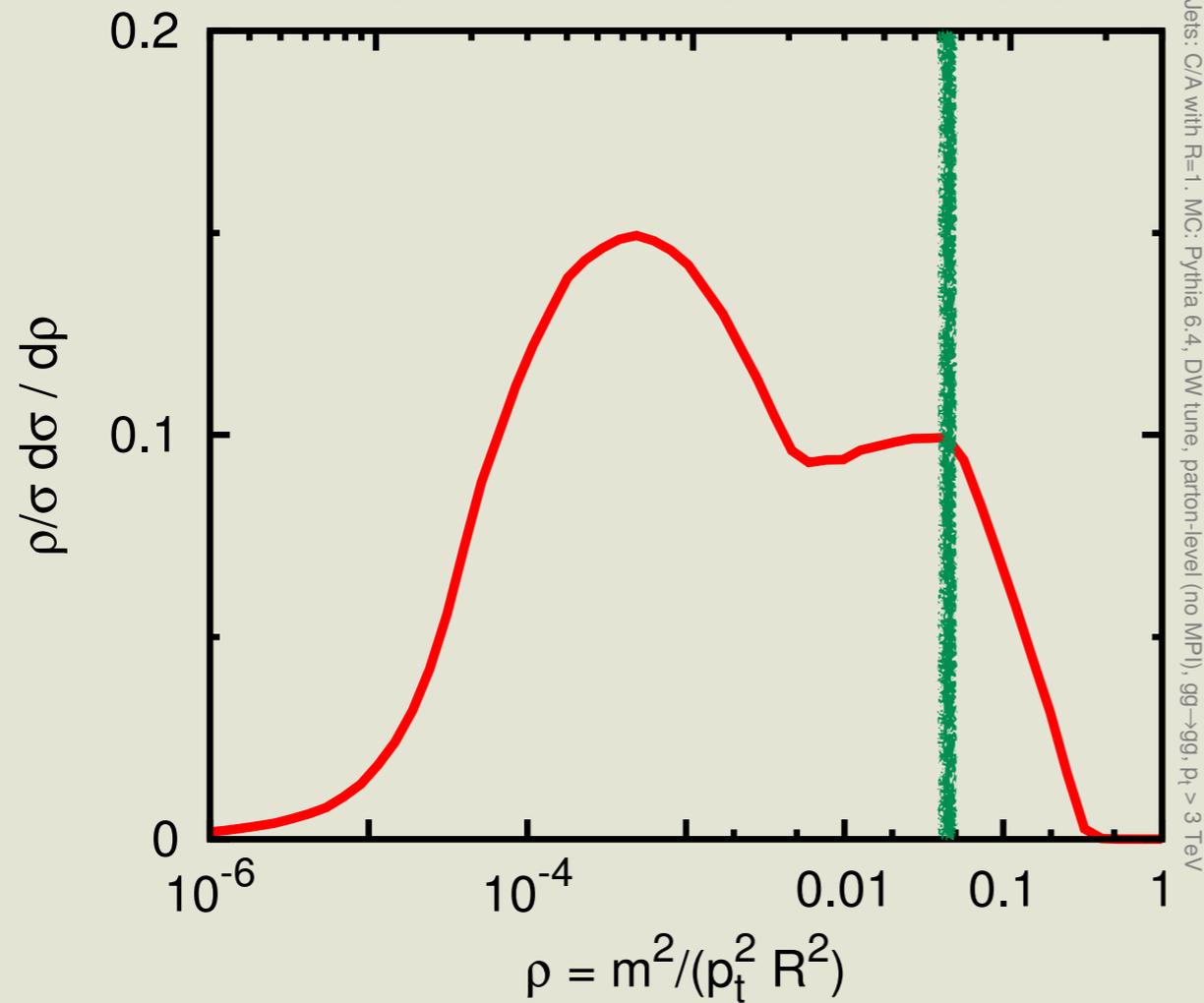
10 100 1000



trimmed quark jets (Pythia 6 MC)

m [GeV], for $p_t = 3$ TeV, $R=1$

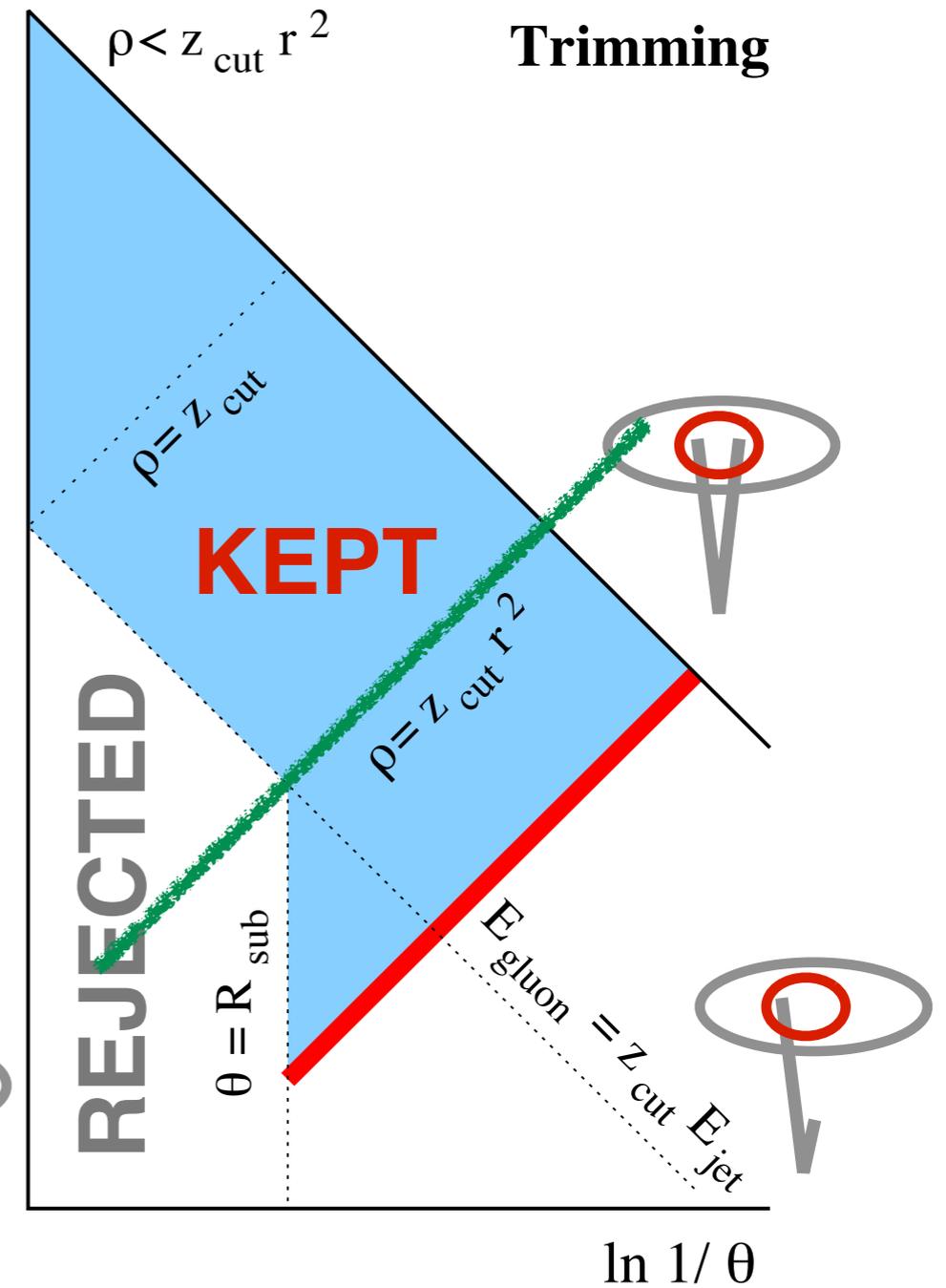
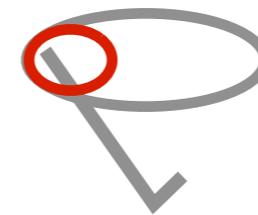
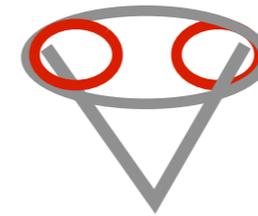
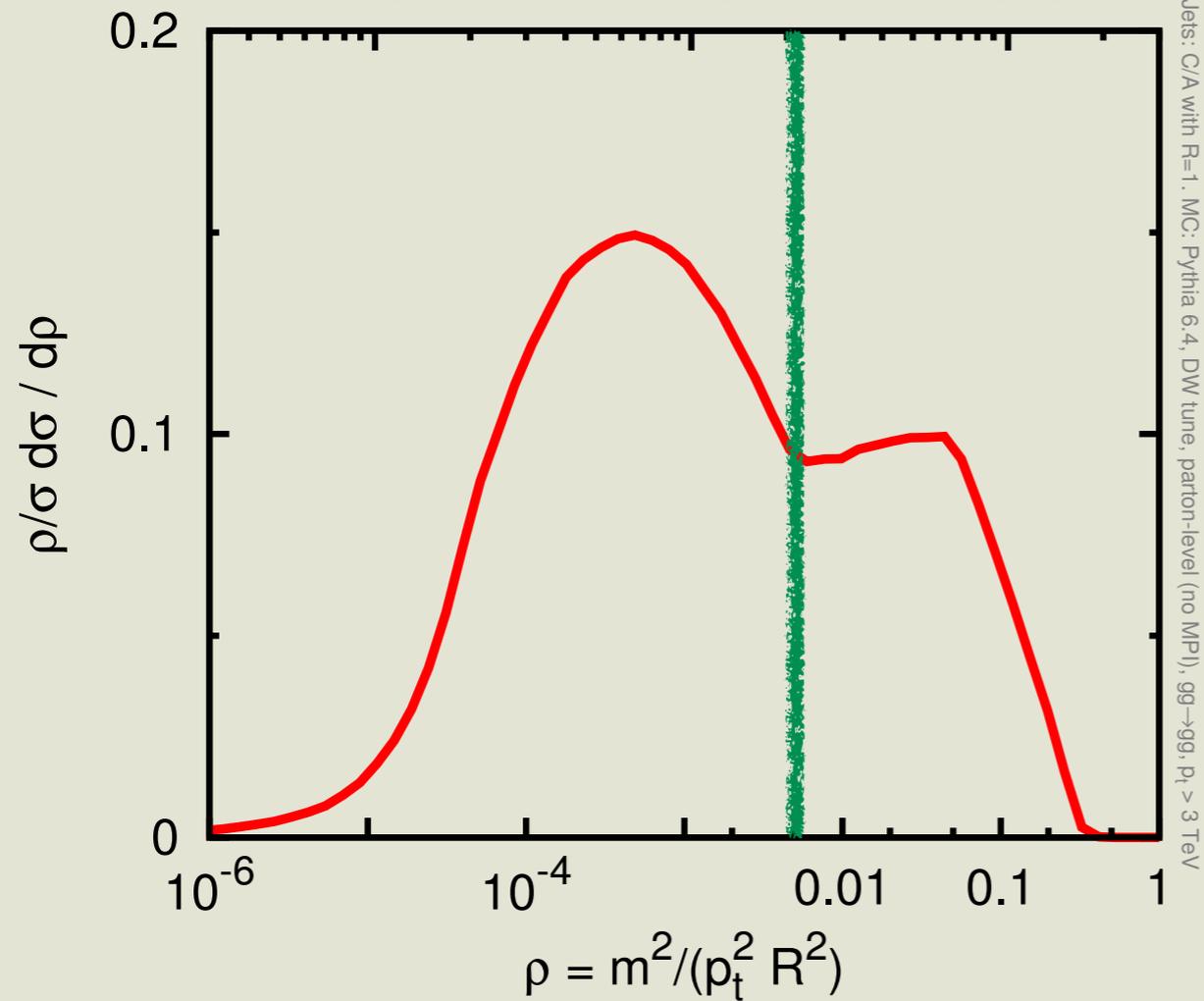
10 100 1000



trimmed quark jets (Pythia 6 MC)

m [GeV], for $p_t = 3$ TeV, $R=1$

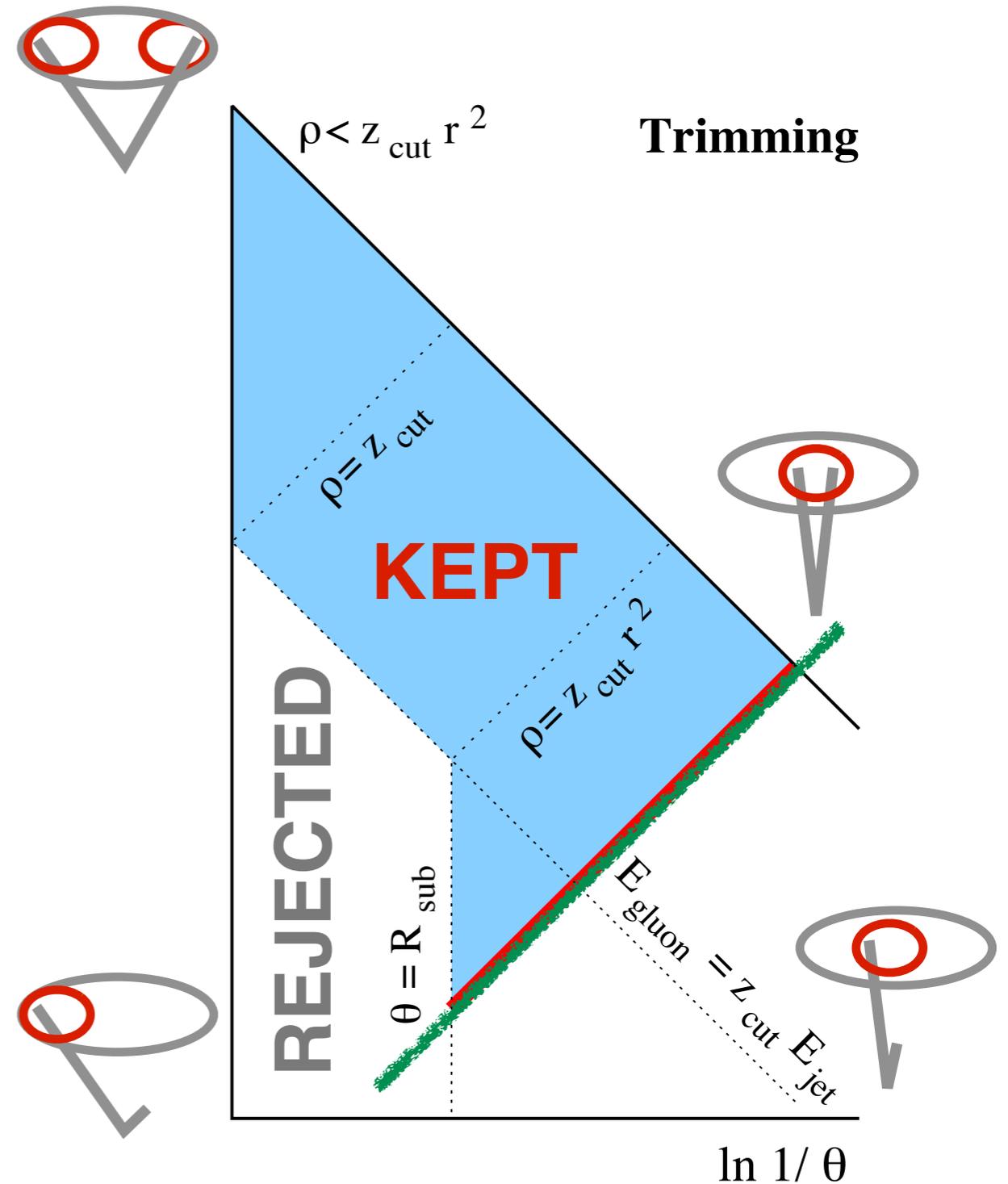
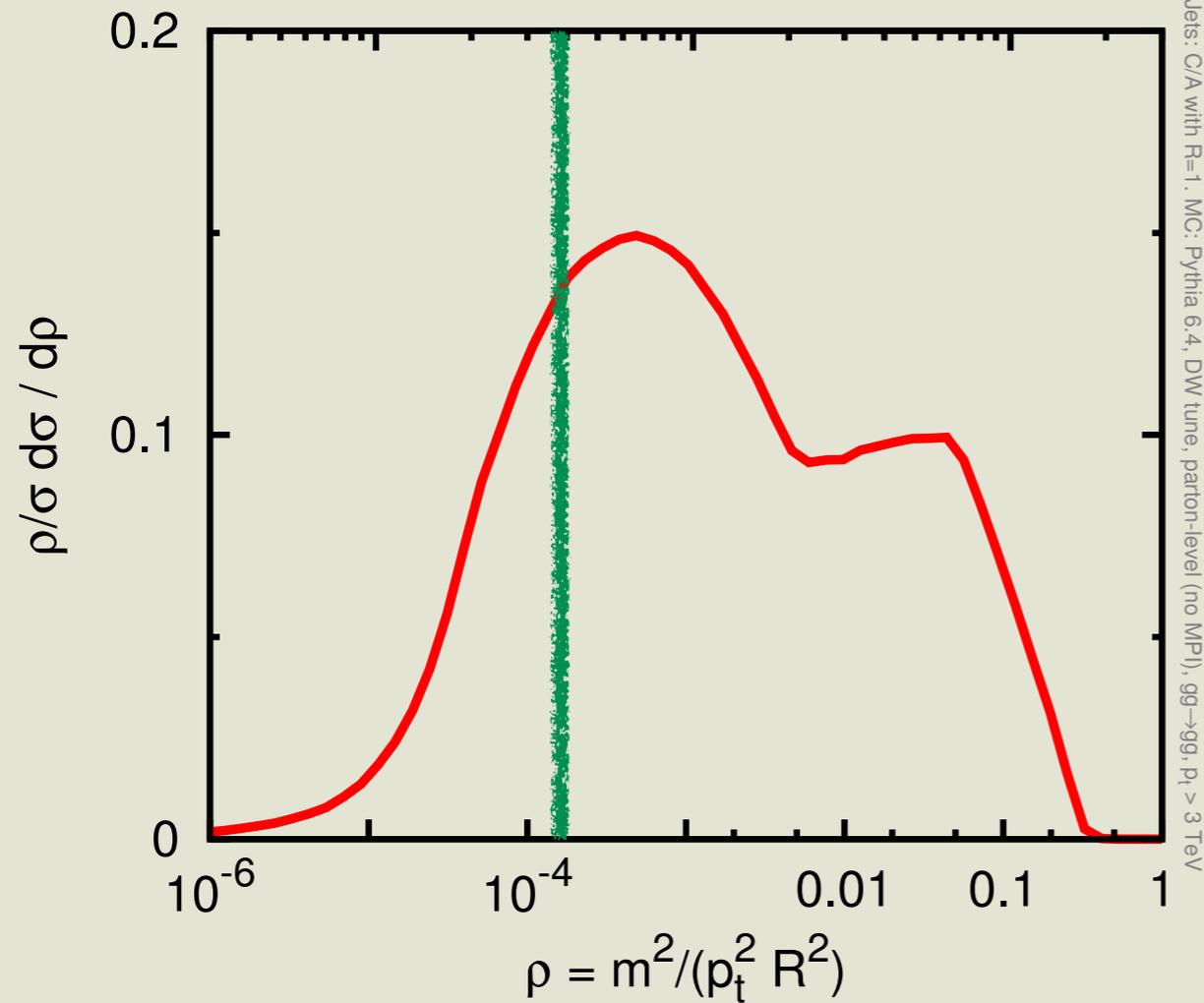
10 100 1000



trimmed quark jets (Pythia 6 MC)

m [GeV], for $p_t = 3$ TeV, $R=1$

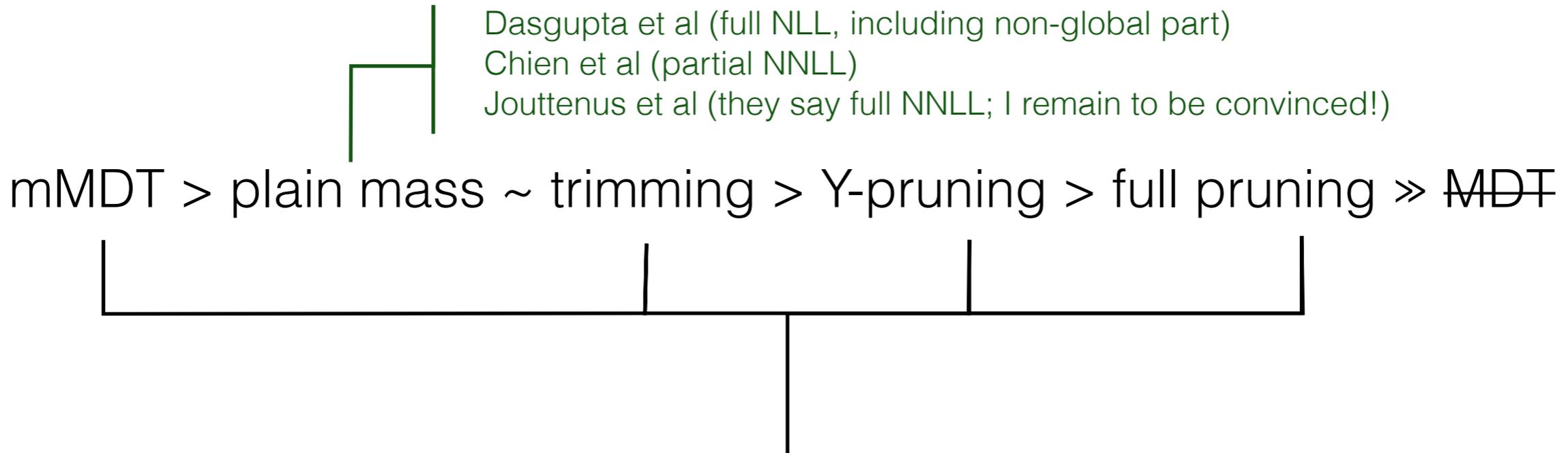
10 100 1000



What about actual calculations of the taggers?

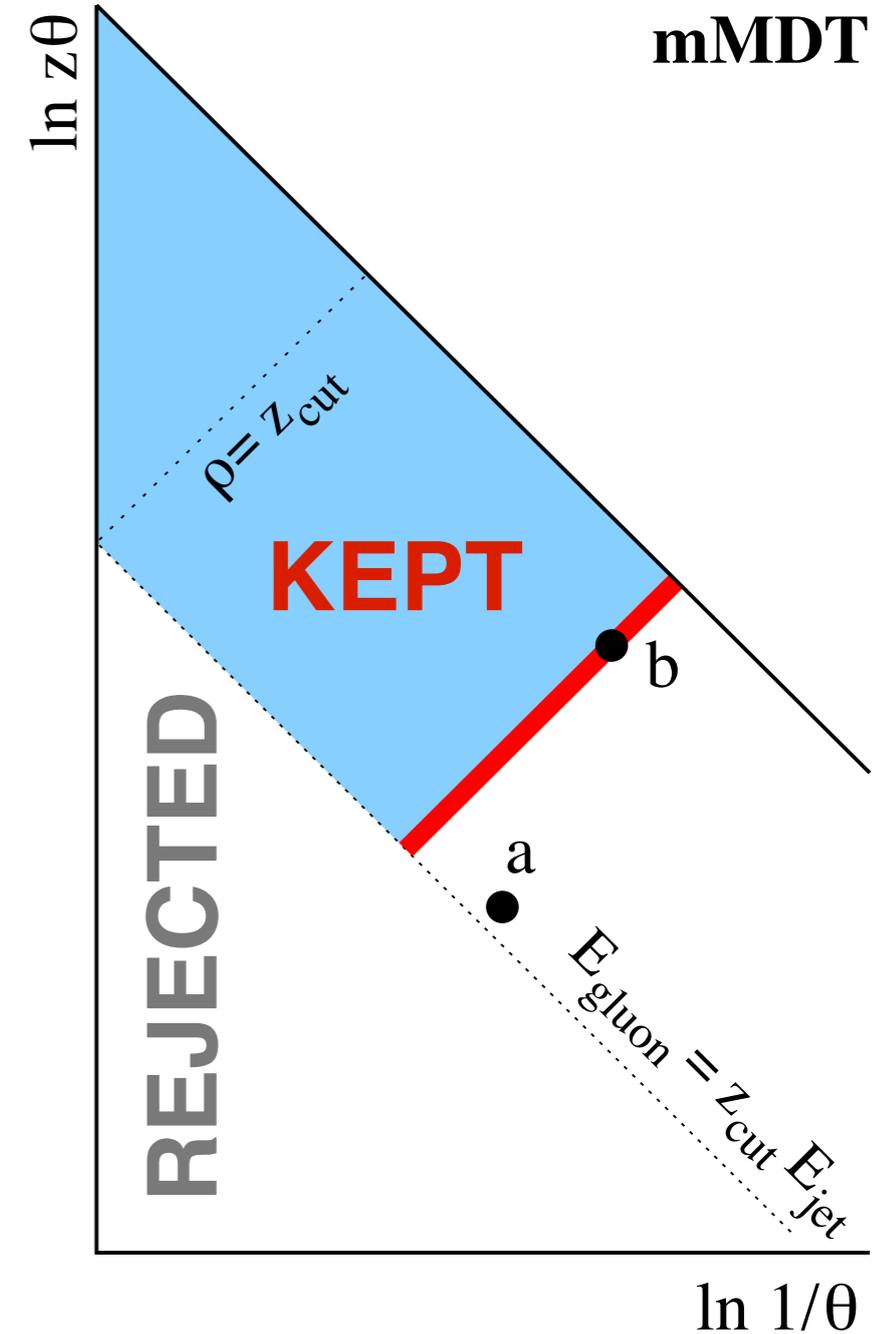
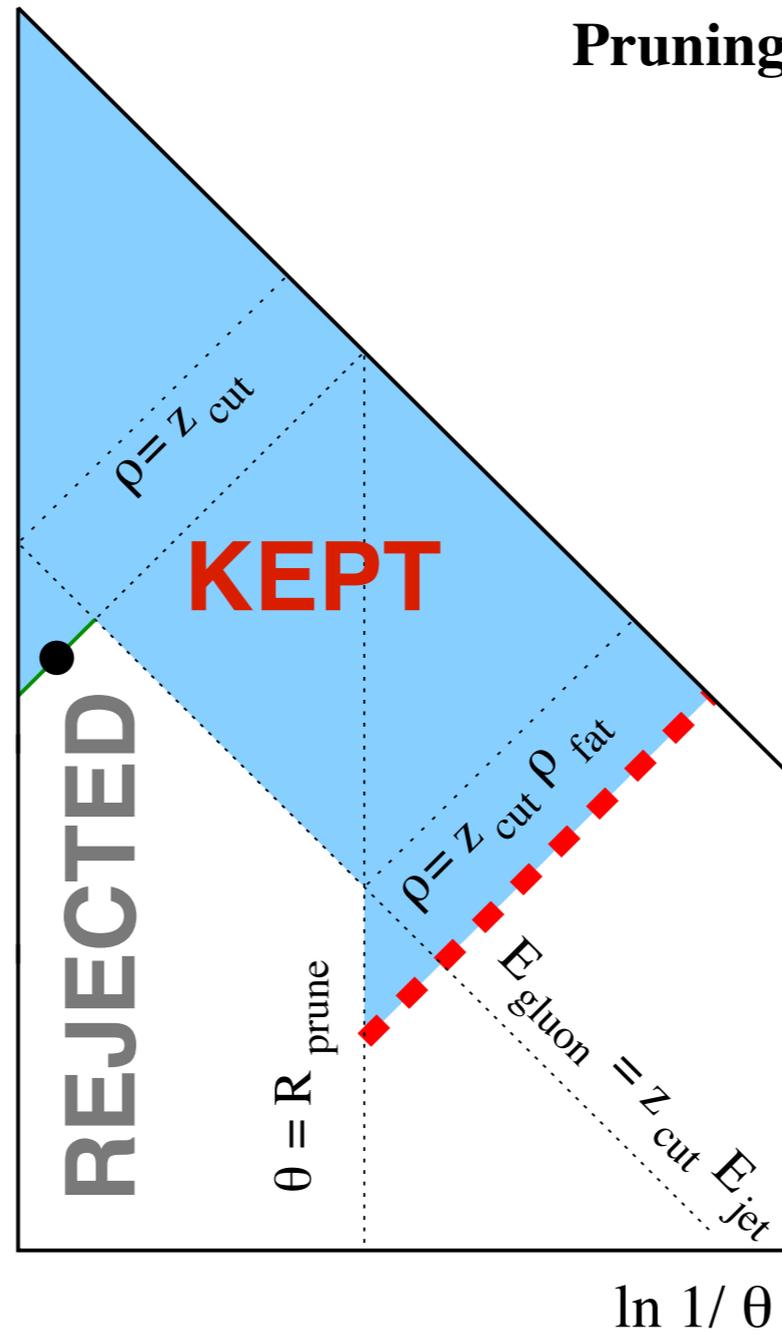
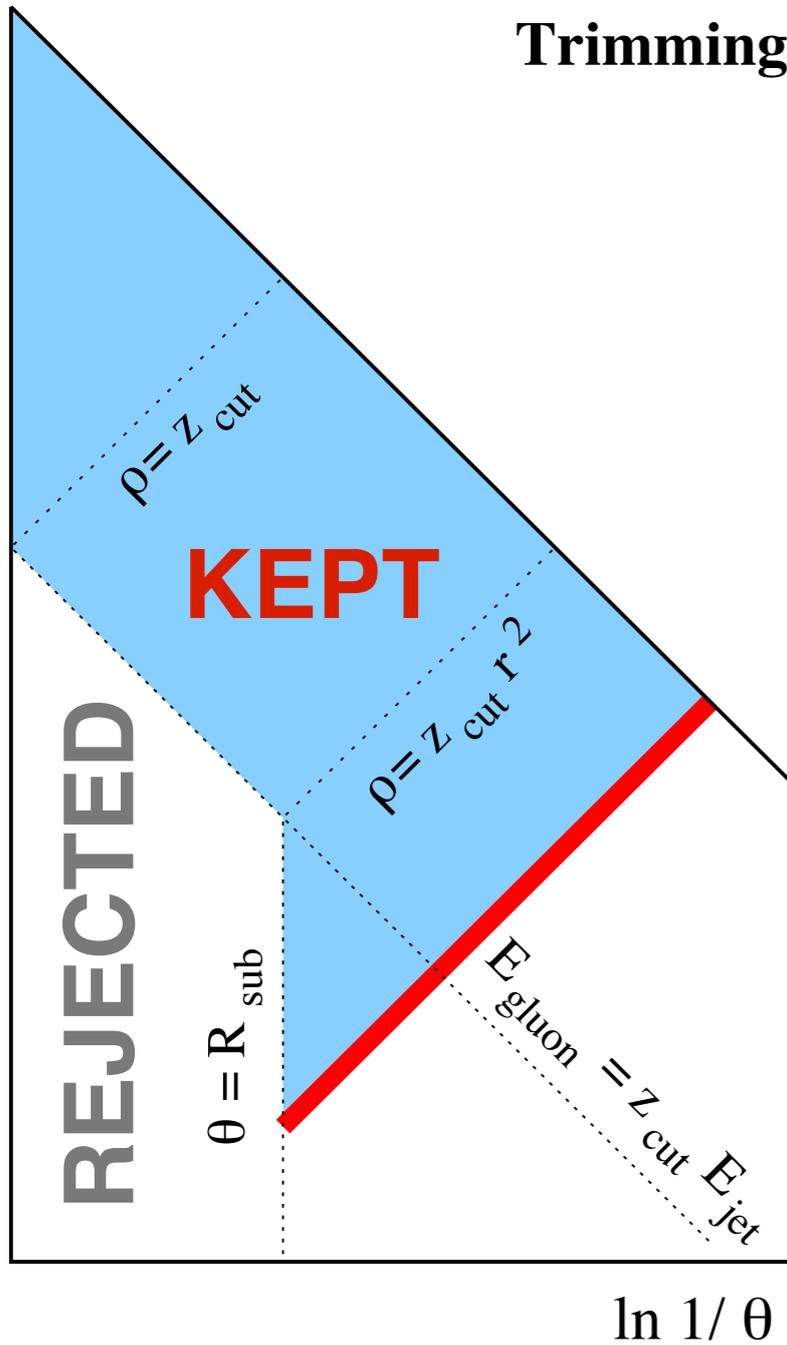
Simpler

More complex

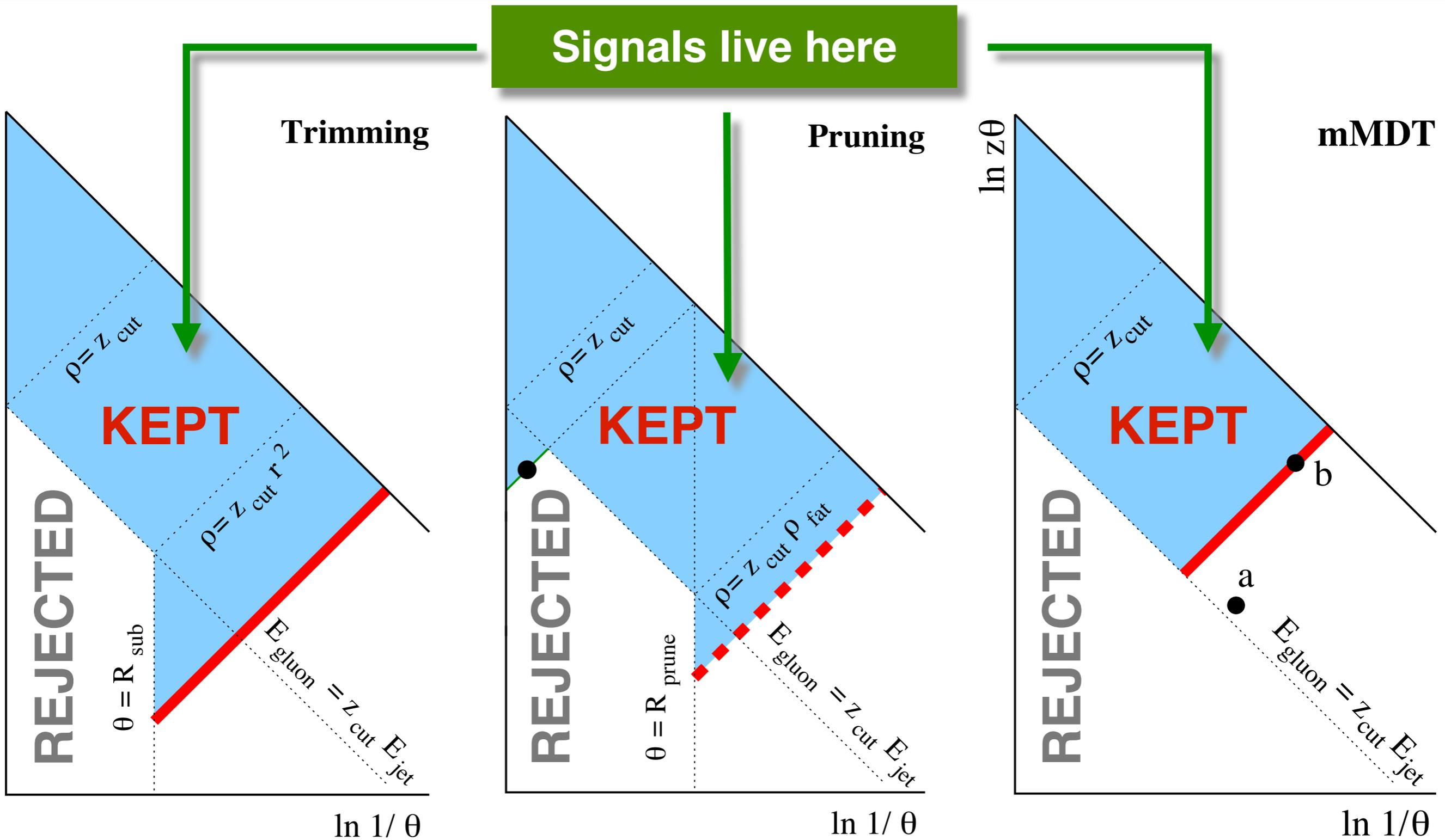


LL in all cases, plus some subleading logs
[NB: LL doesn't mean the same thing in all cases!]

Kinematic regions for different taggers



Kinematic regions for different taggers



Summary table

	highest logs	transition(s)	Sudakov peak	NGLs
plain mass	$\alpha_s^n L^{2n}$	—	$L \simeq 1/\sqrt{\bar{\alpha}_s}$	yes
trimming	$\alpha_s^n L^{2n}$	$z_{\text{cut}}, r^2 z_{\text{cut}}$	$L \simeq 1/\sqrt{\bar{\alpha}_s} - 2 \ln r$	yes
pruning	$\alpha_s^n L^{2n}$	$z_{\text{cut}}, z_{\text{cut}}^2$	$L \simeq 2.3/\sqrt{\bar{\alpha}_s}$	yes
MDT	$\alpha_s^n L^{2n-1}$	$y_{\text{cut}}, \frac{1}{4}y_{\text{cut}}^2, y_{\text{cut}}^3$	—	yes
Y-pruning	$\alpha_s^n L^{2n-1}$	z_{cut}	(Sudakov tail)	yes
mMDT	$\alpha_s^n L^n$	y_{cut}	—	no

NEW

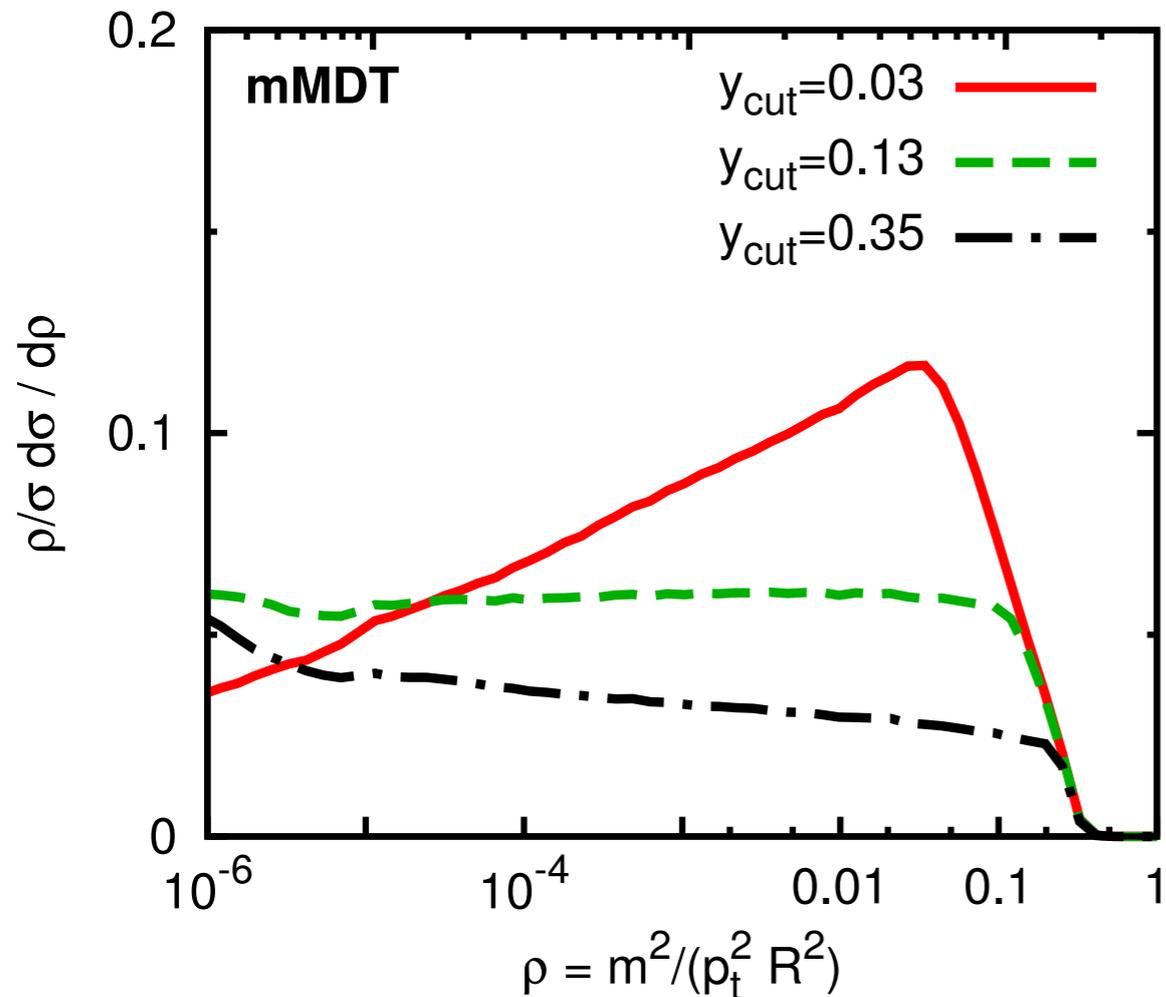
Special: only single logarithms ($L = \ln \rho$)
 → more accurately calculable

Special: better exploits signal/bkgd differences

Monte Carlo

m [GeV], for $p_t = 3$ TeV, $R = 1$

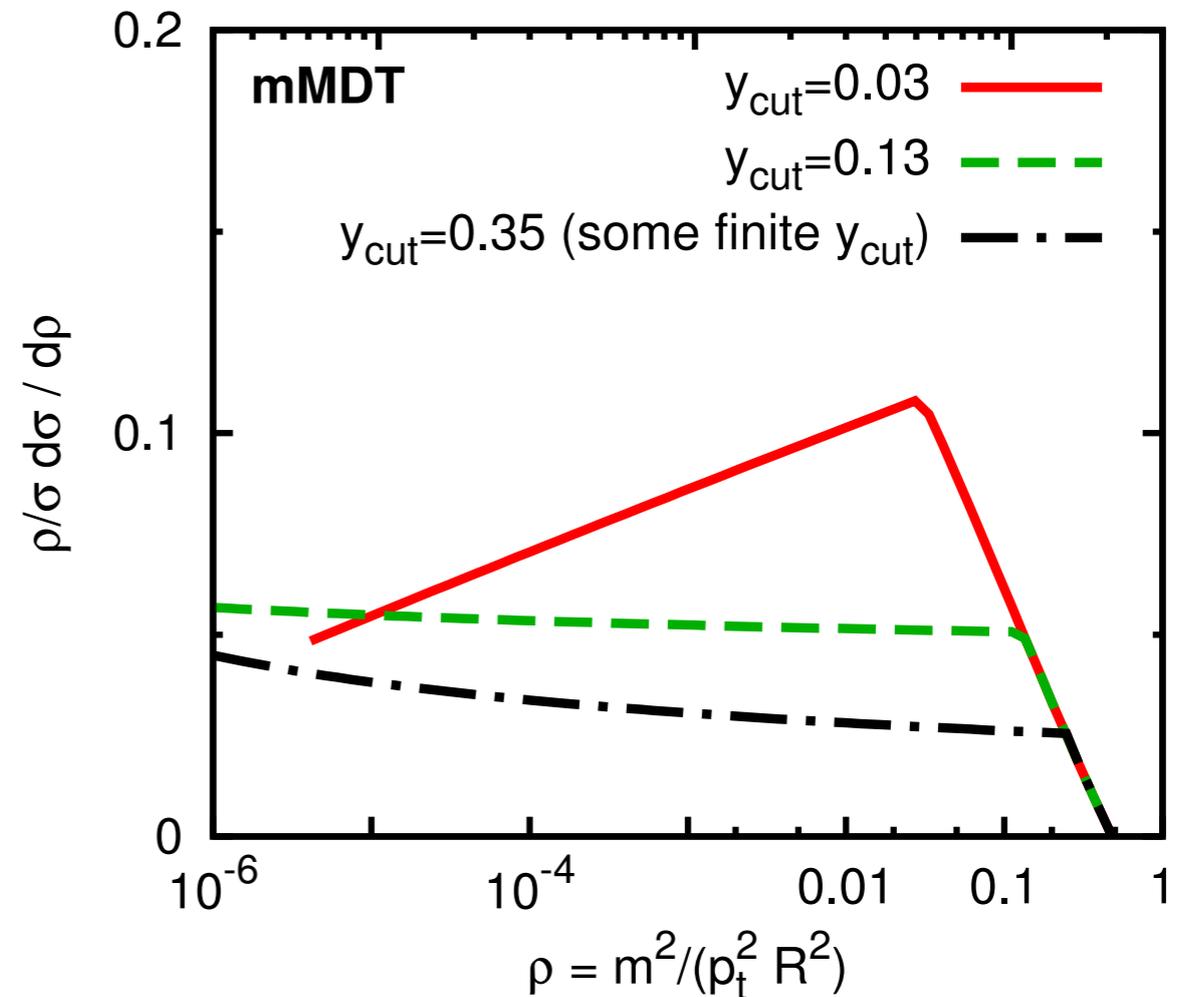
10 100 1000



Analytic

m [GeV], for $p_t = 3$ TeV, $R = 1$

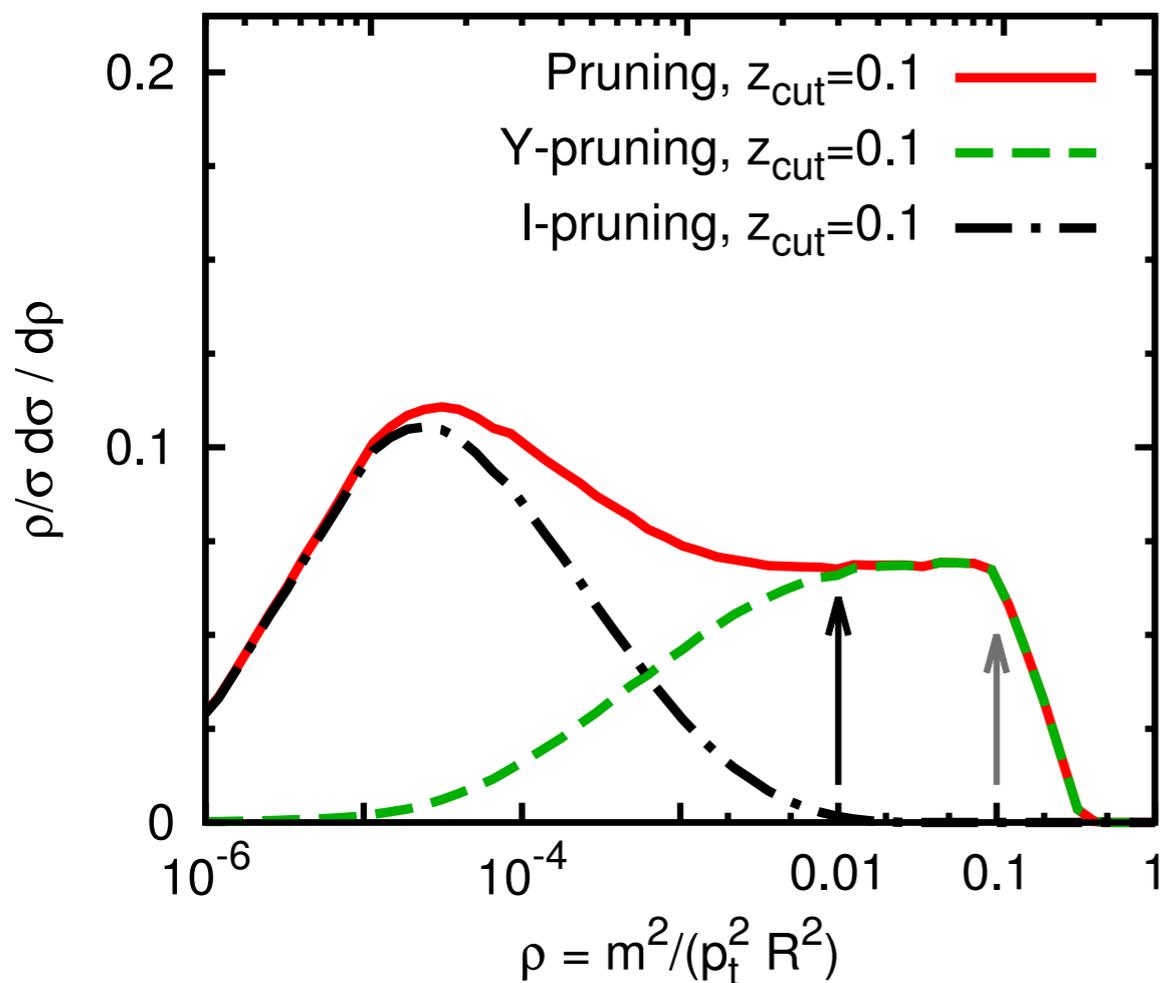
10 100 1000



[mMDT is closest we have to a scale-invariant tagger, though exact behaviour depends on q/g fractions]

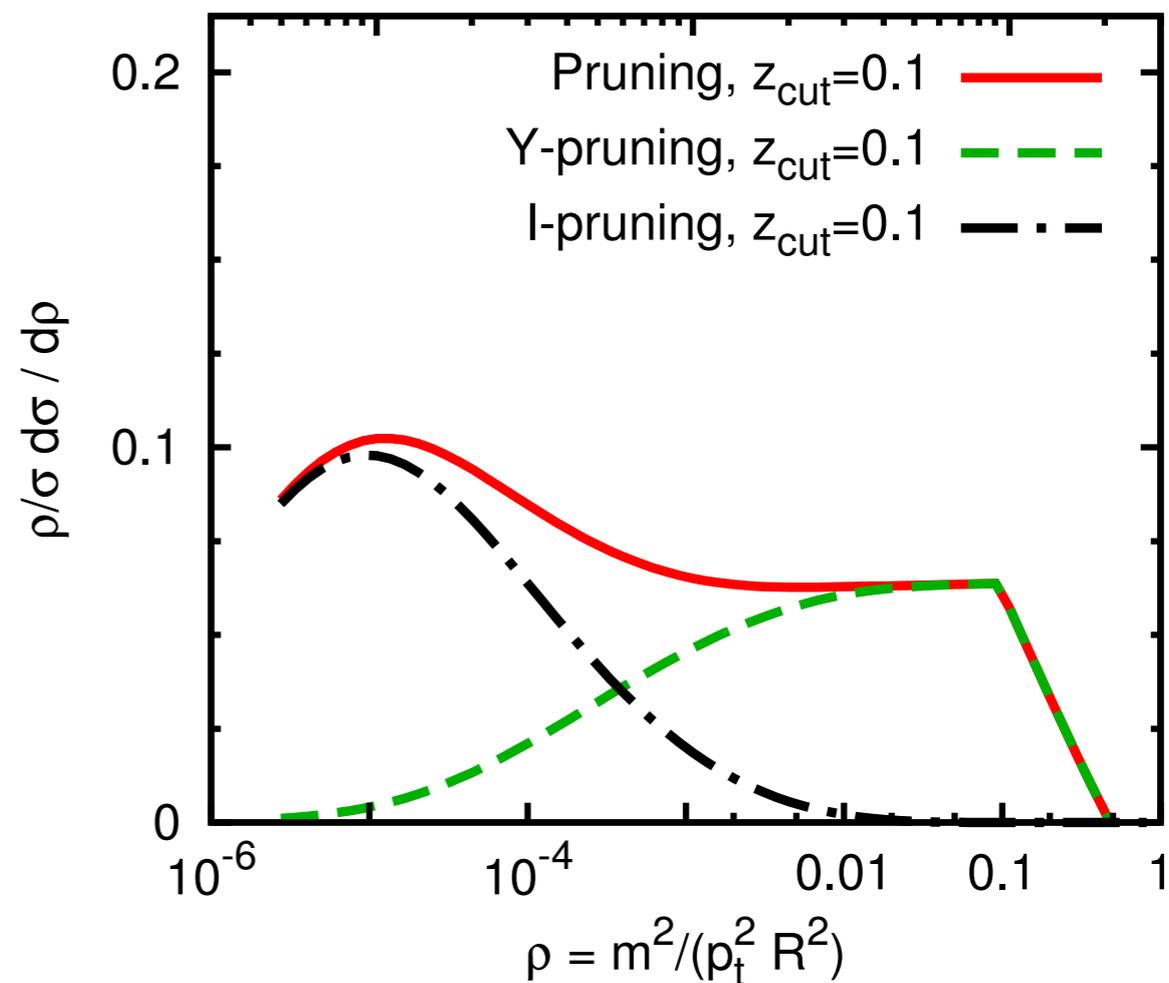
Monte Carlo

m [GeV], for $p_t = 3$ TeV, R = 1
 10 100 1000



Analytic

m [GeV], for $p_t = 3$ TeV, R = 1
 10 100 1000

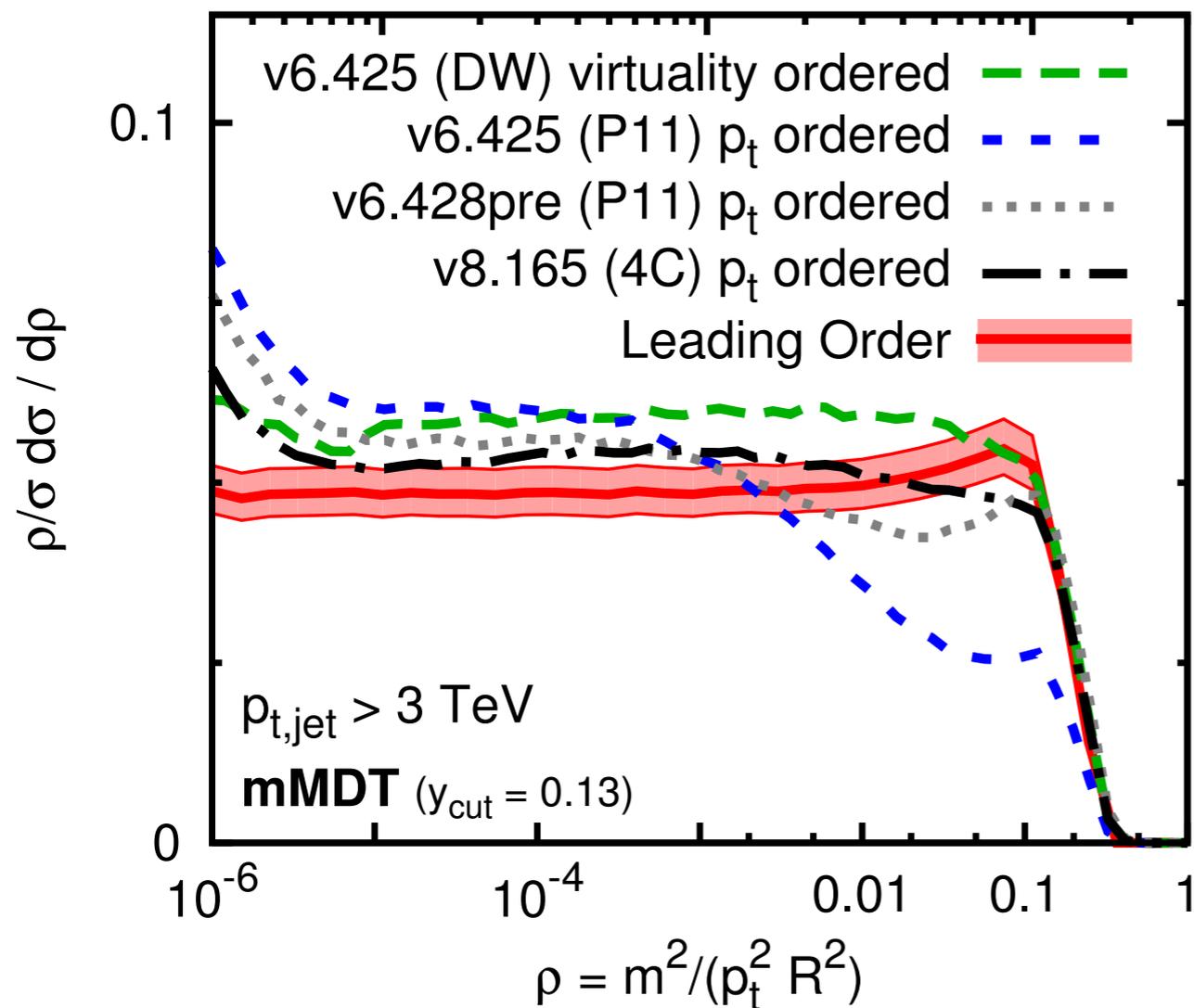


Comparing MC & other tools

LO v. Pythia showers (quark jets)

m [GeV], for $p_{t,jet} = 3$ TeV, $R = 1$

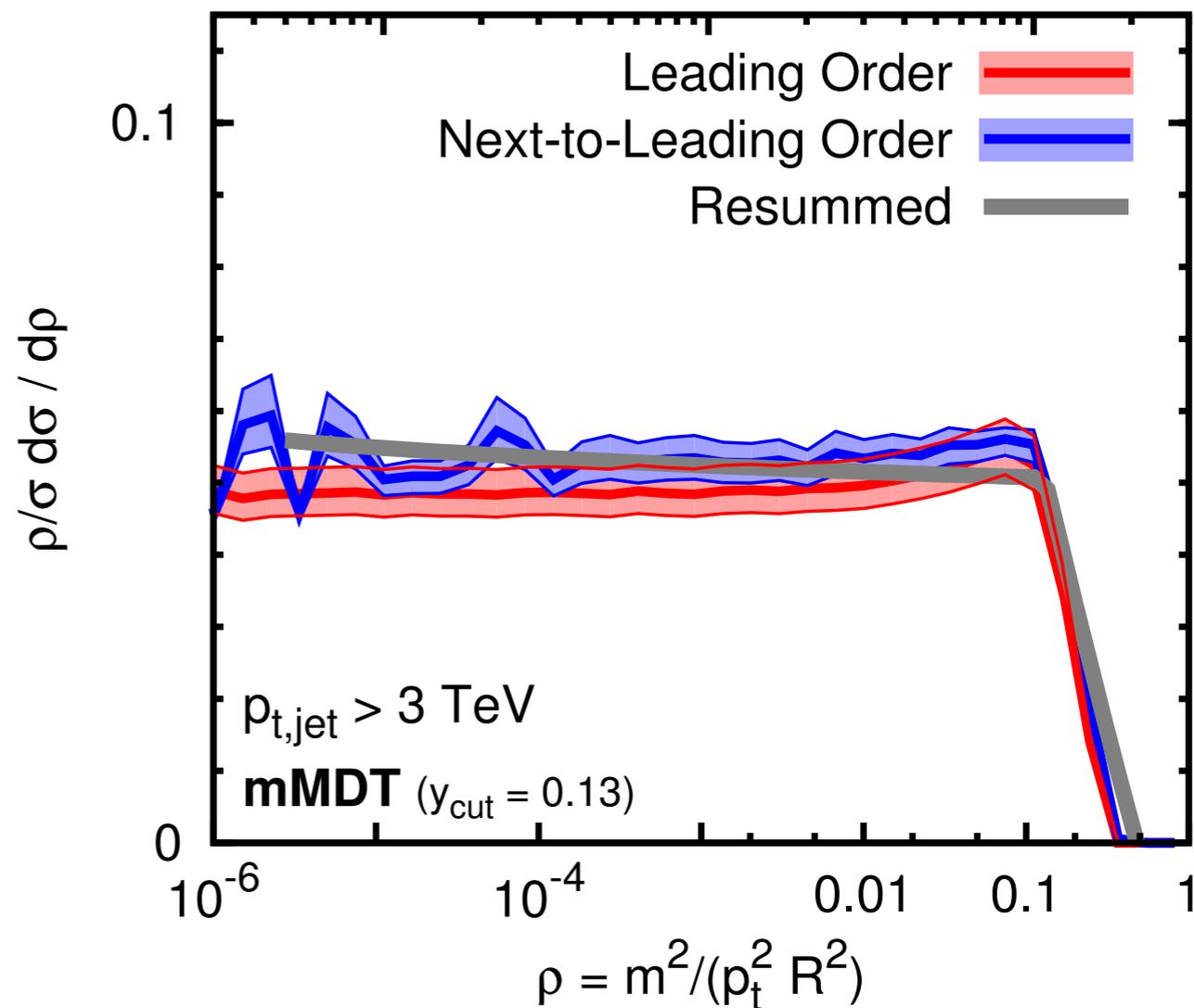
10 100 1000



LO v. NLO v. resummation (quark jets)

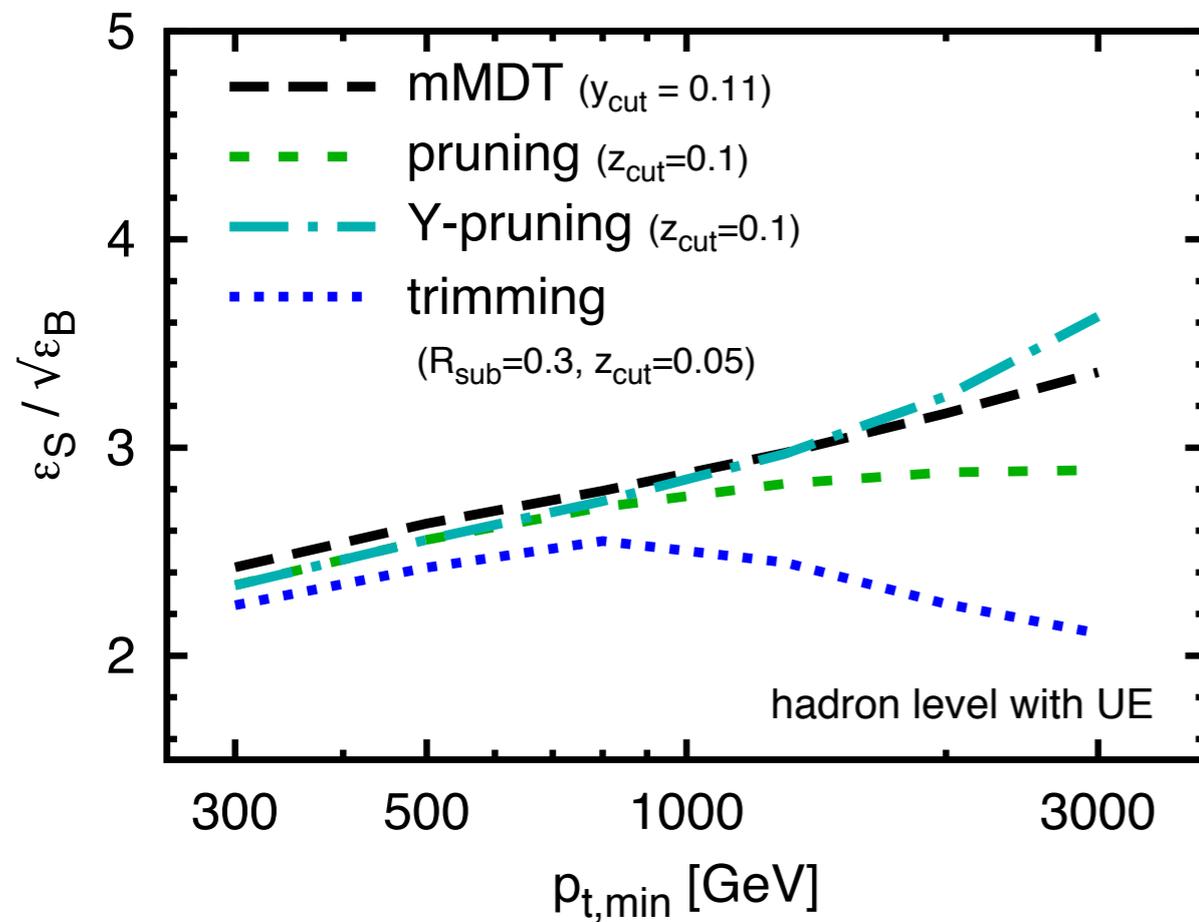
m [GeV], for $p_{t,jet} = 3$ TeV, $R = 1$

10 100 1000



Performance for finding signals

signal significance with quark bkgds



signal significance with gluon bkgds

