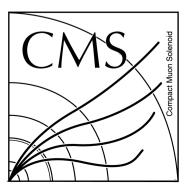
Dealing with Large backgrounds





Phil Harris (MIT)



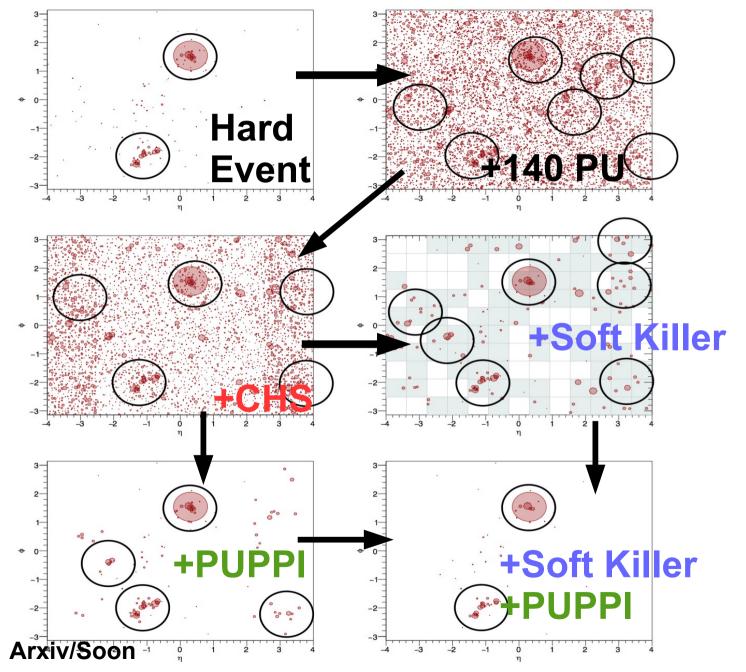
Overview

- Contending with UE makes jet properties difficult
 - Typical energy densities have ρ > 200 GeV
 - That translates to > 100 GeV/AK4 jet area
 - Inside the jet UE still does not look like a jet
 - Jets contain most of their energy in $\Delta R < 0.1$ (7 GeV)
 - Means there are ways to highlight jet specifics
 - However we cannot necessarily remove everything
- Dealing with large backgrounds in pp
 - In pp collisions there are a few more handles
 - However the challenges and precision are different
 - In this talk we draw an analogy with a problem in pp

What are the features of UE?

- UE is the result of many low energy processes
 - Consists of low energy particles
 - Spread roughly uniformly over the event
 - Not part of the hard core of a jet
 - For PP: not part of the primary vertex
- This has led to a number of core algorithms
 - Soft Killer: cut particles below a p_⊤ threshold
 - Constituent/p subtraction : remove avg energy/particle
 - PUPPI : compute likelihood from a jet fragmentation
 - CHS: remove charged particles not from PV
- Note: at this stage pp prefers prticle based sub.

How does this look?



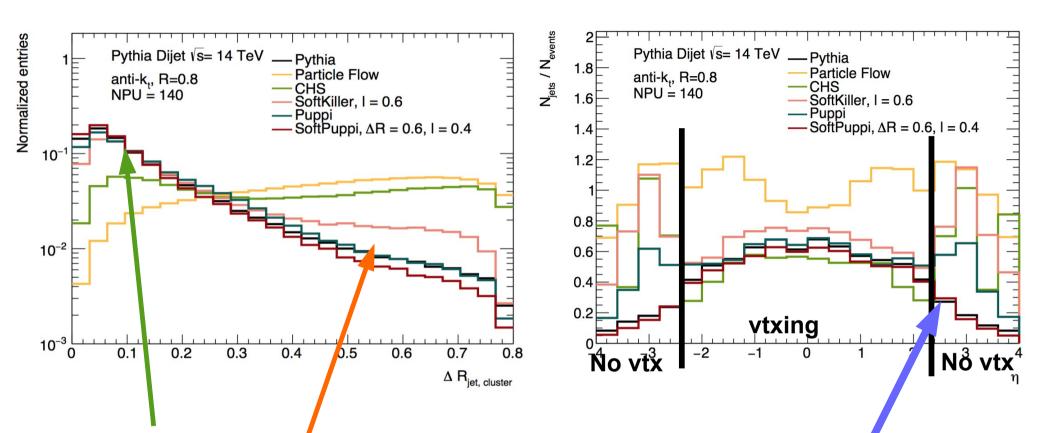
Effectively:

Fragmentation uses radial information

p_T uses hard scatter

Combination of the two brings most robust performance

How does this affect the shape?



- Using radial information biases jets narrow
- Using p_⊤ information biases jets wide
- Using p_⊤ information removes fake jets

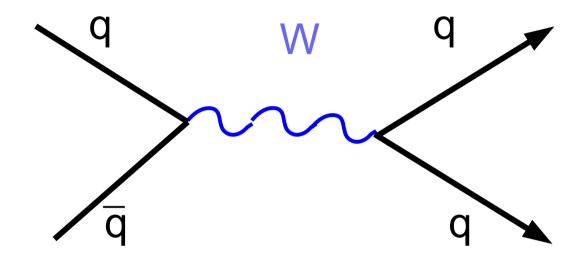
Drawing the analogy with HI

- Despite the success of pp PU(UE) removal algos
 - PP physics still has to contend with degradation
 - Not all UE removal can be performed perfectly
 - Forward region is still an active area of study
 - However impact is much smaller than in HI

- Background subtraction is still a critical issue :
 - This critical issue occurs in jet physics
 - Tools we use to resolve this issue are relevant to HI
 - Lets consider a relevant example with a lot of bkg
 - This is a measurement I would love to do in the future

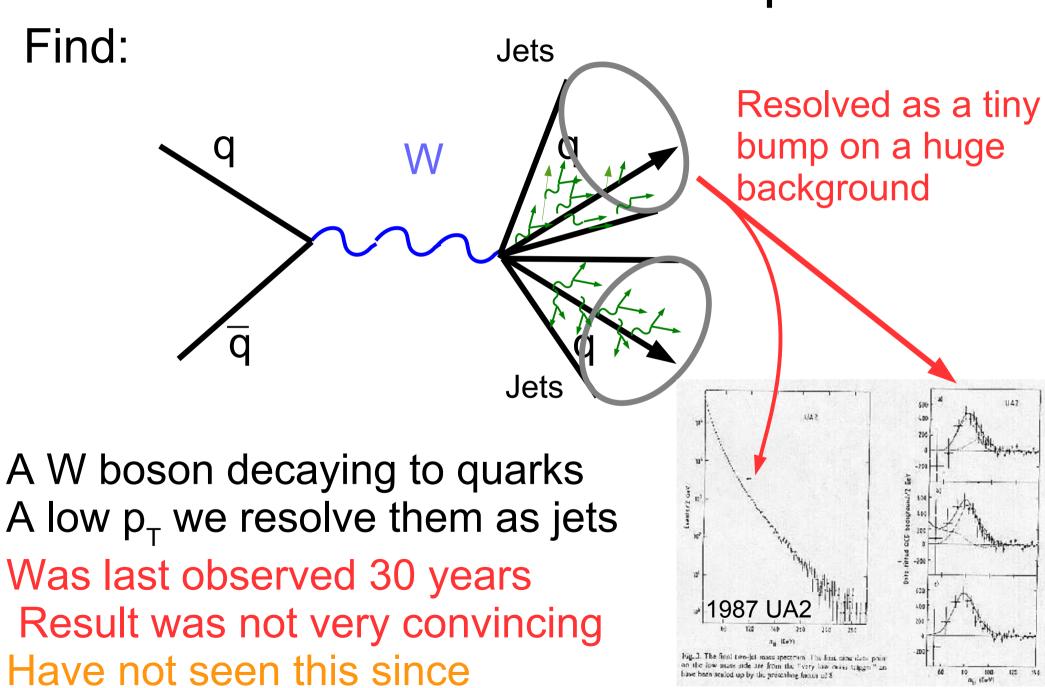
The Problem

Find:



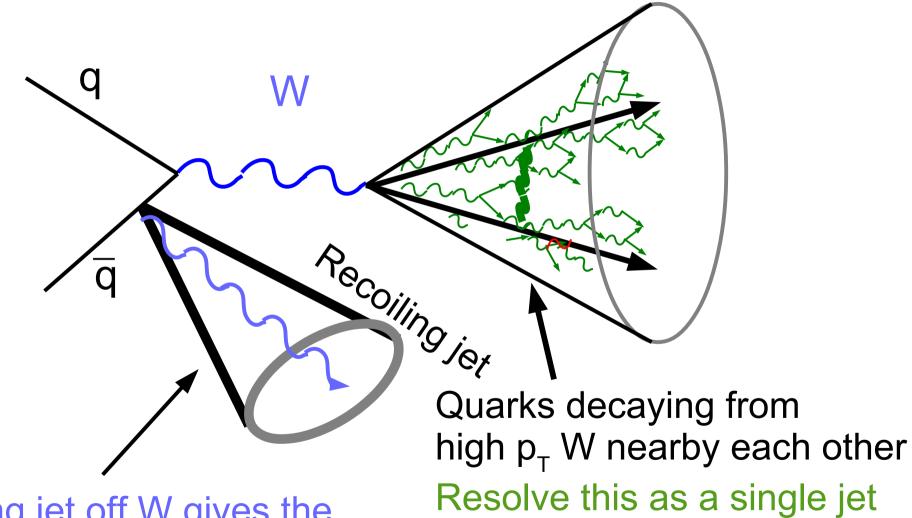
A W boson decaying to quarks

In an experiement



Whats the first goal?

Require W to be a high p_T



Recoiling jet off W gives the W high p_T

Jet grooming

In order get a clean mass peak:

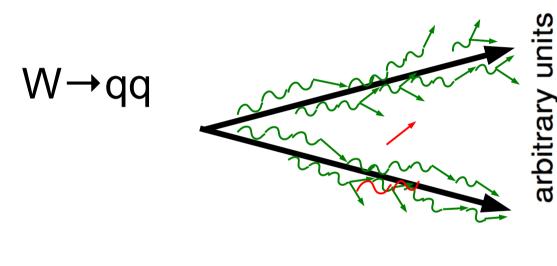
Adopt an approach that cleans excess radiation in a jet

 $W \rightarrow qq$ $W \rightarrow qq$ $High W p_T$



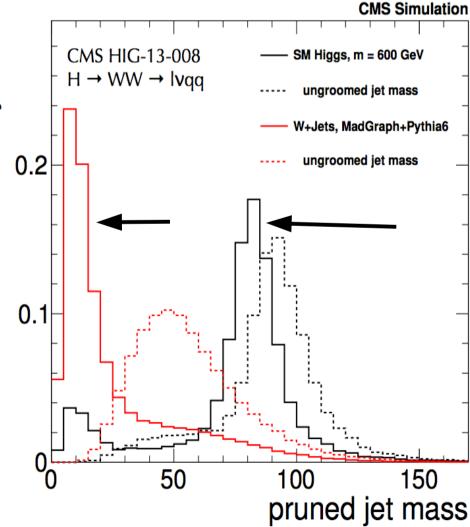
Jet grooming

- In order get a clean mass peak:
 - Adopt an approach that cleans excess radiation in a jet



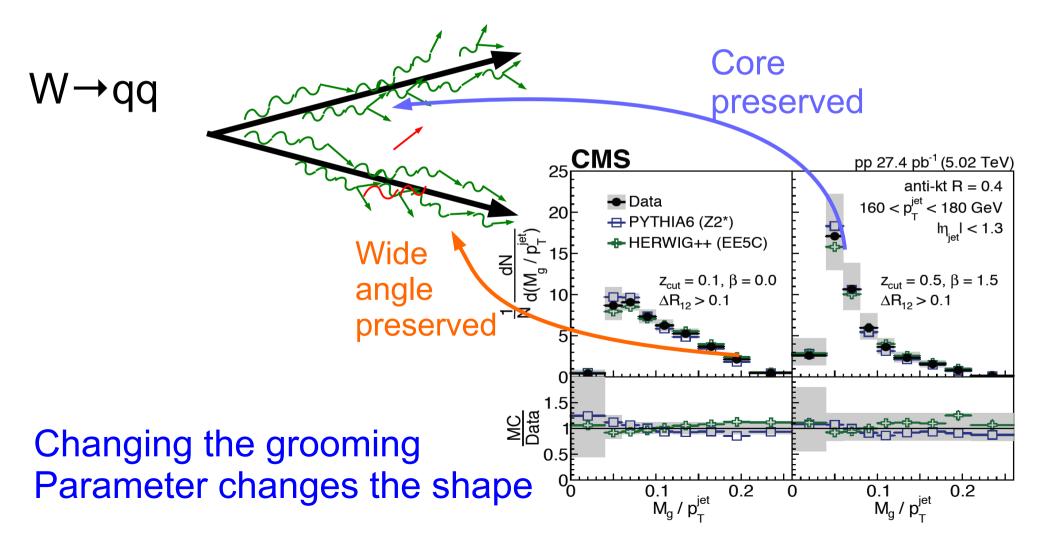
Jet grooming improves the resolution of jets

Pileup/QCD radiation



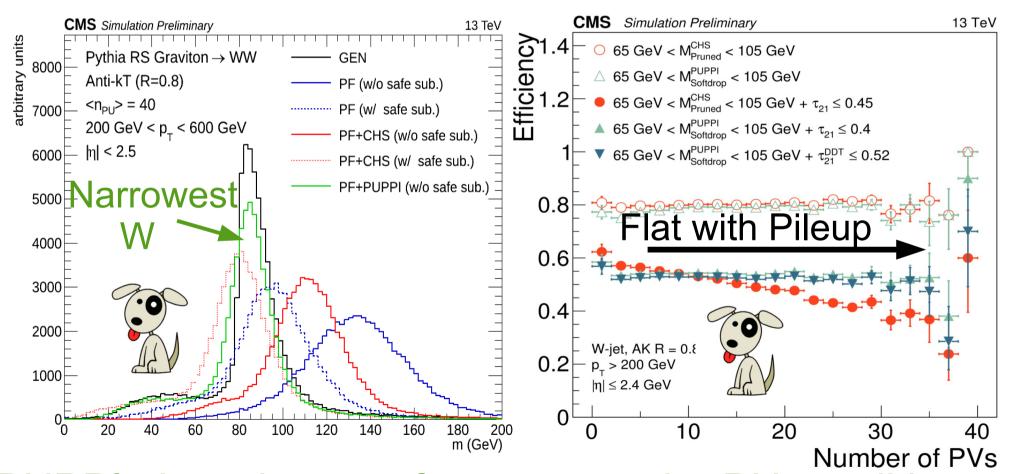
Jet grooming

- In order get a clean mass peak:
 - Adopt an approach that cleans excess radiation in a jet



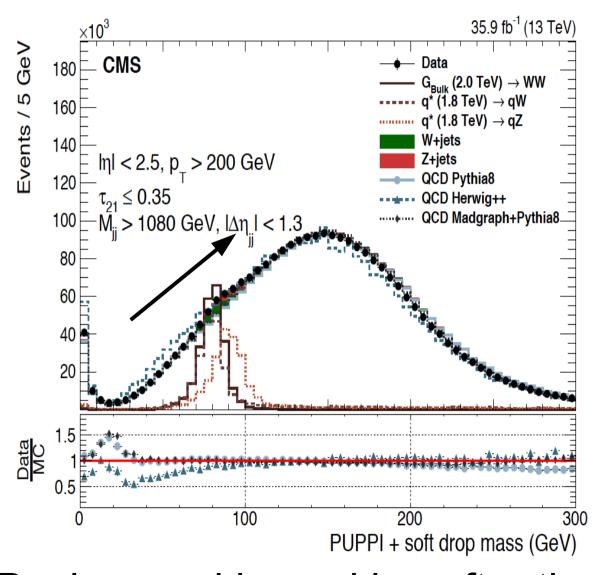
Additional Useful point in PP

- To reduce impact of pileup on substructure
 - Utilize the PUPPI algorithm + Softdrop β=0



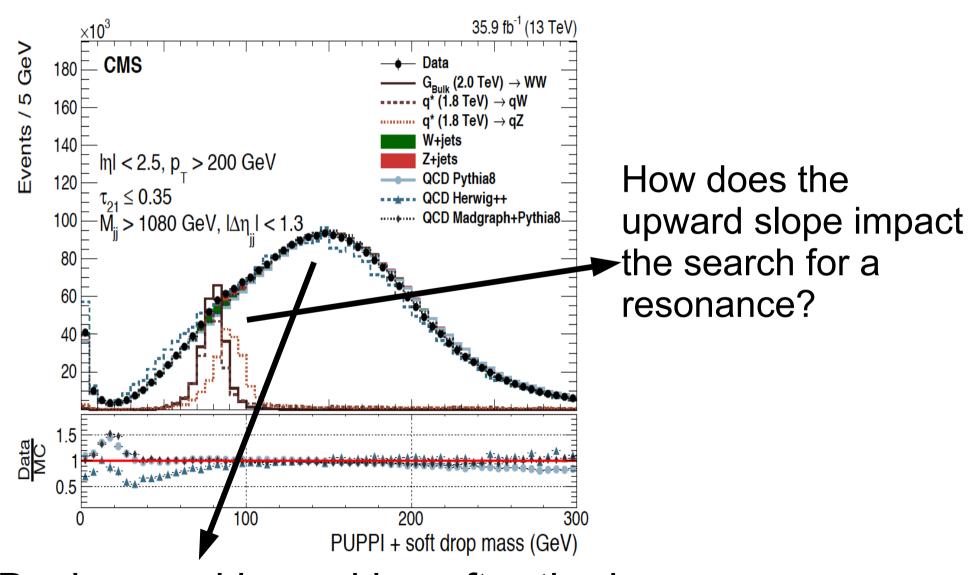
PUPPI gives best performance under PU conditions

Finding the W/Z on a slope

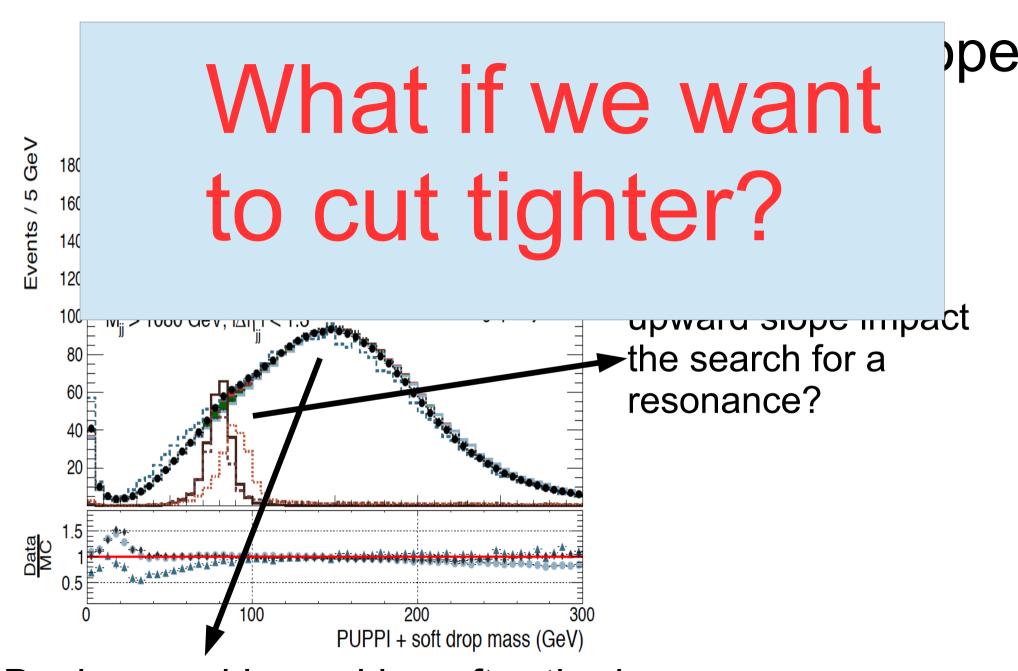


Background is peaking after the bump helps to improve reduce background at W

Finding the W/Z on a slope



Background is peaking after the bump helps to improve reduce background at W

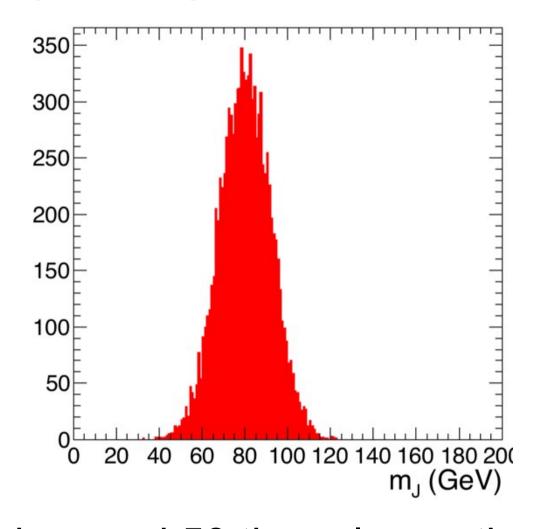


Background is peaking after the bump helps to improve reduce background at W

A Quick Game

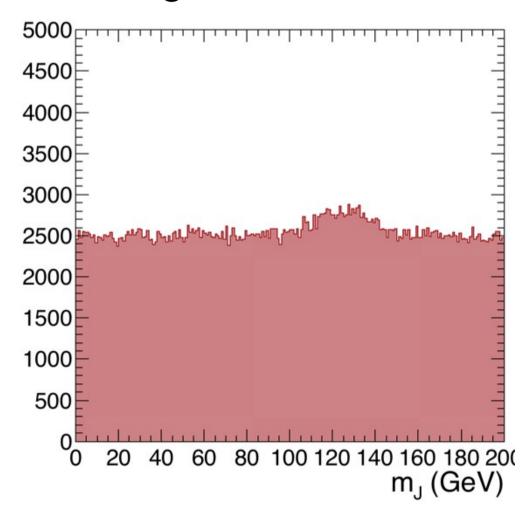
Lets play a game

Lets try to inject a signal likes this

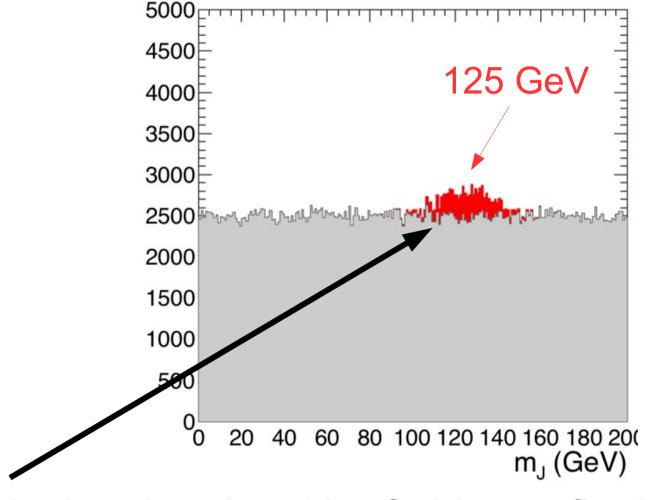


Into a background 50 times larger than this This signal looks very much like a W peak

Can you see the signal?

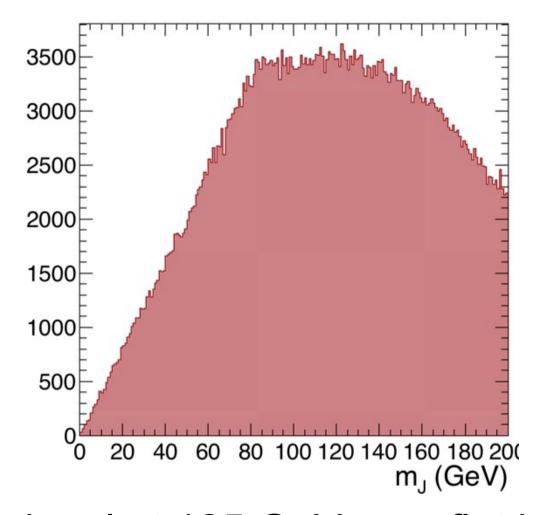


Can you see the signal?



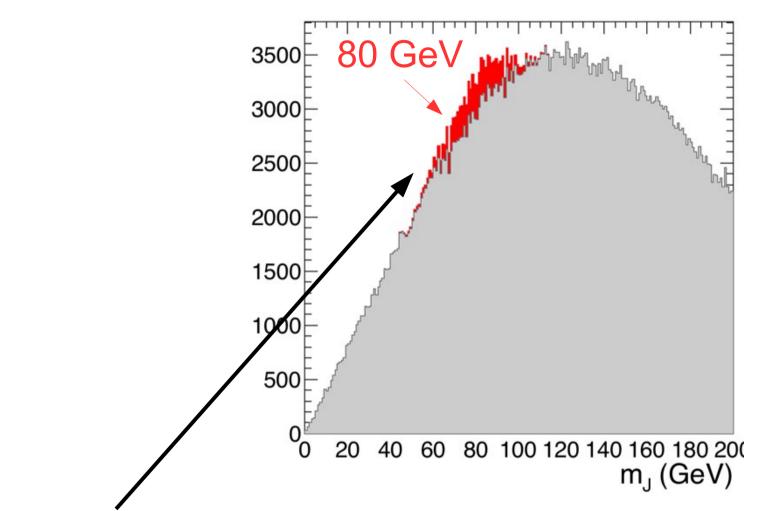
Here is the signal at 125 GeV on a flat background That was an easy one!

Can you see the signal?



Here is the signal at 125 GeV on a flat background Now the background peaks just after the signal

Can you see the signal?

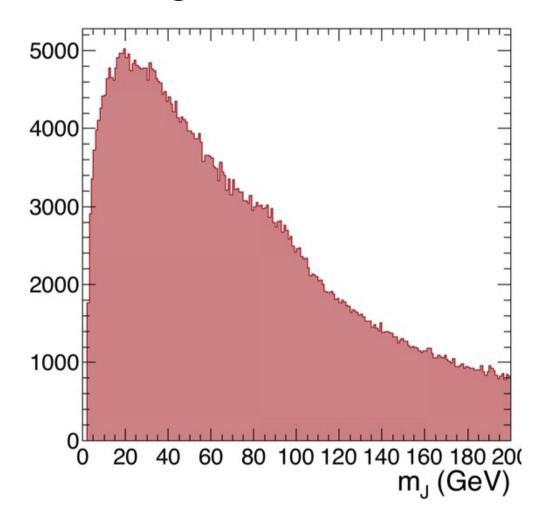


Here it is. This one is a bit harder.

Note exact same amount of background and signal

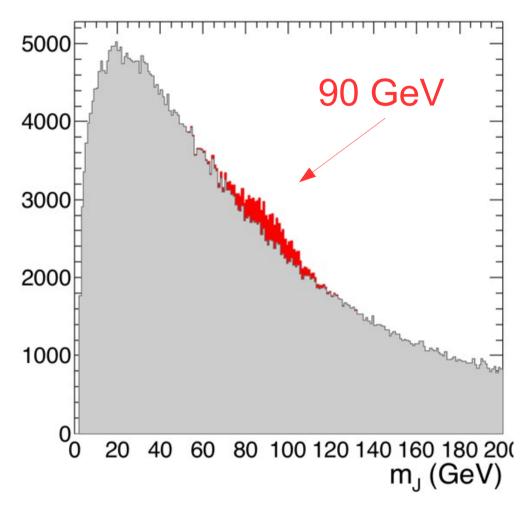
How about now?

Can you see the signal?



How about now?

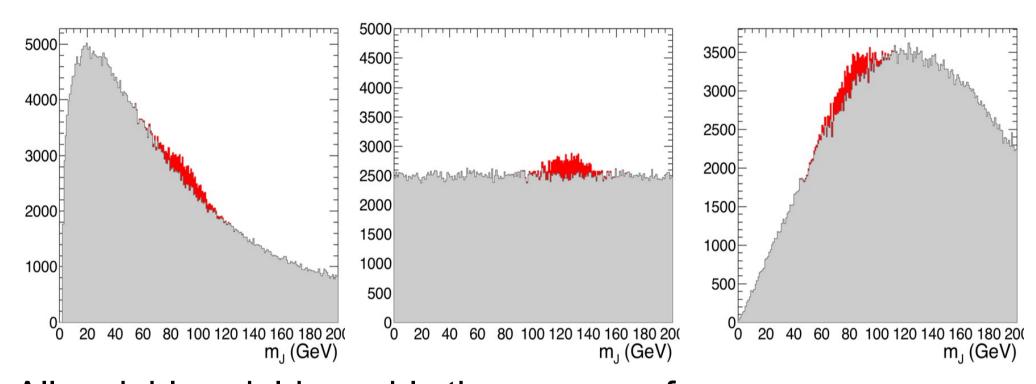
Can you see the signal?



Background

Note exact same amount of background and signal

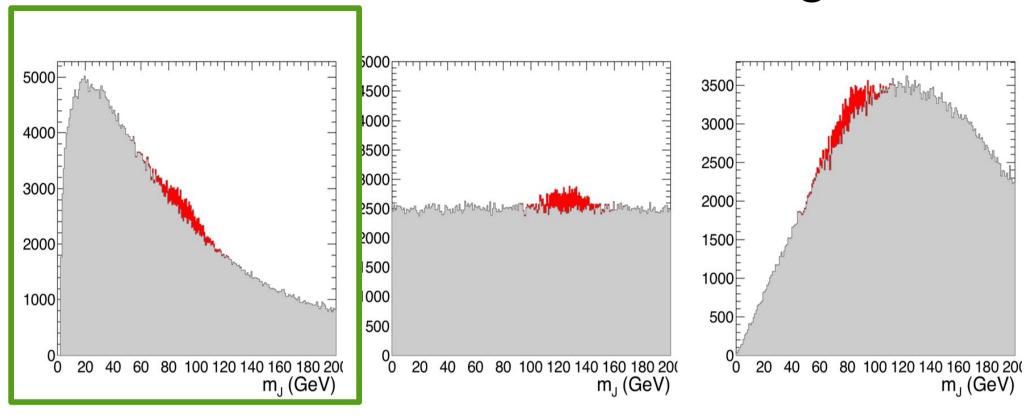
Whats best background?



All variables yield roughly the same performance Exactly the same background yield Exactly the same signal yield

What if we could tune background shape to what we want? What would be our best choice of shape?

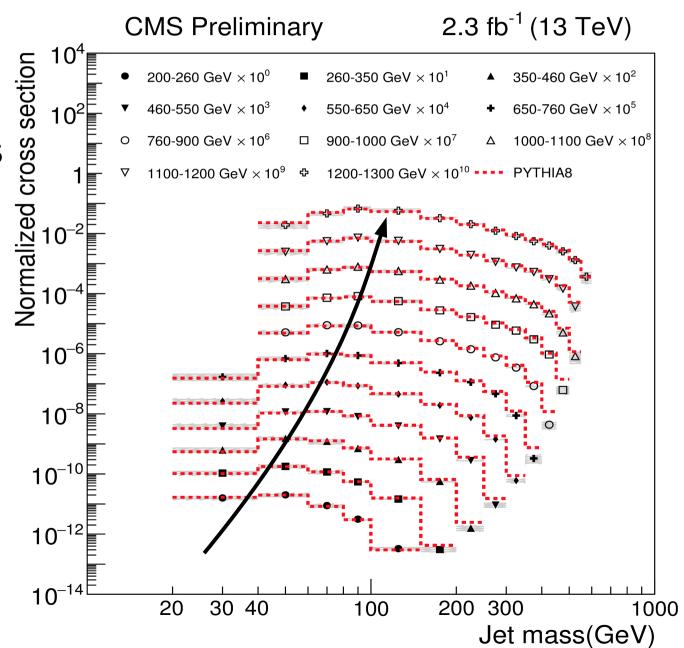
Whats best background?



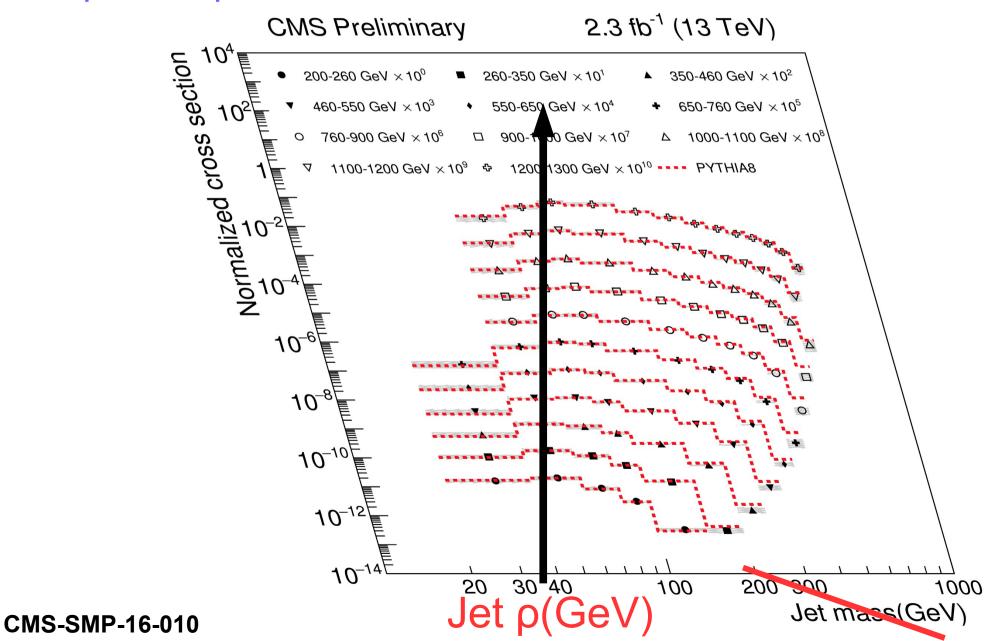


Evolution of Mass Peak

Clear trend in observed mass

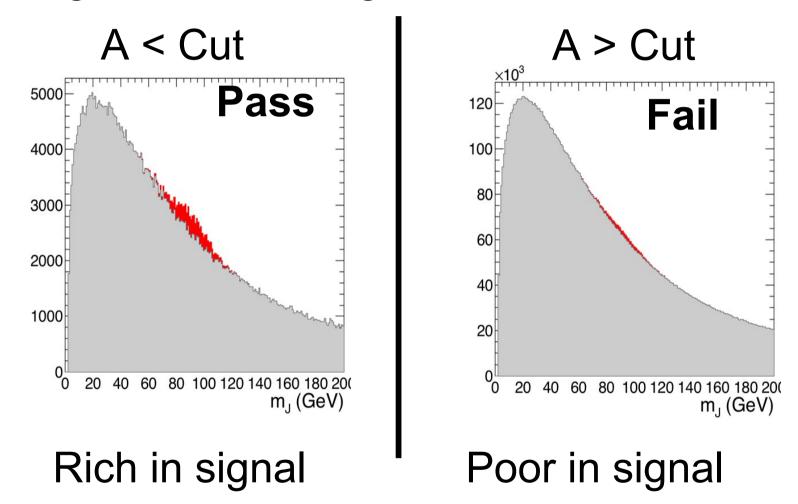


Use QCD to got to modifie Volution of Mass Peak Jet phase space



One last ingredient

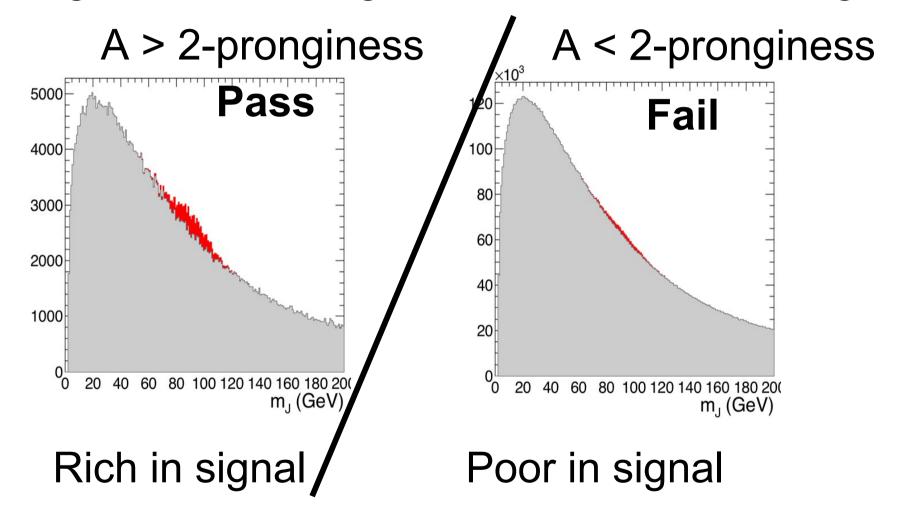
Cutting on a variable gives us another advantage



We get two regions that we can study

One last ingredient

Cutting on a variable gives us another advantage

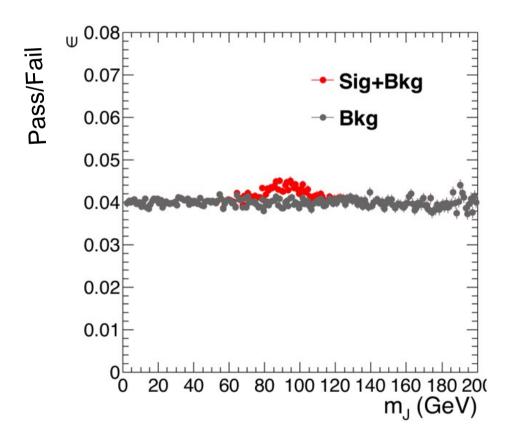


We can merge these regions into one

Pass/Fail Ratio

Combination of the two yield a single distribution

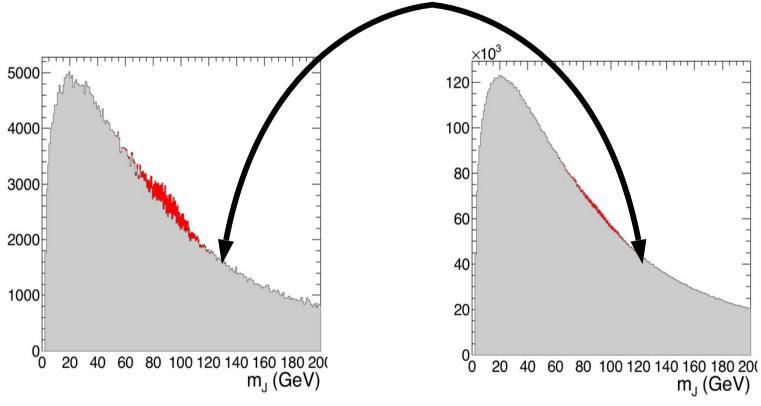
Pass/Fail



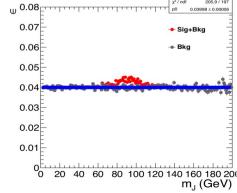
This gives us a new combined region

How do you fit the ratio

Fit both distributions at the same time

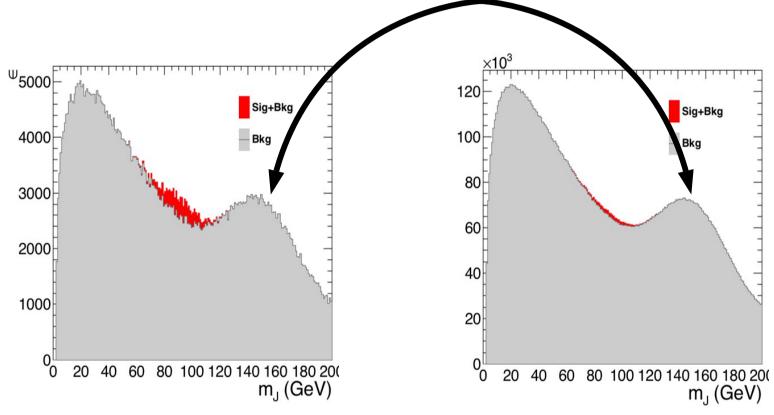


Tie bin in passing to bin in failing $Bin_{Pass}^{i} = \epsilon Bin_{Fail}^{i}$

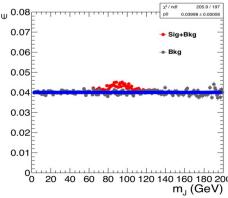


How do you fit the ratio

Fit both distributions at the same time

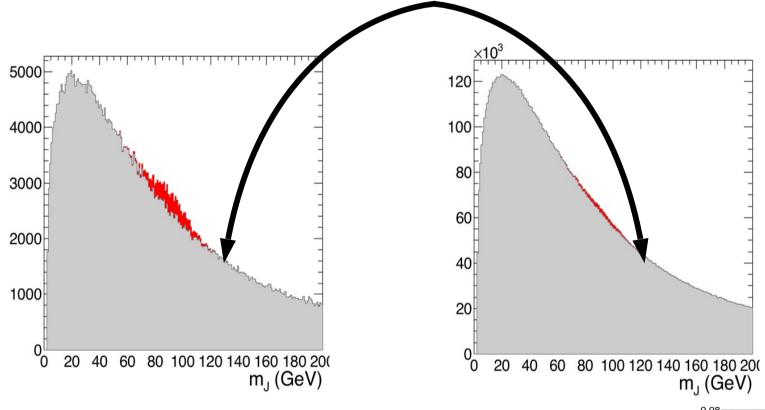


If one bin moves up the other moves up Even for weird shapes we fit a flat eff $Bin_{Pass}^{i} = \epsilon Bin_{Fail}^{i}$

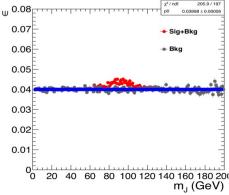


Forcing the ratio flat

With a large MC sample we can make this flaot

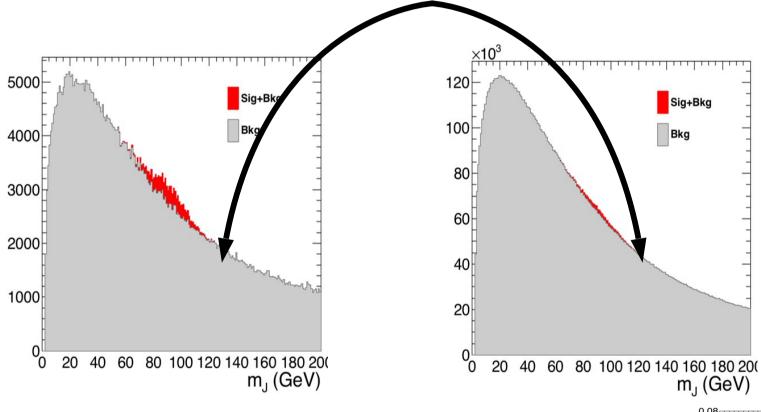


Can construct a substructure observable to have a flat efficiency over mass

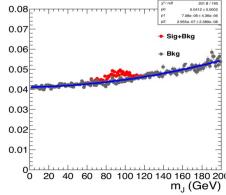


In data

We can tune the efficiency to be flat in MC



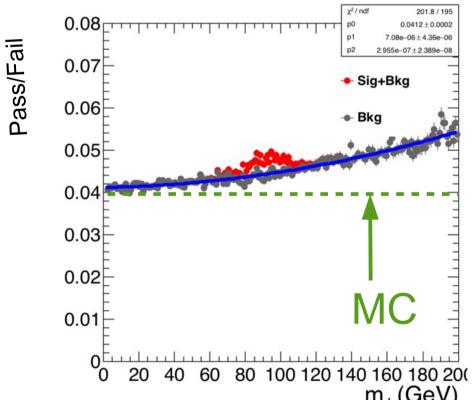
However in data it might not be flat We can fit for this deviation over mass



Pass/Fail Ratio

Parametrize data/MC deviations with function

Pass/Fail

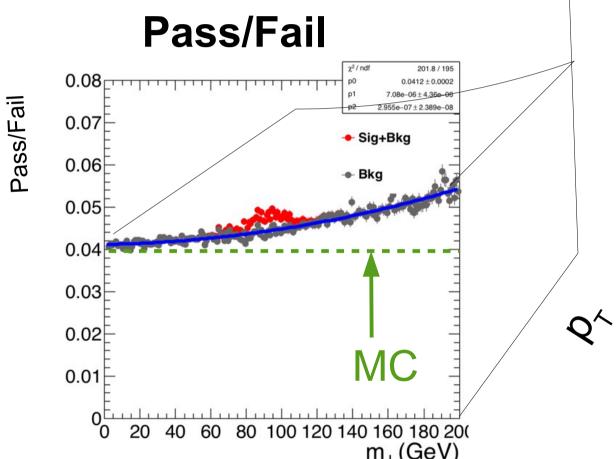


Parametrize efficiency by a surface in ρ and p_T

$$N_{pass}^{QCD}(m_{SD}, p_T) = R_{p/f}(\rho, p_T) \times N_{fail}^{QCD}(m_{SD}, p_T)$$

Pass/Fail Ratio

Perform fit in 3 dimensional fit against p_⊤

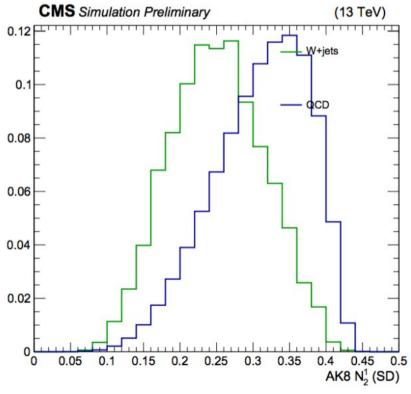


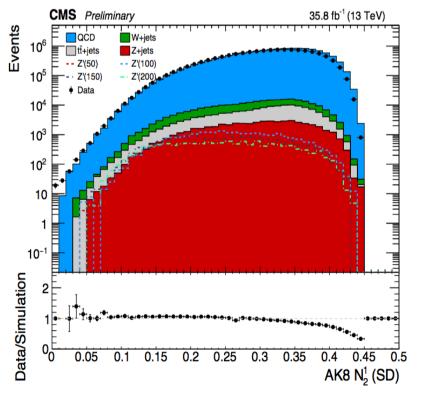
Final fit is a full 3D fit of efficiency ρ vs ρ_T $N_{\rm pass}^{\rm QCD}(m_{\rm SD},p_{\rm T})=R_{\rm p/f}(\rho,p_{\rm T})\times N_{\rm fail}^{\rm QCD}(m_{\rm SD},p_{\rm T})$

New Substructure Observables

$$N_2(eta) = rac{2e_3^eta}{(e_2^eta)^2} egin{array}{c} {}_{1}e_2^eta = e_2^eta = \sum\limits_{1 \leq i < j \leq n_j} z_i z_j \Delta R_{ij}^eta & z_i \equiv rac{p_{Ti}}{\sum_{j \in ext{jet}} p_{Tj}} \ {}_{2}e_3^eta = \sum\limits_{1 \leq i < j < k \leq n_j} z_i z_j z_k \min\{\Delta R_{ij}^eta \Delta R_{ik}^eta, \Delta R_{ik}^eta \Delta R_{jk}^eta, \Delta R_{ik}^eta \Delta R_{jk}^eta\} \end{array}$$

Using AK8 PUPPI jets

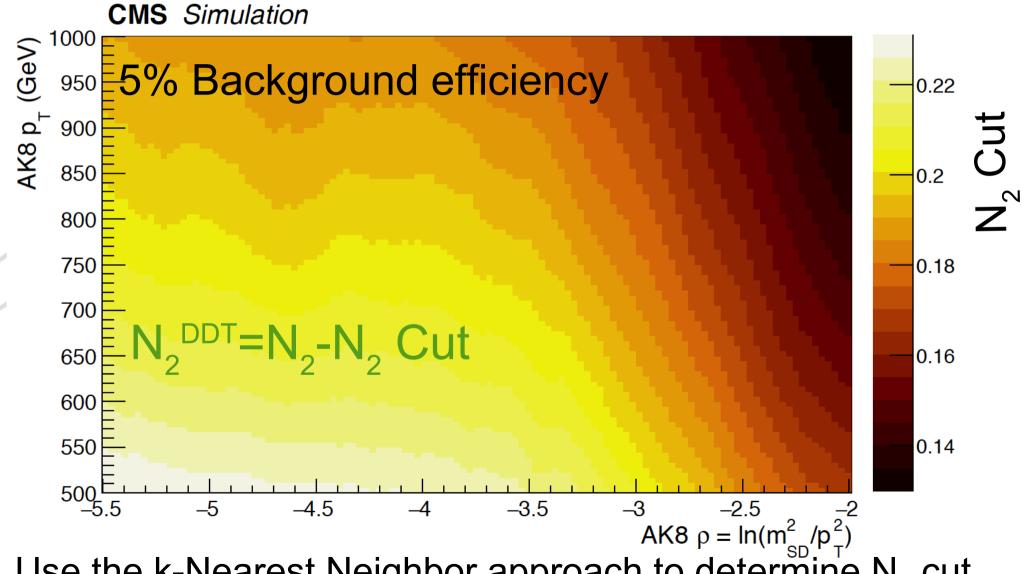




We use N₂ to see the W peak

Arxiv/1609.07483

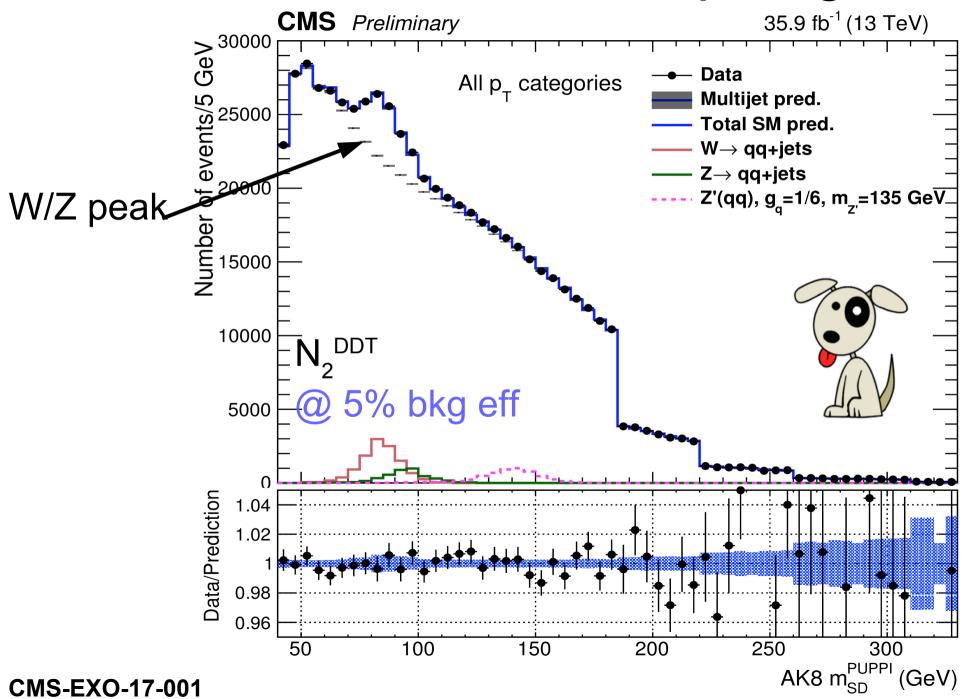
Modifty N₂ to have a <u>flat bkg efficiency</u>



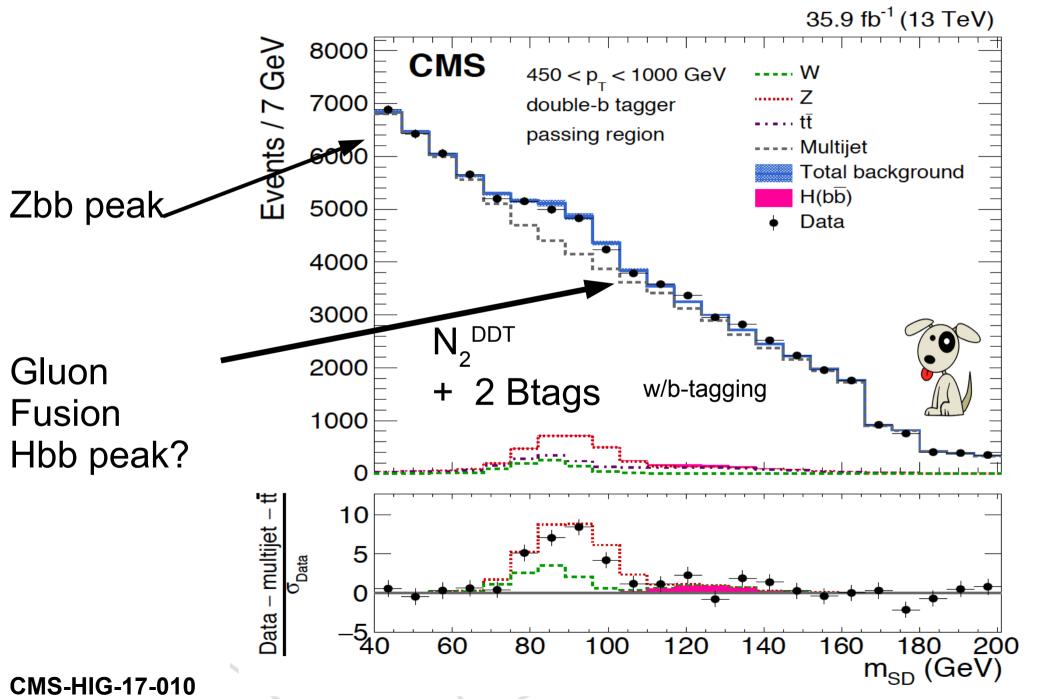
Use the k-Nearest Neighbor approach to determine N₂ cut

EXO-17-001

Two pronged Jets

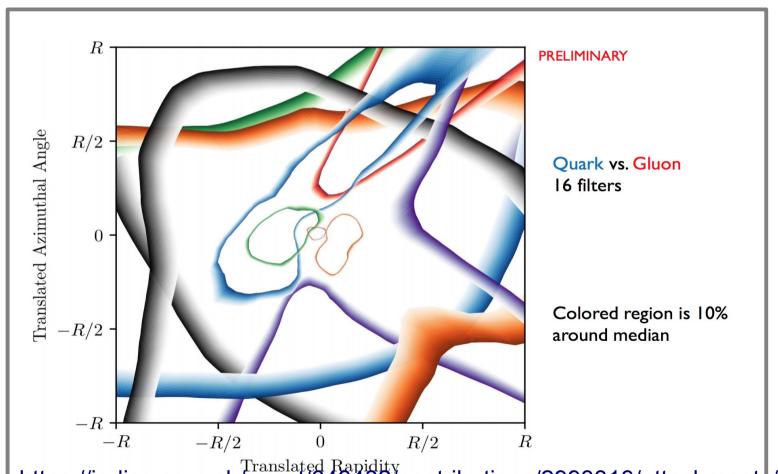


Two pronged Jets+2 b-tags



Follow up

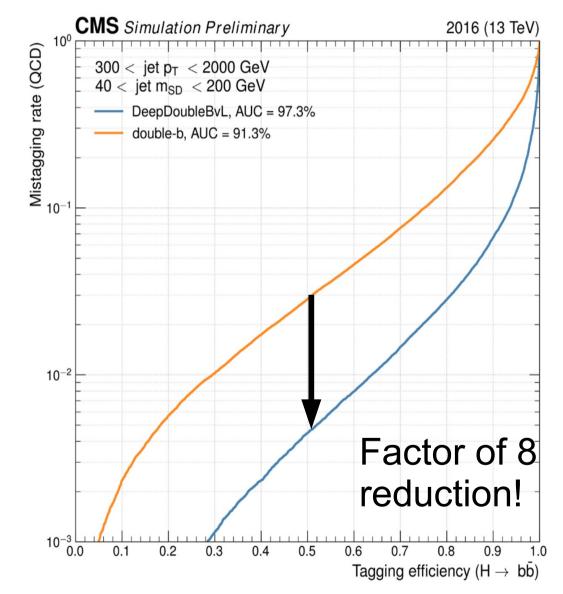
- Where can you improve the analysis?
 - In pp, people are going full deep learning



https://indico.cern.ch/event/649482/contributions/2993313/attachments/1689067/2717141/PTK_B

P. Komiskie, E. Metodiev, J. Thaler Boost 2018 (last week!)

What are the prospects?



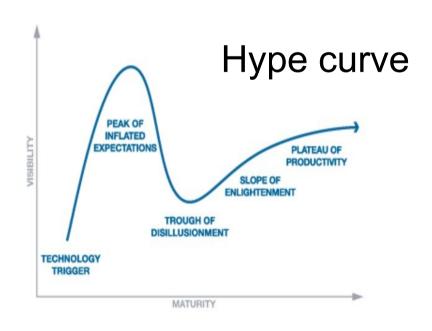
Machine learning algo:
All the particles in a jet
(PF candidates in CMS
+2nd ary vertices)

LSTM on all particles Train for Higgs boson

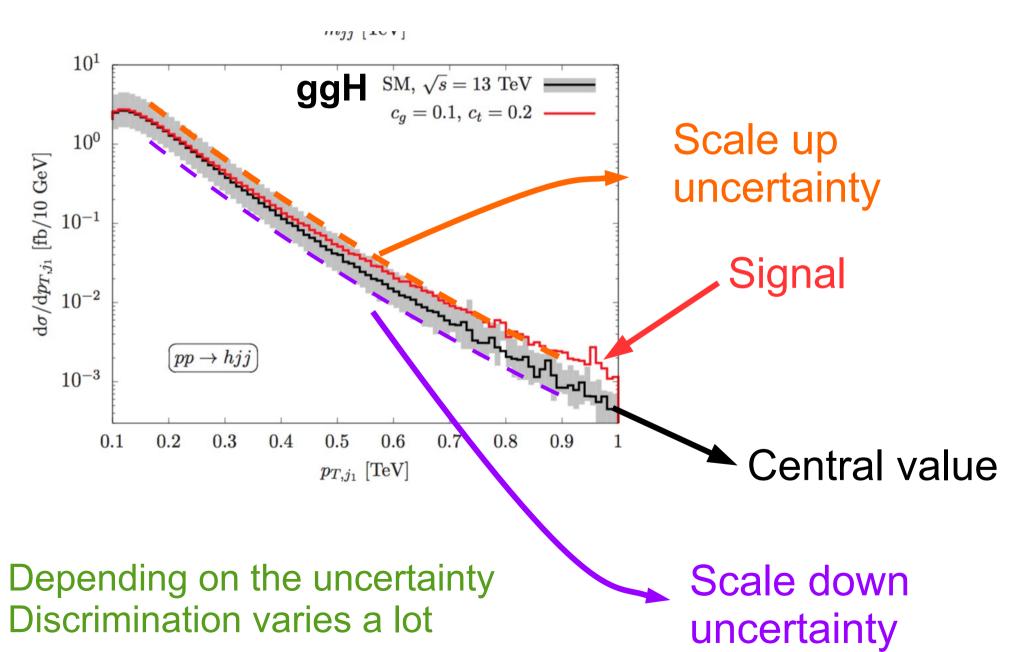
Impacts of ML can be very substantial

Towards a Realistic use of ML in jets

- Despite the big excitement about ML
 - People are hesitant to use these
 - Simply because its not clear where we are going
 - Universal thing: is that all ML algos give ~same gain
- In lieu of this....
 - Focus has been on physics
 - How can we restrict MLs
 - Avoid unphyscial gains
 - Ensure physics is preserved
 - Use our bkg methods

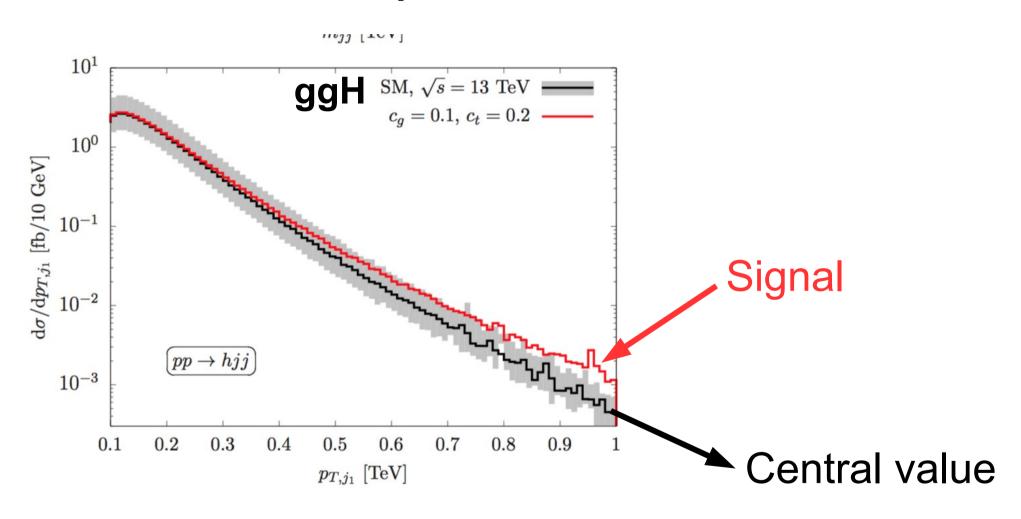


Importance of Adversaries



Arxiv/today!

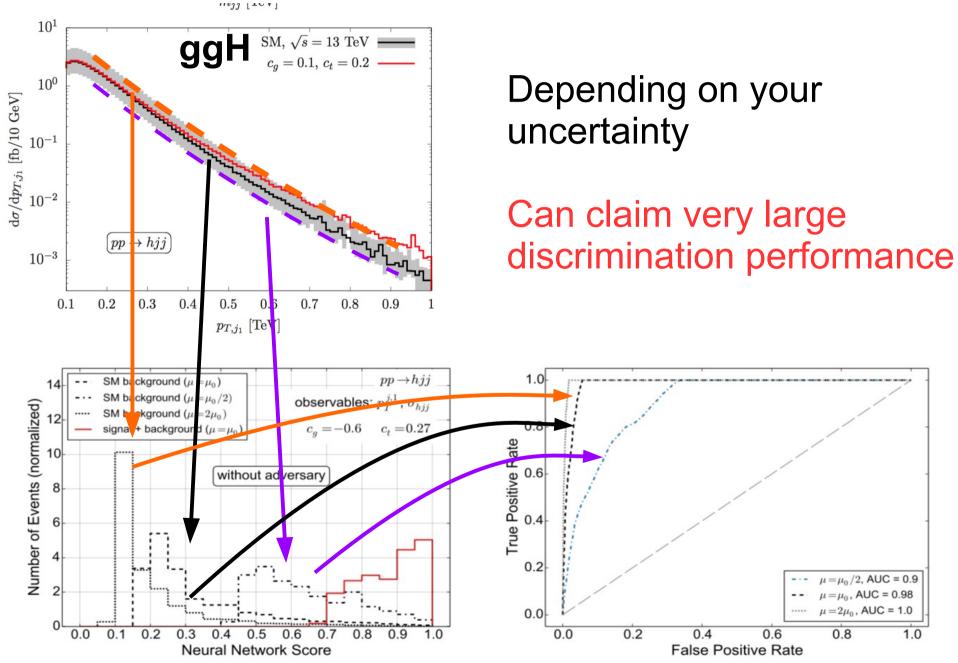
Importance of Adversaries



Depending on the uncertainty Discrimination varies a lot

Arxiv/today!

Impact on discrimination

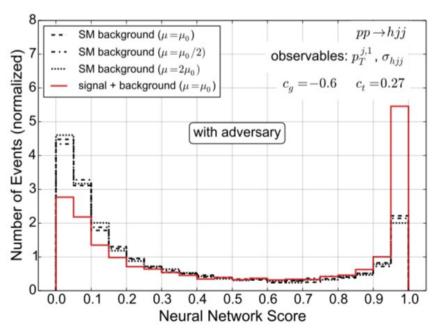


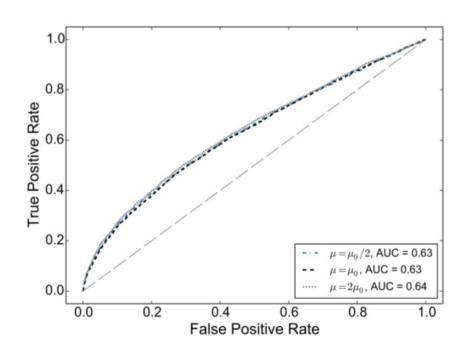
Arxiv/today

Impact on discrimination

Through the use of adversarial neural networks

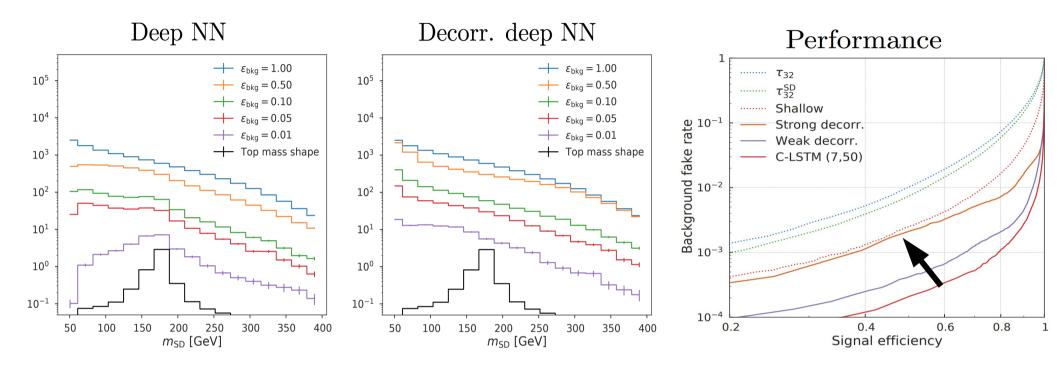
Can implicitly build in uncertainties
This allows for directed measurements
Preserve ability to account high dimensional inputs





Arxiv/today

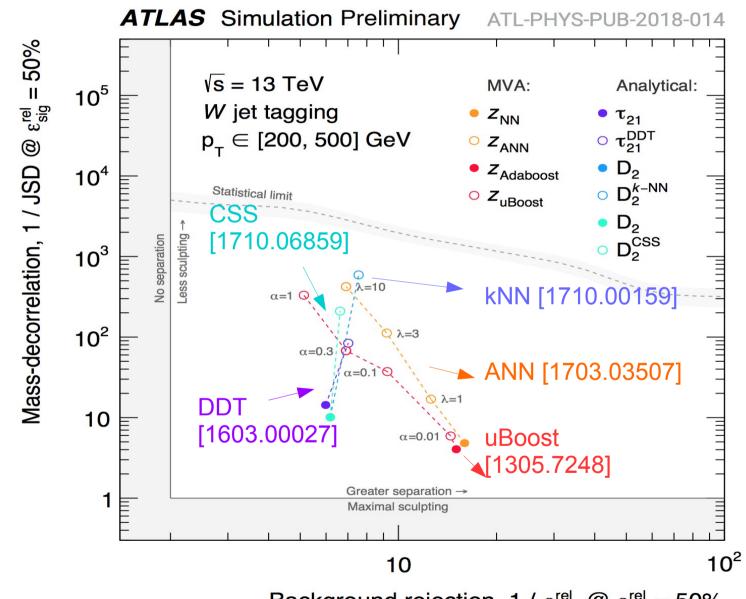
In the context of Jets decorrelation



Following the paradigm of V+jets search
We build a giant NN (> 100 particles inputs)
Decorrelate NN against mass
Scale of decorrlation drives perf.

S. Narayanyan

Scanning the decorrelation schemes

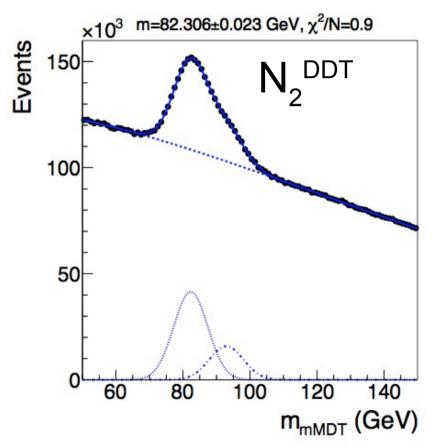


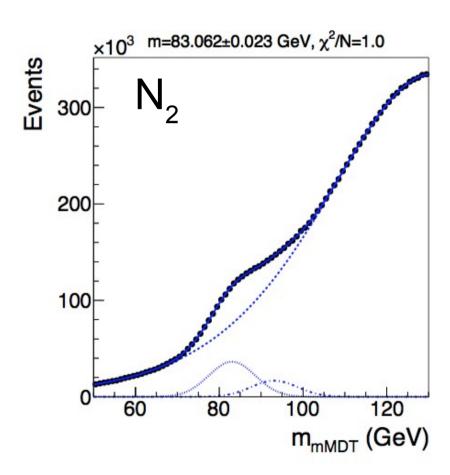
Background rejection, 1 / ϵ_{bkg}^{rel} @ ϵ_{sig}^{rel} = 50% Decorrelation of mass seen to be important for new taggers

A. Sogaard (Boost 2018)

Can we do a fundamental meas.?

Would it be possible to apply this to W mass?

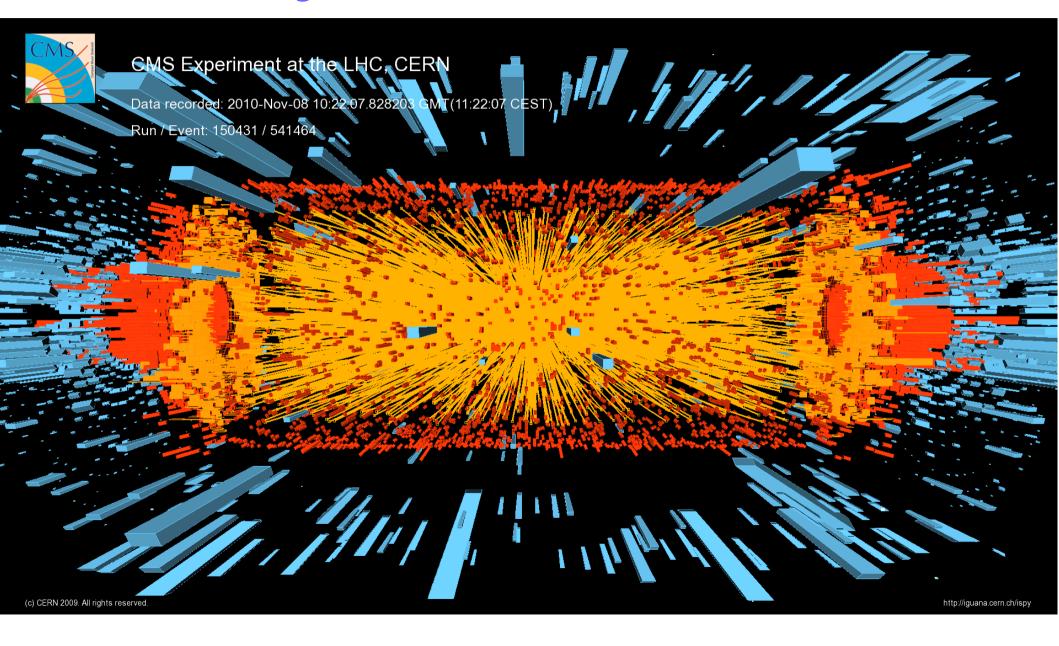




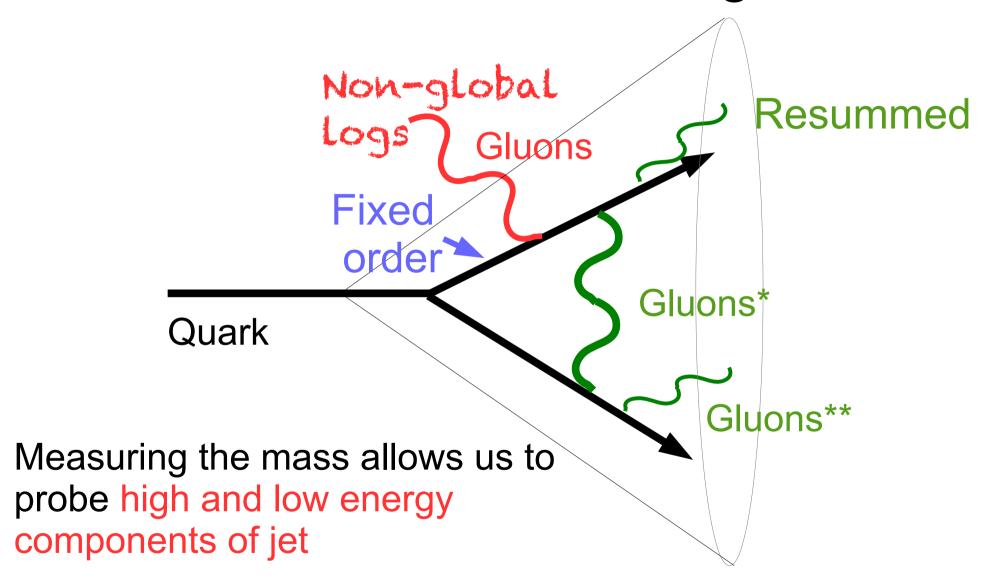
With 3/ab and $p_{\scriptscriptstyle T} > 500$ GeV

have a statistical precision of 23 MeV and systematics?

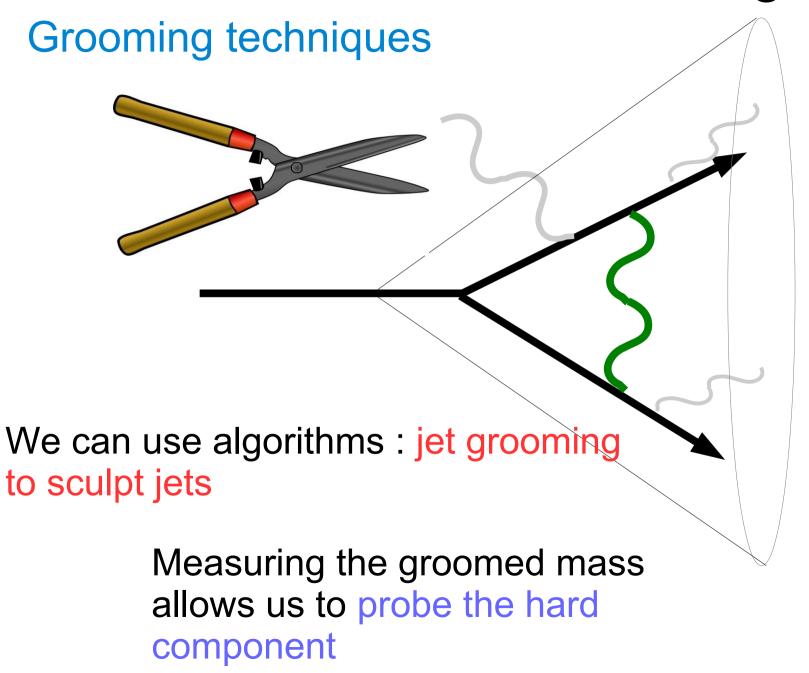
Arxiv/1807.07454 (last week)

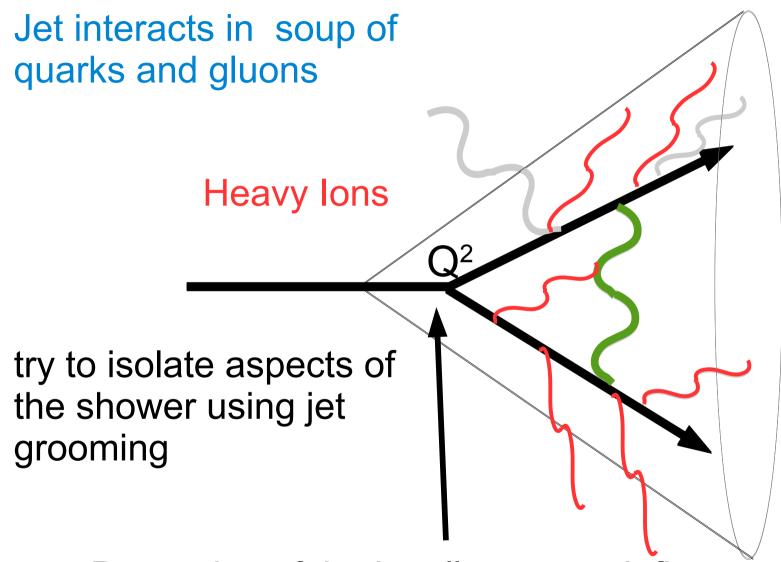


Visualizing Jet Mass

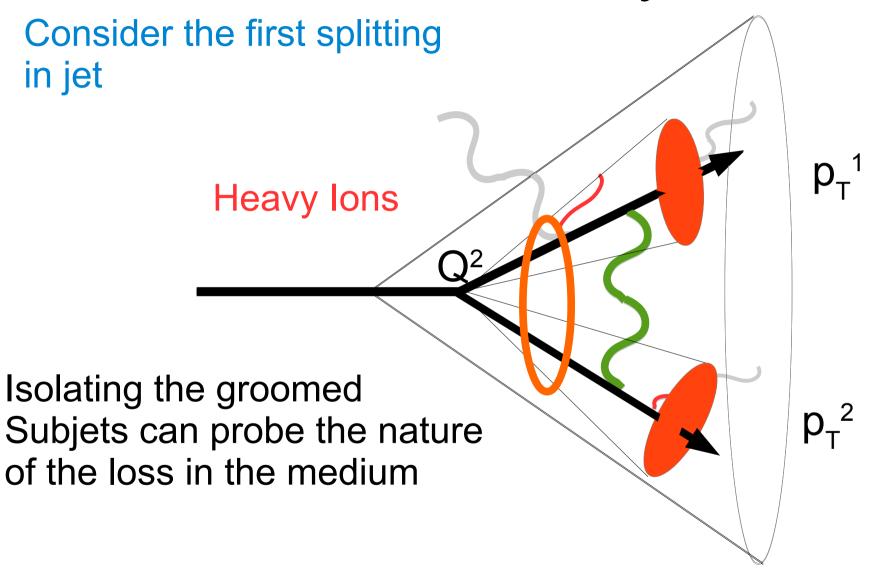


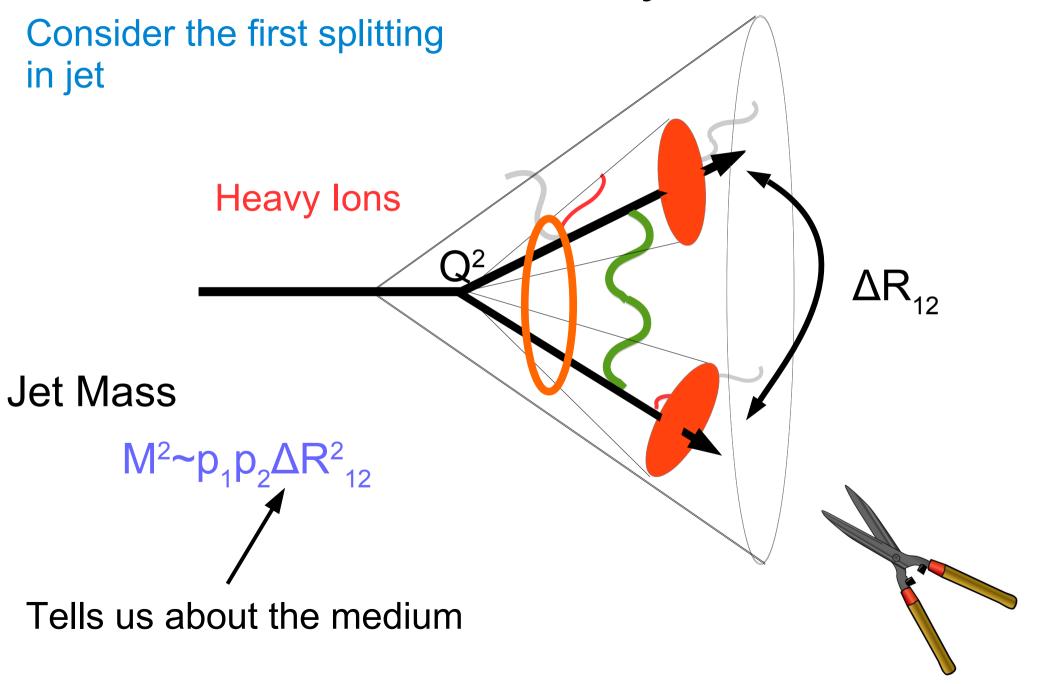
Grooming Jet Mass

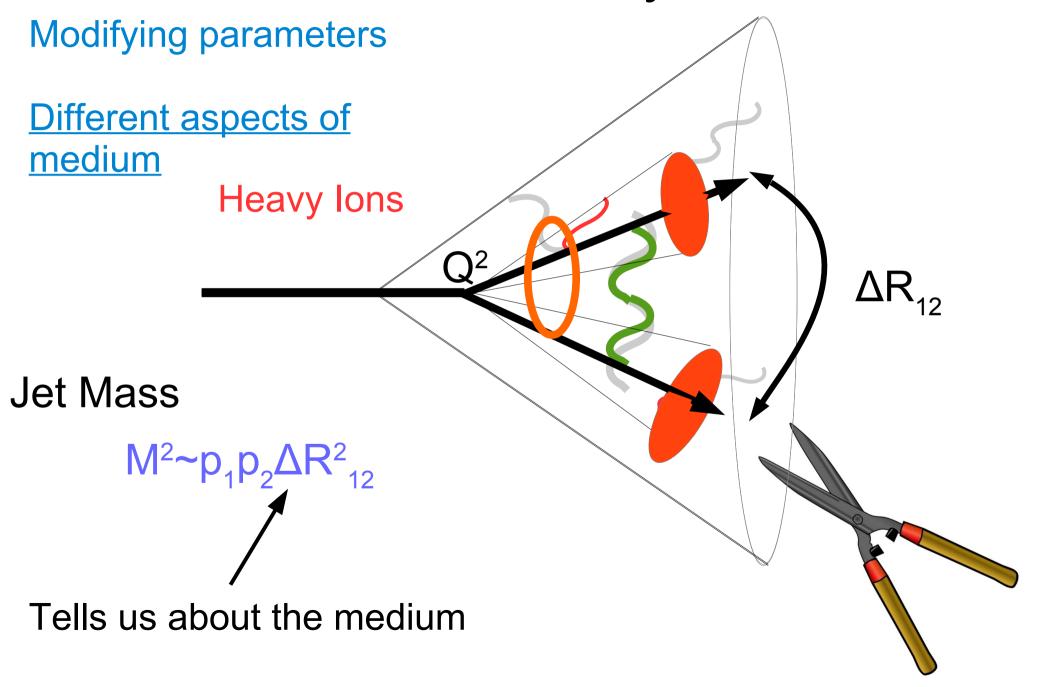




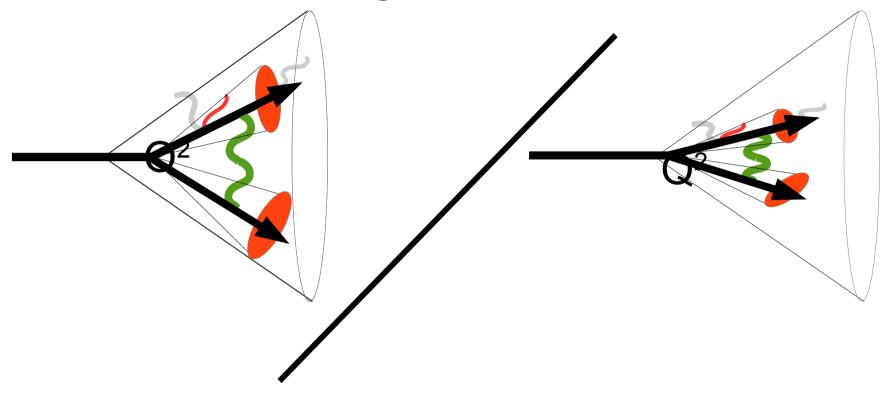
Properties of the jet allow us to define Medium modifications







Performing Measurements in HI



Many ideas to decorrelate jets against observables

Decorrelation allows for data based ratios

Allows us to be sensitive to small features

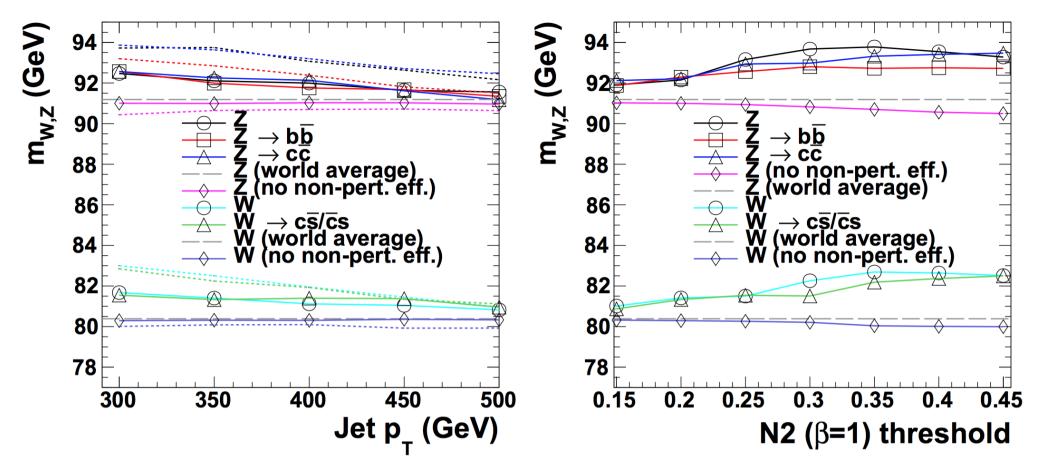
Summary

- The act of substructure is a tool that we can use
 - Allows us to sculpt jets to isolate specific physics

- For recent hadronic resonances
 - Constructed decorrelated observables agains m_{sp} p_T
 - With ML we can decorrelate in higher dimensions
 - This can allow us to take care of systematics
 - Can lead to improved discrimination + decorrelation
- Extending beyond that....
 - Can we use decorrelation schemes to enhance HI?

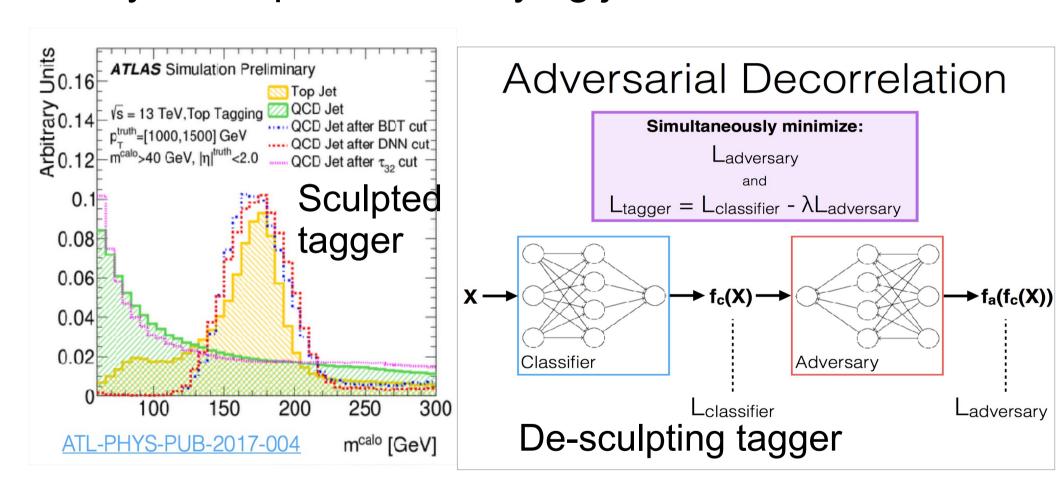


Thanks!



New Directions

Key concept was modifying jet substructure

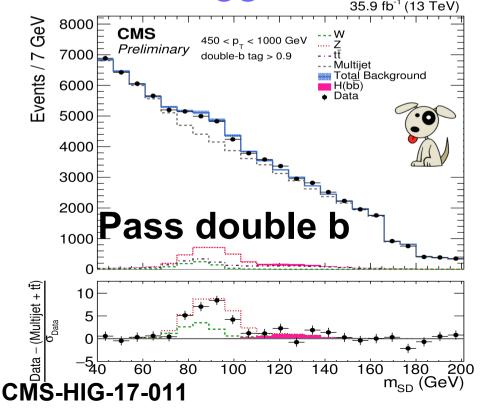


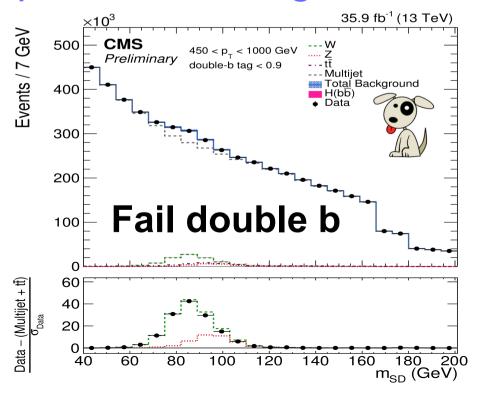
New approaches w/deep learning can decorrelate observables

Ingredients to see Higgs

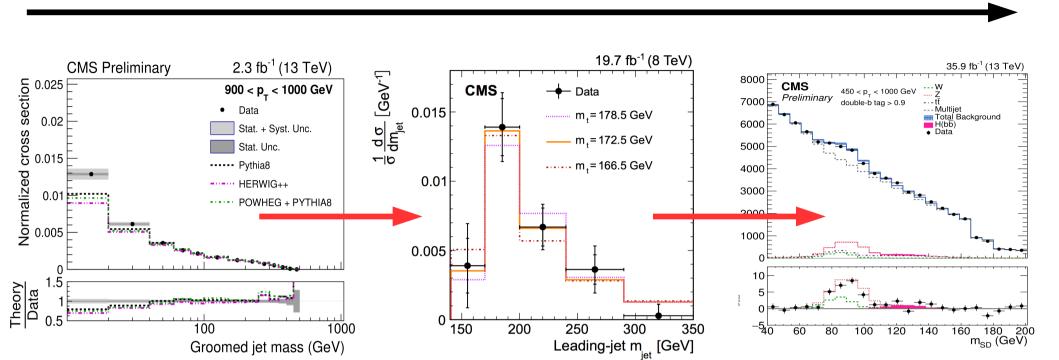
- Select a jet p_T > 450 GeV (single massive jet trigger)
- Require the jet to pass a 2 prong tag
- Require jet to be double b-tagged

Select tagger & take both pass and failing selection





NP?



Resum.

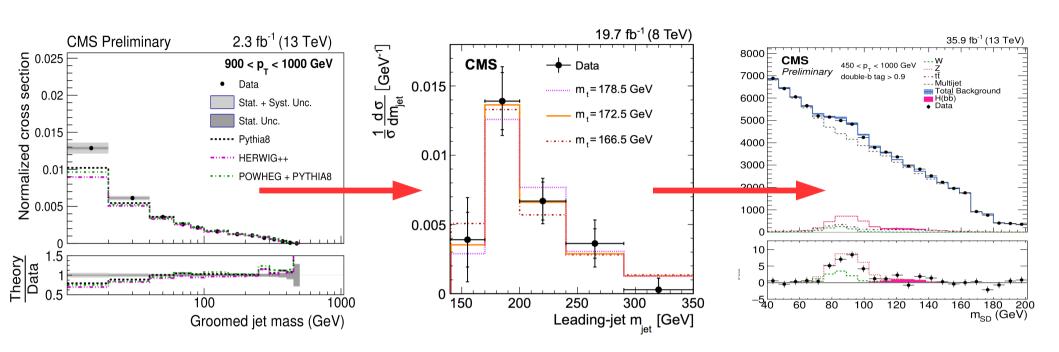
EWK

ME

PDF

QCD meas. probing ever smaller event scale Going smaller build on previous measurements





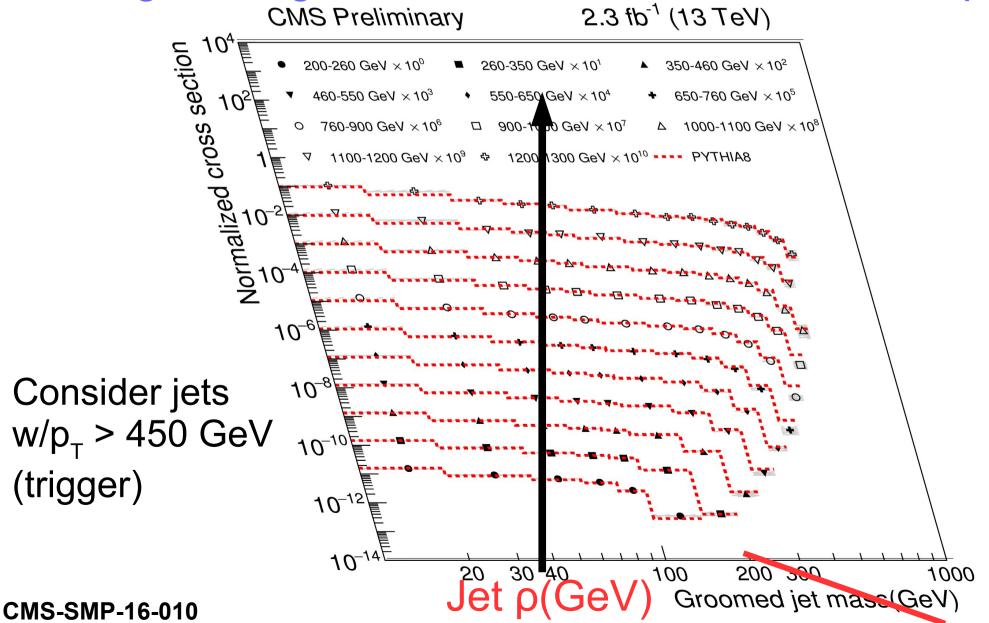
QCD meas. probing ever smaller event scale Going smaller build on previous measurements

A wealth of new and exciting results

Standard model mass measurements
Probing the Quark/Gluon medium
High p_T Higgs

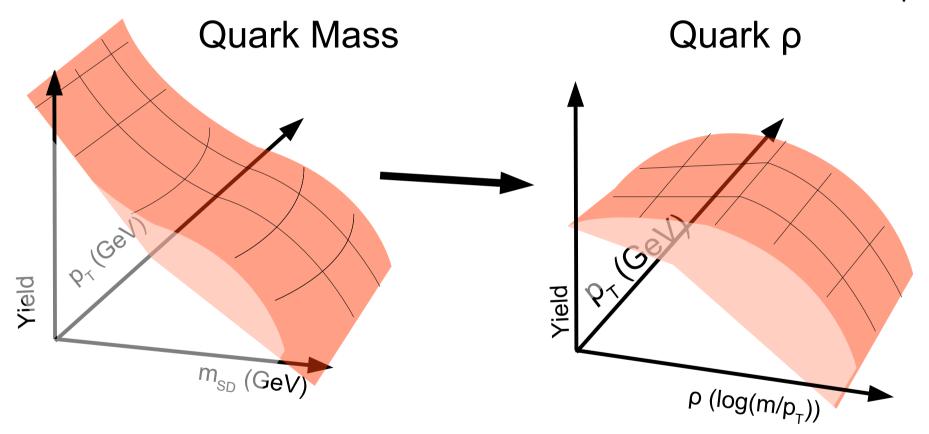
Groomed Evolution

When grooming the mass becomes even flatter in p



Merging with p

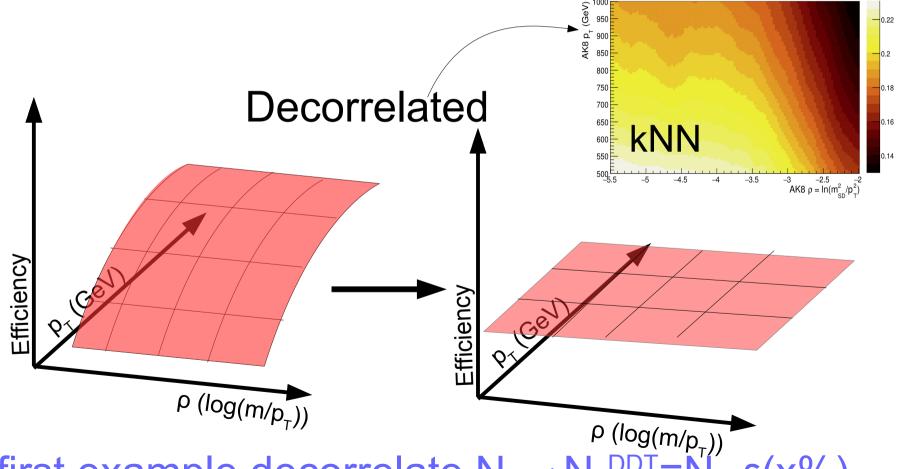
Merging to ρ makes imposes invariance over p_T



When translating to ρ distributions over p_T are also invariant. This allows us to extend our fit from 1D mass to 2D p_T and ρ

Design a transform to decorrelate against mass and $\boldsymbol{p}_{\scriptscriptstyle T}$

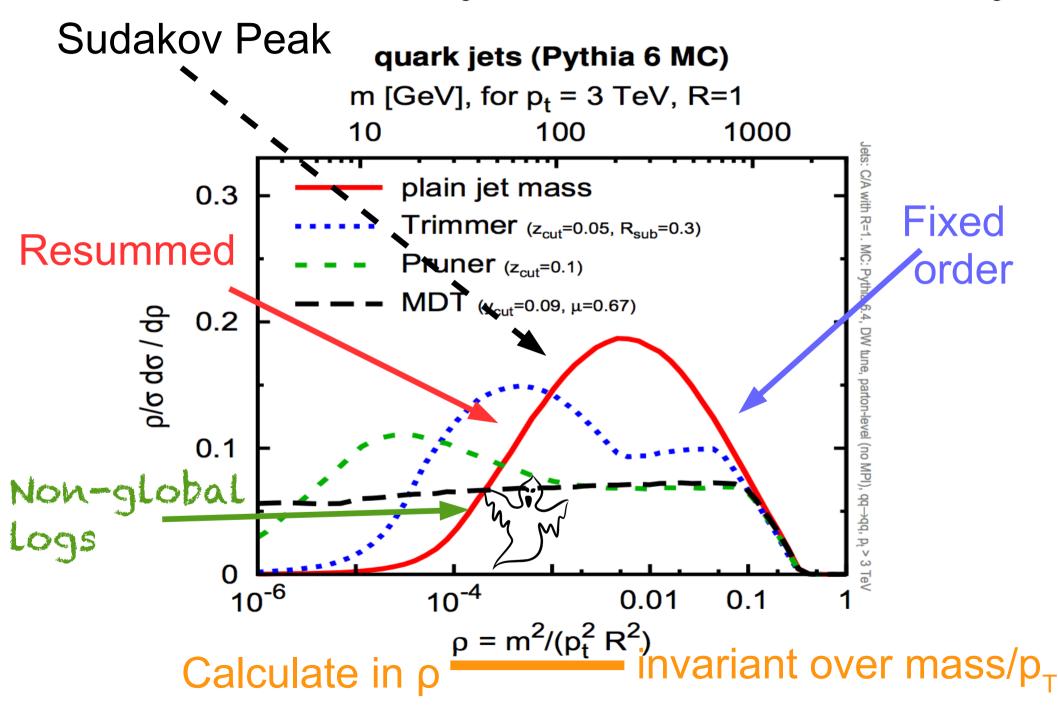
Decorrelating avoid mass sculpting allows us to <u>cut tighter</u>



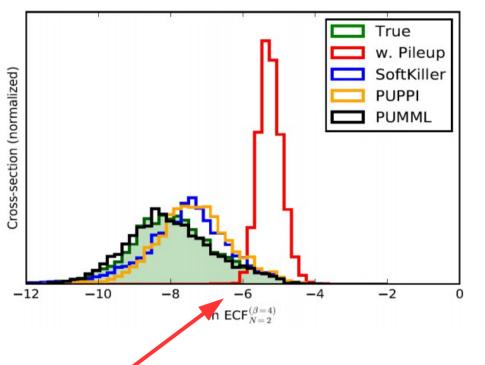
As a first example decorrelate $N_2 \rightarrow N_2^{DDT} = N_2' - \epsilon(x\%)$

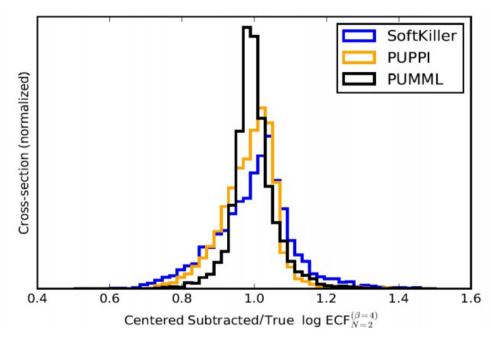
arXiv:1603.00027

Anatomy of Jet Mass: Theory



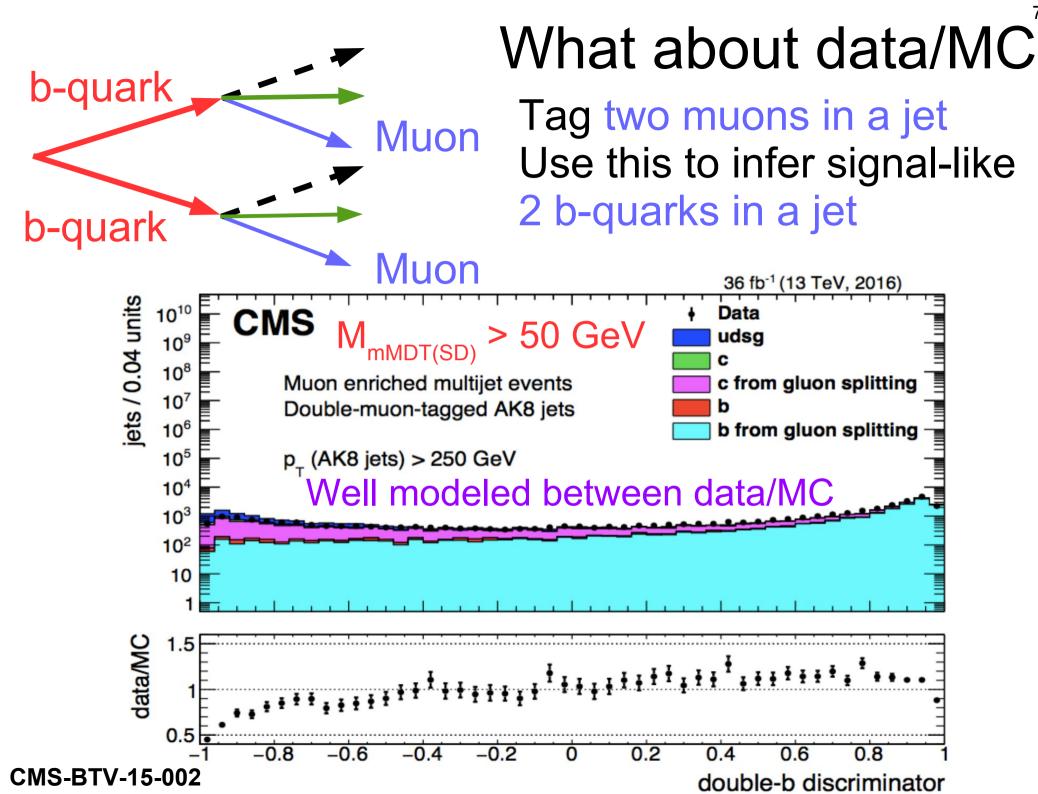
New directions II: PUMML PU mitigation w/Machin Leaning

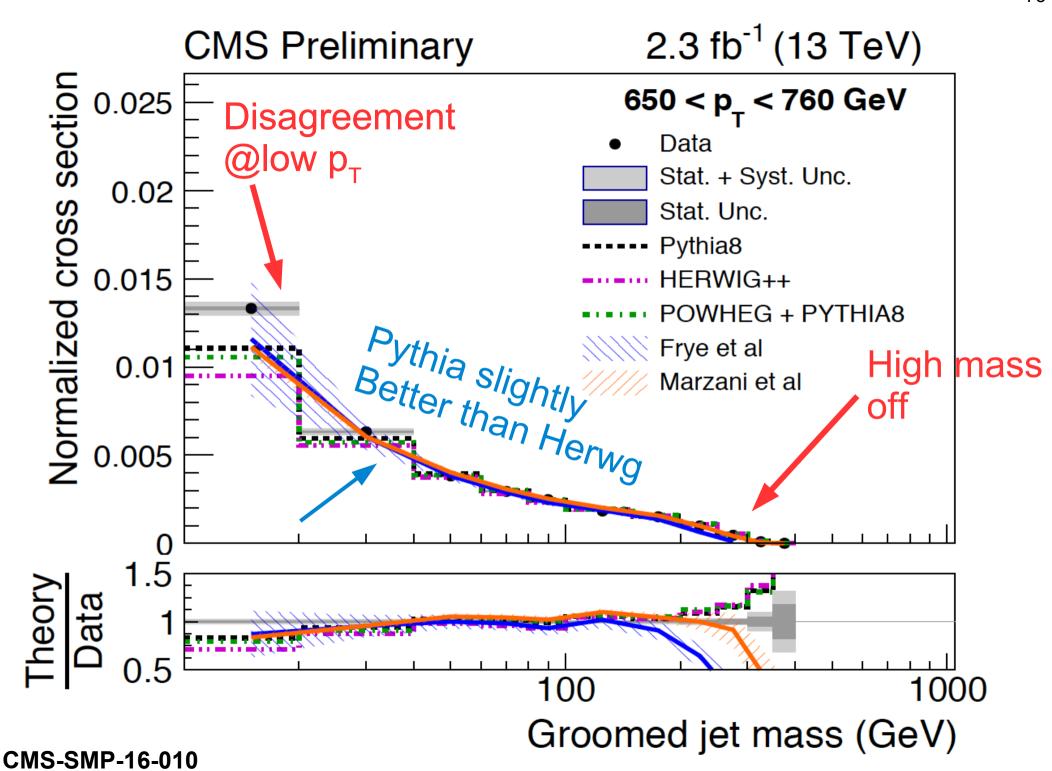






Understanding jets requires resolving jet properties in the dense environment of the LHC (known as pileup)



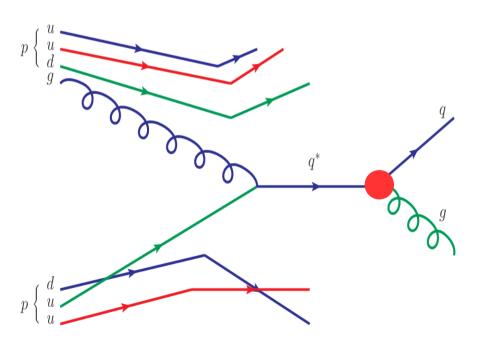


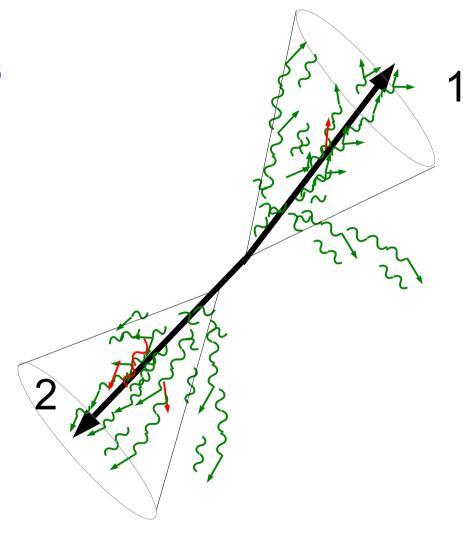
Basic Jet Measurements

In olden days:

Cared about the dijet process

The concern here:
good jet reconstruction to
resolve partons





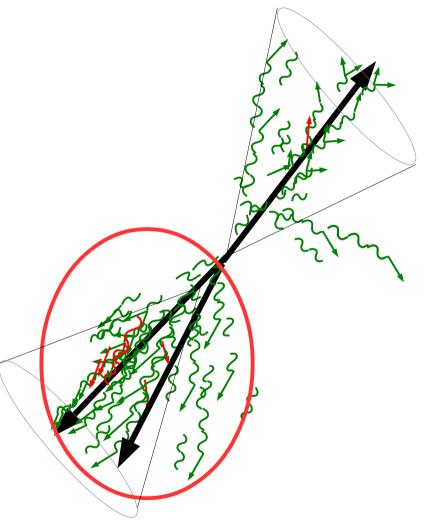
Collinear splittings

Currently:

Care about collinear splittings

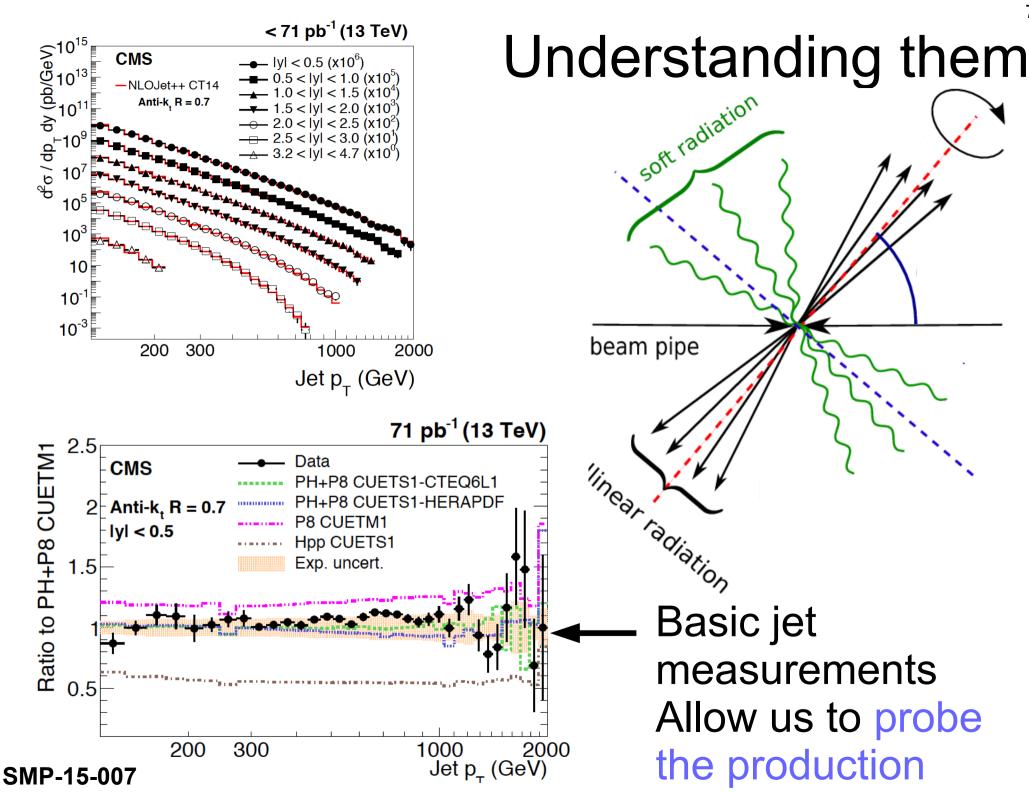
The concern here:

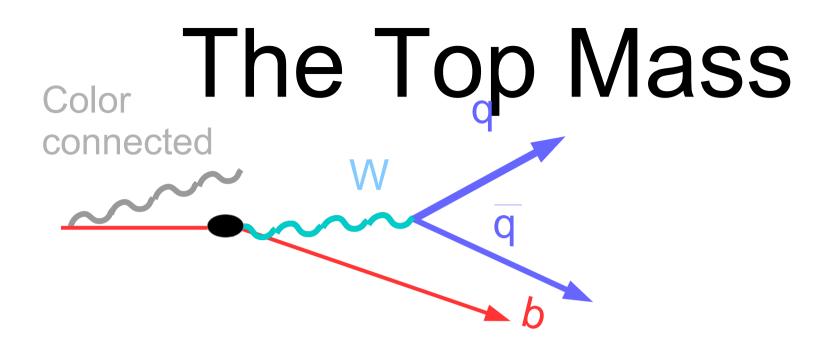
Jet mass is a fundamental test of QCD Also a tool for more?



In the case about the individual process of the jet.

This will be focus of the rest of this talk.

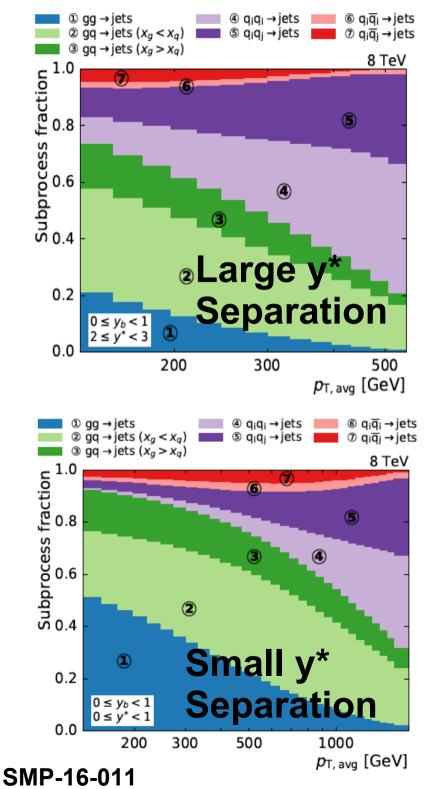




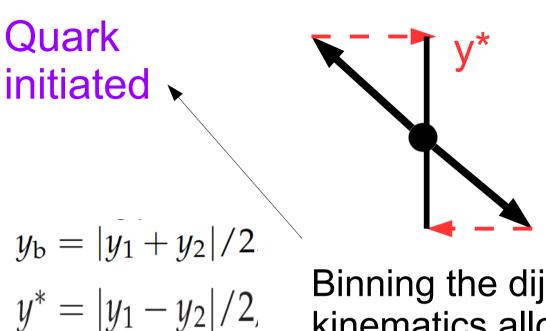
Top decays are a great probe of complicated objects

Complicated object with rich topology

Mass measurement requires understanding them

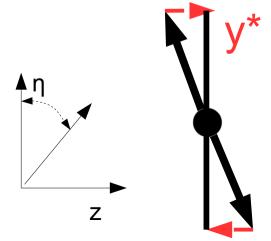


Understanding them



Binning the dijet kinematics allows for constraints on different diagrams

Gluon Initiated

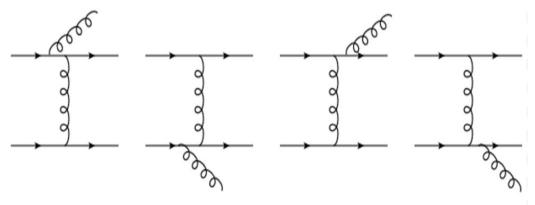


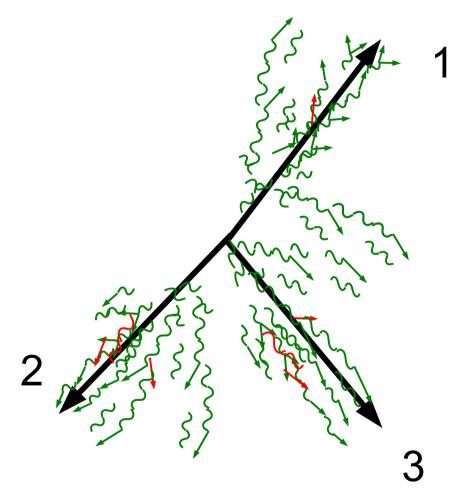
Basic Jet Measurements

In slightly less old days: Cared about 3 jet process

The concern here:

Split out partons by type and study additional QCD properties





3,0000

Now we can probe the 3rd radiated jet: Gives insight into ME splittings

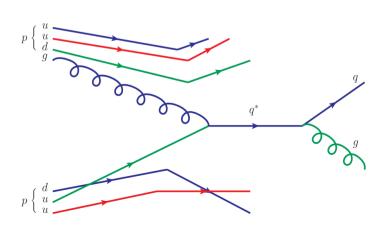
Basic Jet Measurements

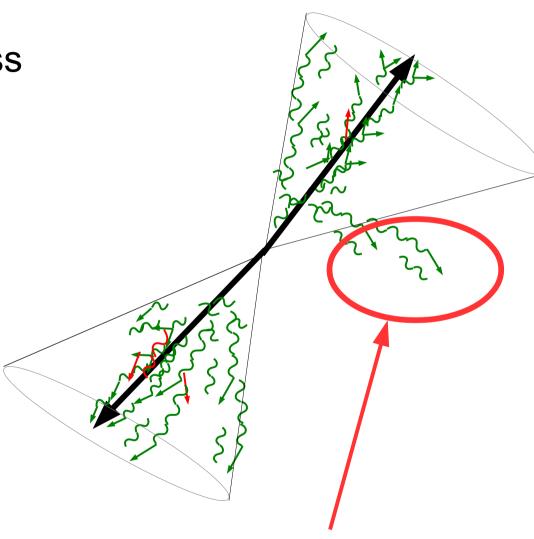
In olden days:

Cared about the dijet process

The concern here:

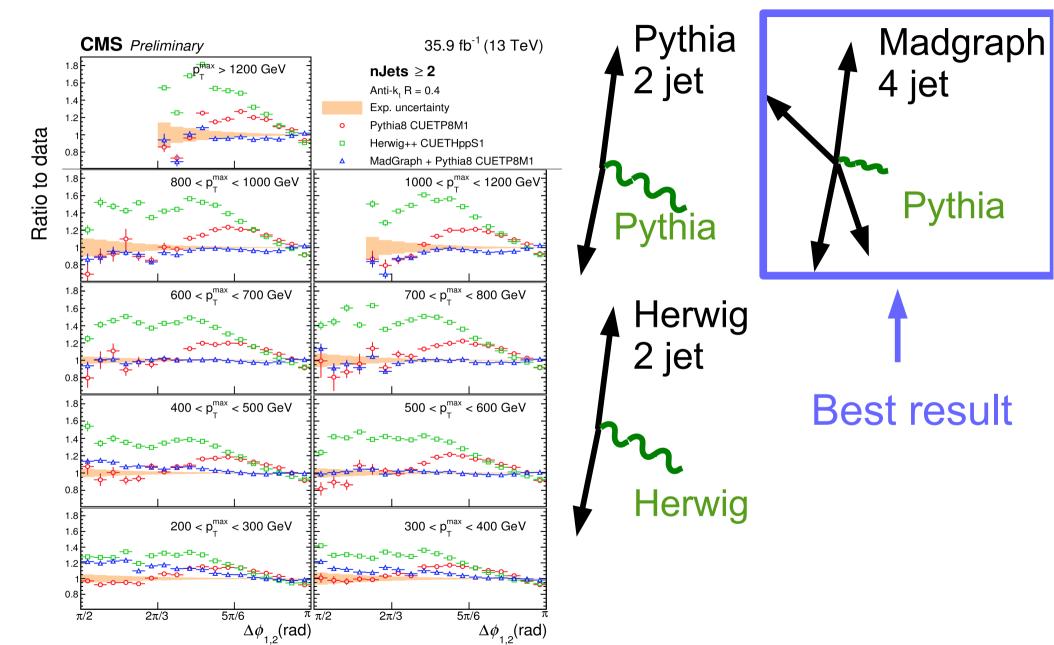
good jet reconstruction to resolve partons



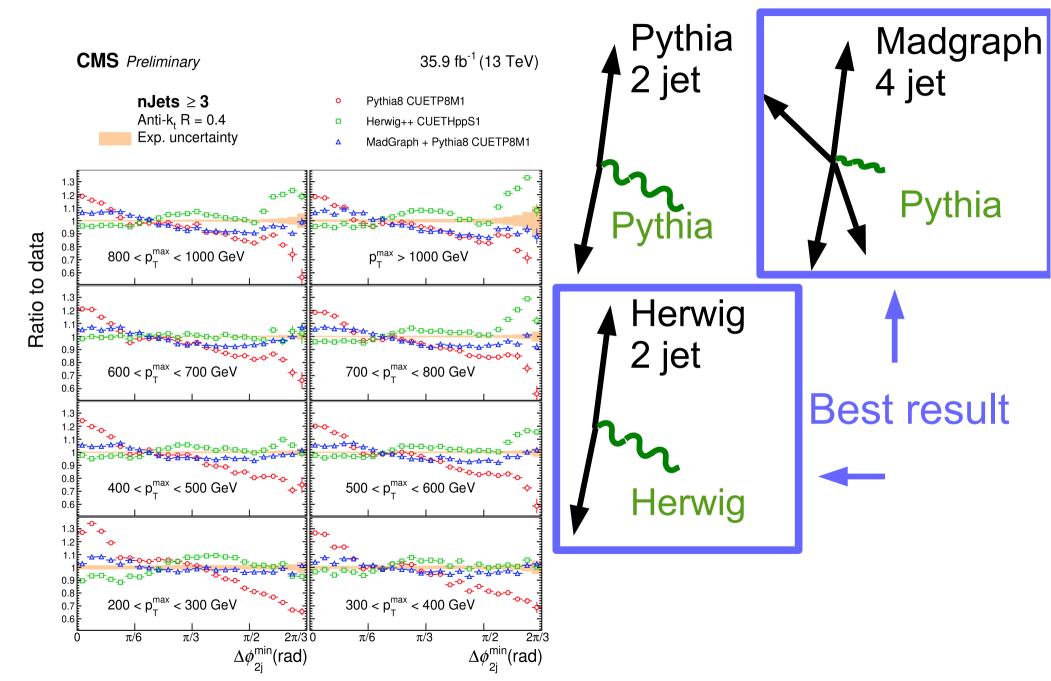


Aim of the game is to capture the full parton

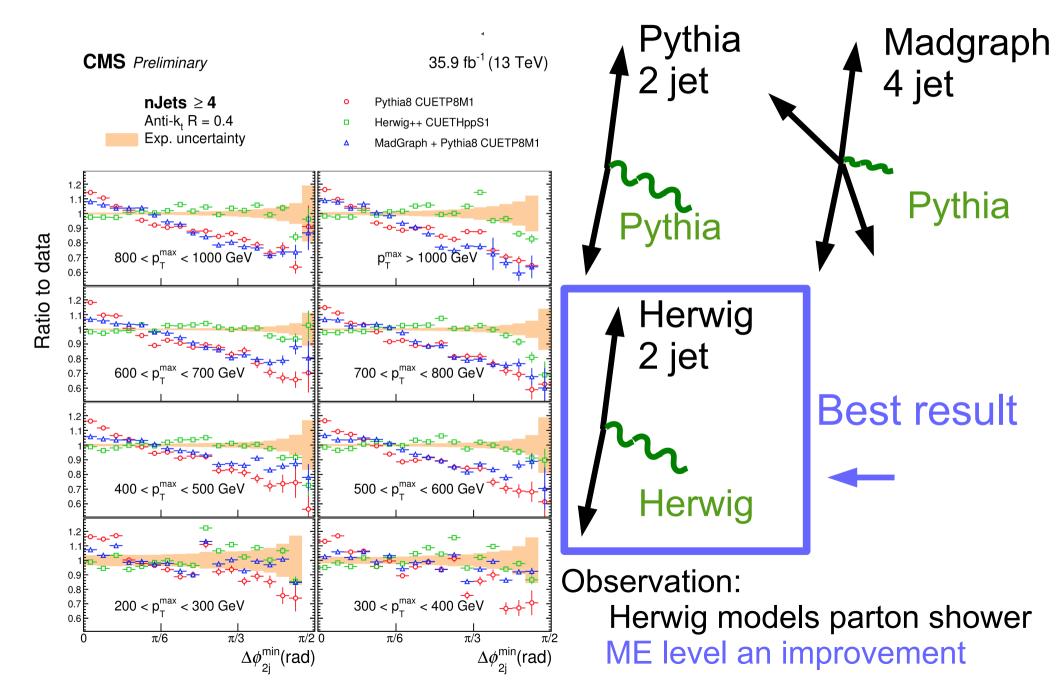
2 Jet Measurement



3 Jet Measurement



4 Jet Measurement



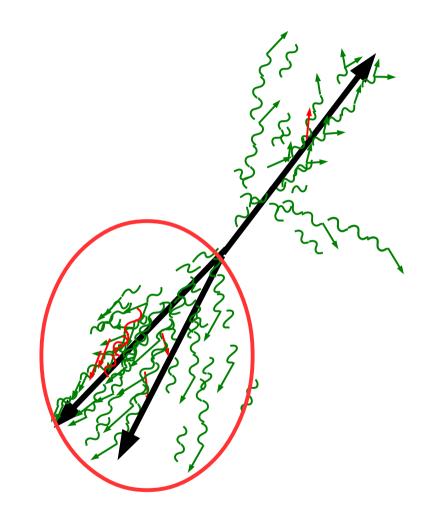
Collinear splittings

Currently:

Care about collinear splittings

The concern here:

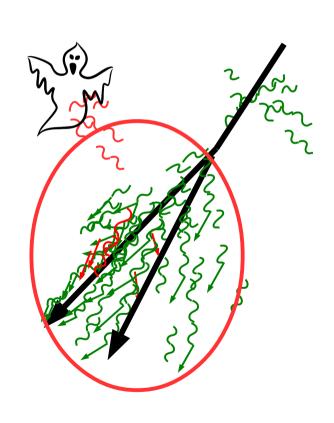
Jet mass is a fundamental test of QCD Also a tool for more?

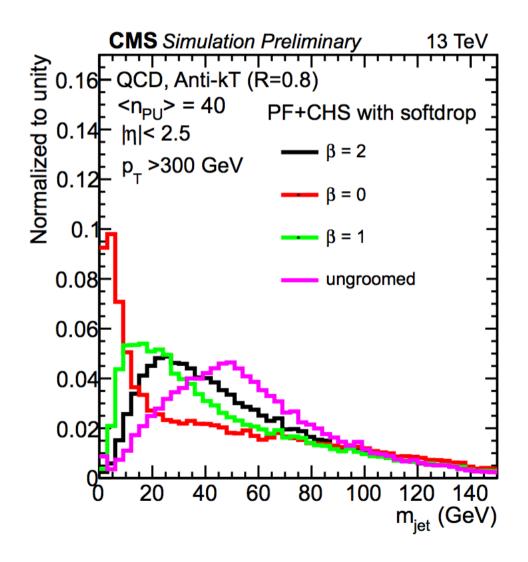


In the case about the individual process of the jet This will be focus of the rest of this talk

Jet Mass Measurement

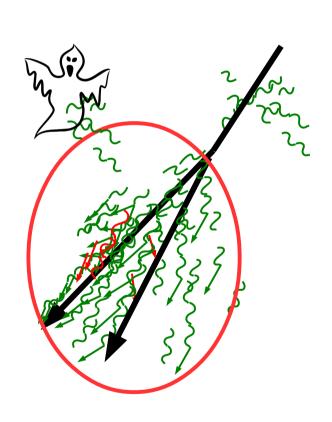
Improving the measurement

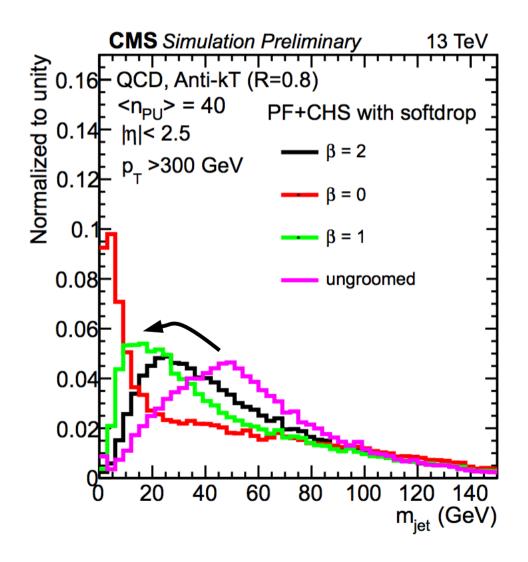




Jet Mass Measurement

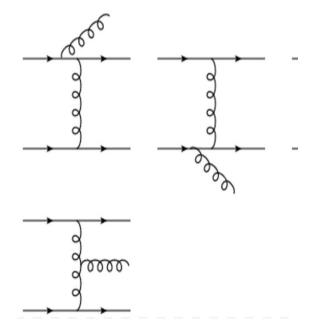
Improving the measurement

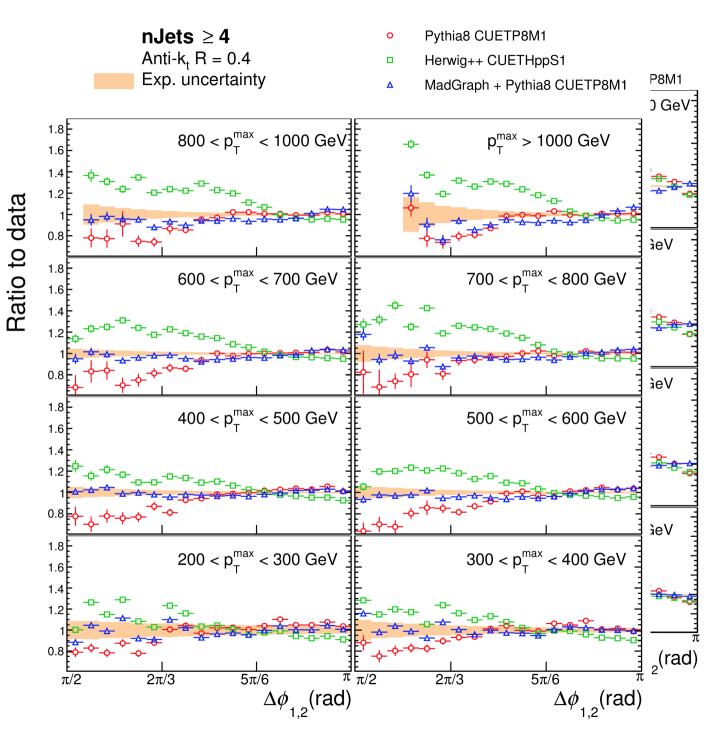




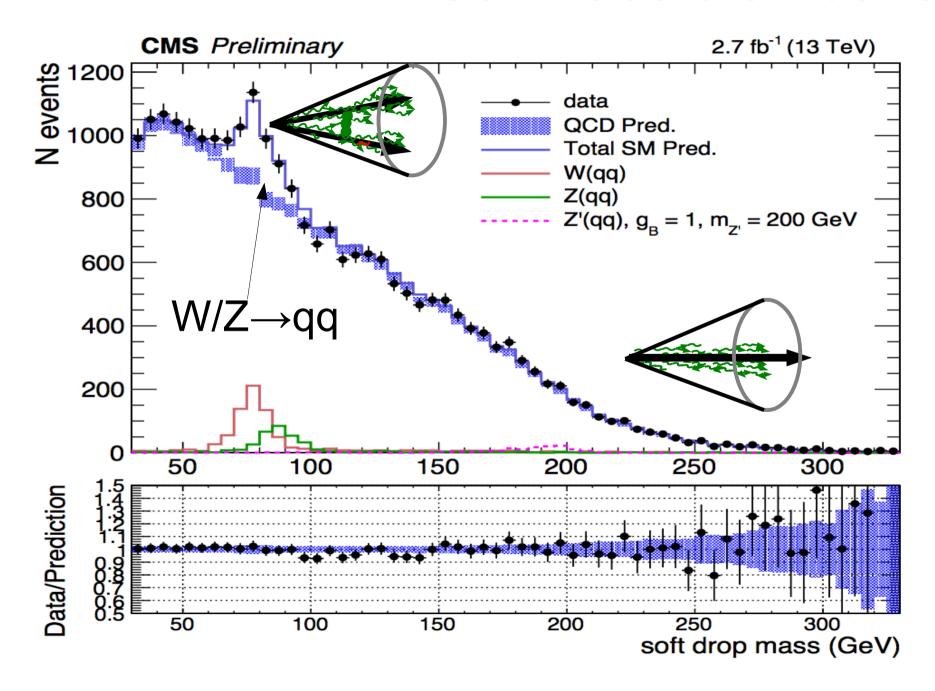
In slightly less old Cared about 3

The concern here Split out parto study addition properties

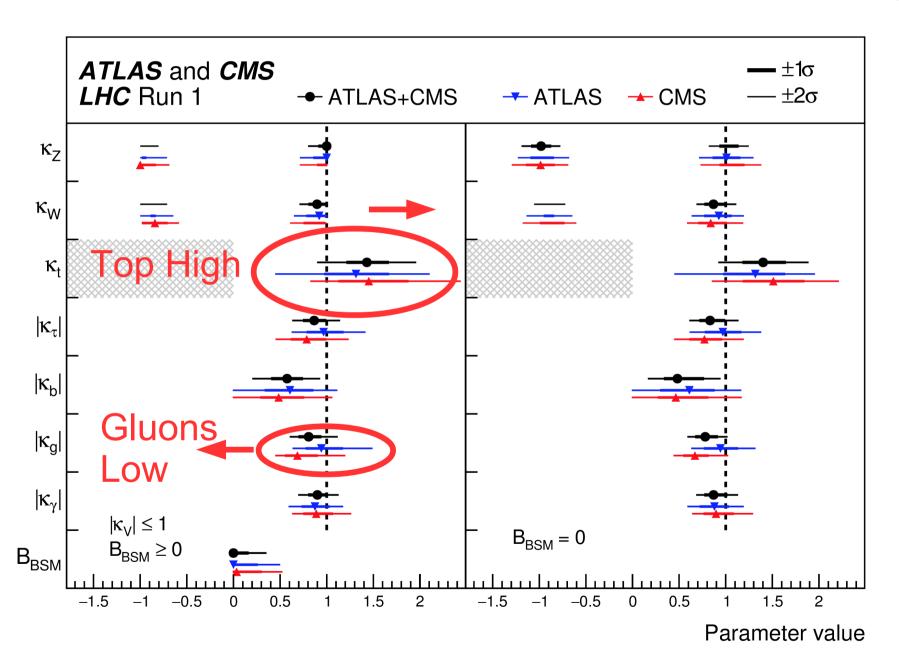




Jet Mass distribution



Hints?

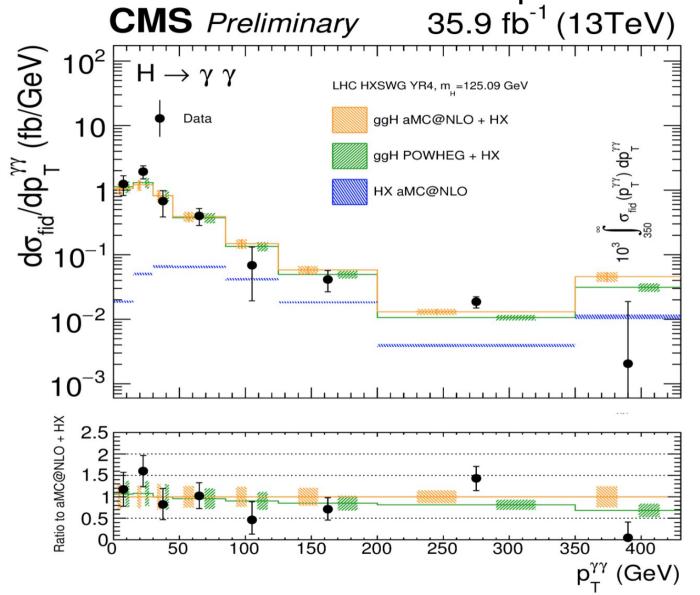


Analysis

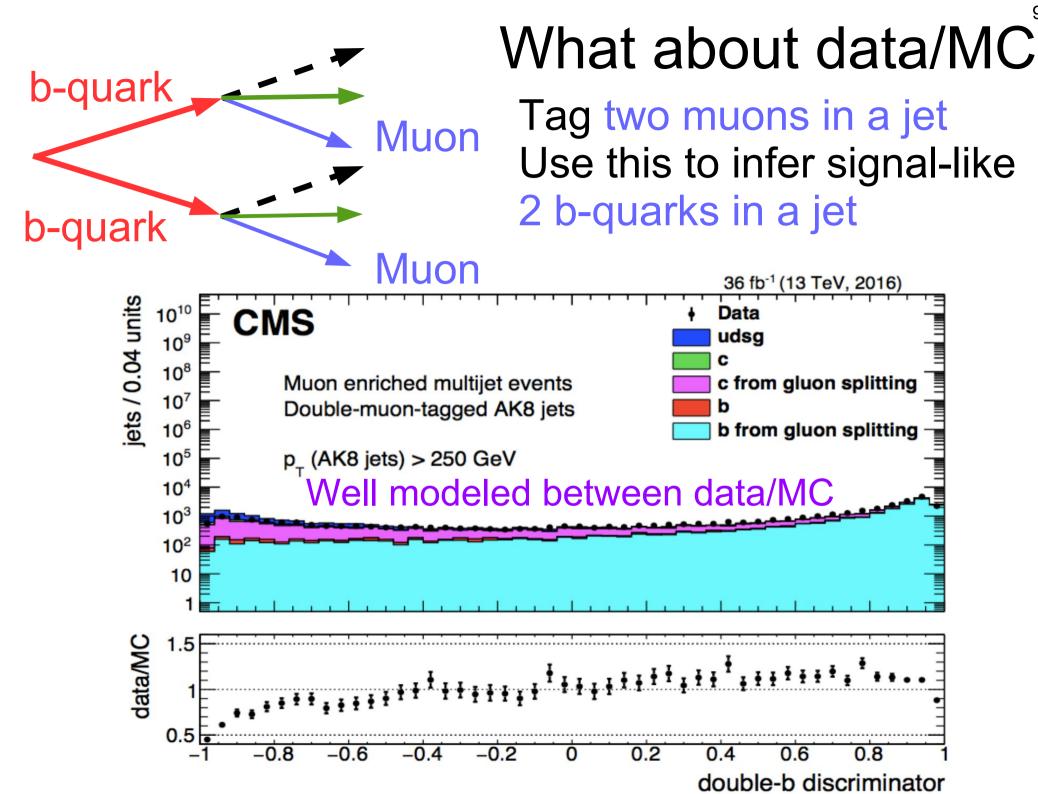
starts

here

Current Best Higgs p_⊤ measurement

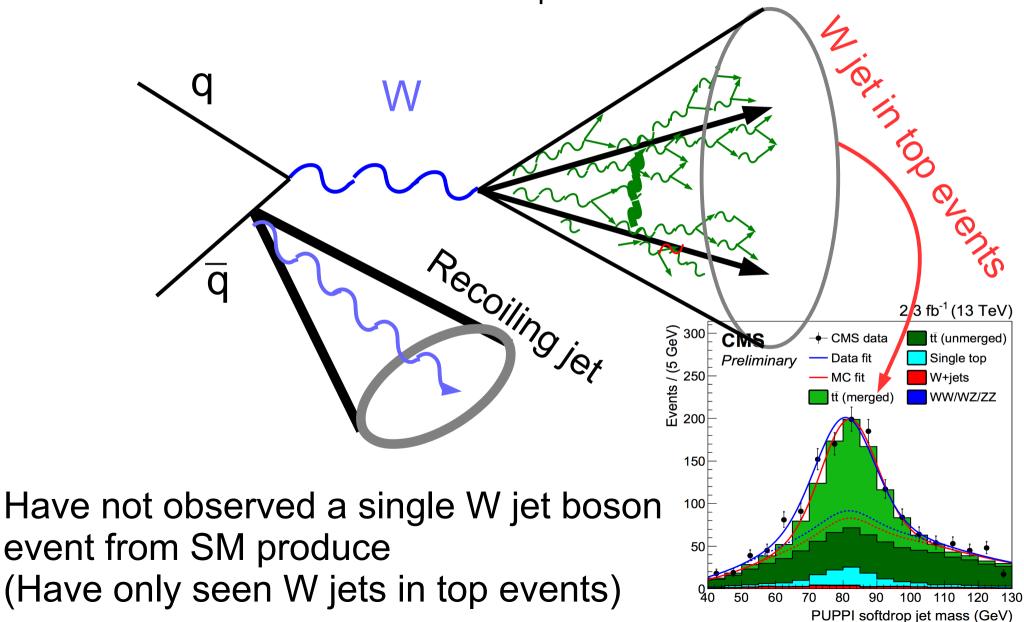


No other way to look for events in this region



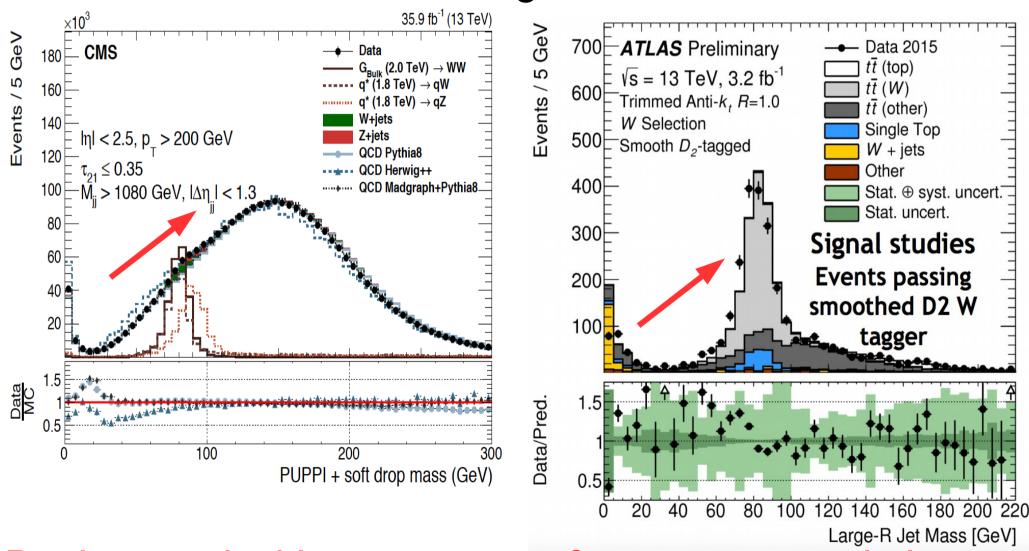
Whats the first goal?

Require W to be a high p_T



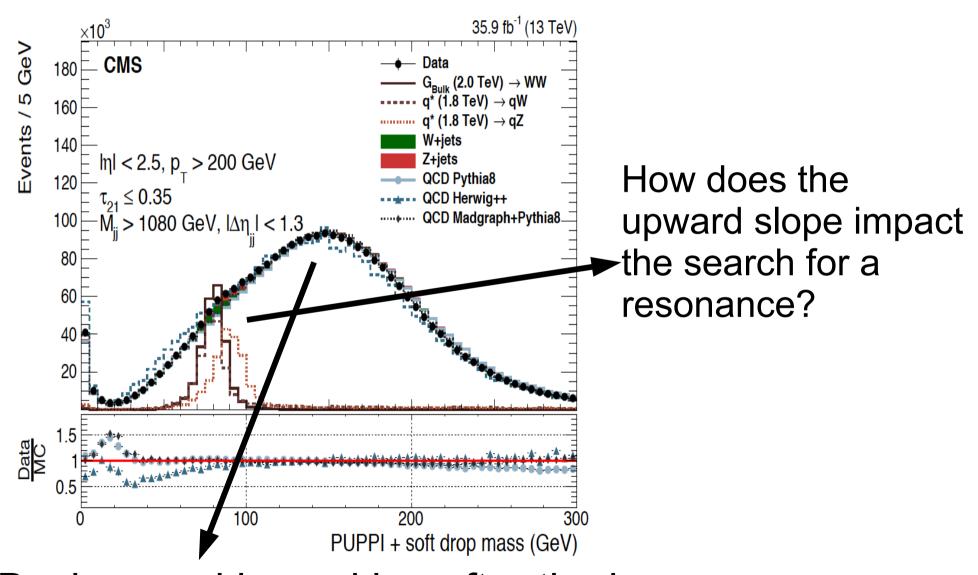
....at the same time on CMS

An observation was being made



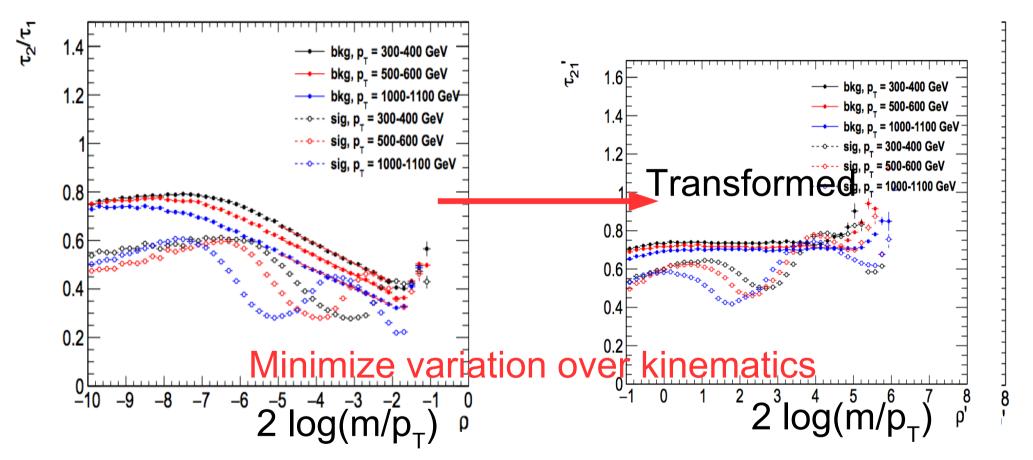
Background with current cuts force an upward slope

Finding the W/Z on a slope



Background is peaking after the bump helps to improve reduce background at W

Designing a new tagger?



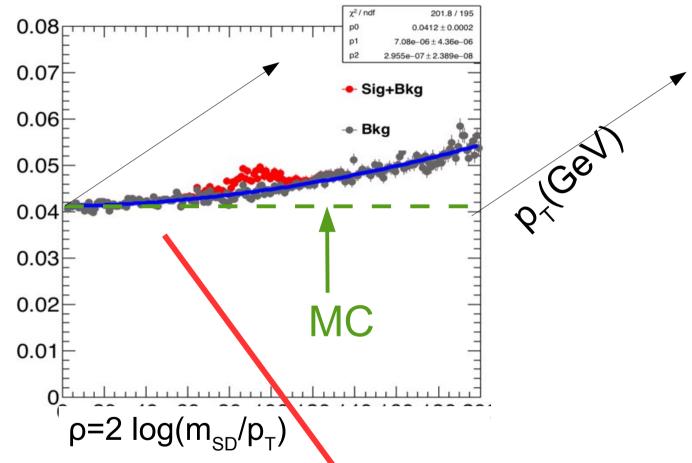
$$\tau'_{21} = \tau_2/\tau_1 - M \times \rho'$$

$$\rho' = \rho + \log \frac{p_T}{\mu} = \log \left(\frac{m^2}{p_T \mu}\right)$$

To minimize sculpting we minimize the variation over mass and $p_{\scriptscriptstyle T}$

In data

We can tune the efficiency to be flat in MC

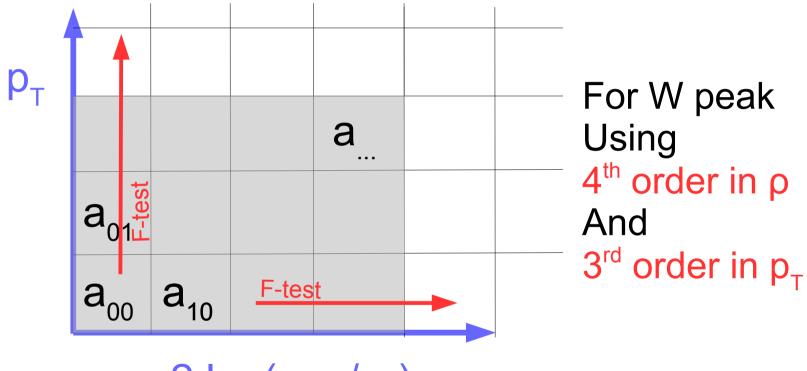


Utilize a polynomial in
$$\rho$$
 and p_T

$$N_{\text{pass}}^{\text{QCD}}(m_{\text{SD}i}, p_{\text{T}j}) = \epsilon^{\text{QCD}} \cdot \left(\sum_{k,\ell} a_{k\ell} \rho_{ij}^k p_{\text{T}j}^\ell \right) \cdot N_{\text{fail}}^{\text{QCD}}(m_{\text{SD}i}, p_{\text{T}j}).$$

In data

Interatively expand in ρ & p_τ order with an f-test



$$\rho = 2 \log(m_{SD}/p_T)$$

Utilize a polynomial in
$$\rho$$
 and p_T

$$N_{\text{pass}}^{\text{QCD}}(m_{\text{SD}i}, p_{\text{T}j}) = \epsilon^{\text{QCD}} \cdot \left(\sum_{k,\ell} a_{k\ell} \rho_{ij}^k p_{\text{T}j}^\ell \right) \cdot N_{\text{fail}}^{\text{QCD}}(m_{\text{SD}i}, p_{\text{T}j}) .$$

Ingredients to see W peak: Recp

- Select a jet $(p_T > 500)$
- Require the jet to pass a 2 prong tag
 - Tune the tagger to be flat across the mass
- Select tagger & take both pass and failing selection
- Simultaneously fit for pass and failing
- Parametrize the difference between data and MC
- Use a 4^{th} , 3^{rd} order polynomial in ρ, p_T to model data

Now are we ready to fit the W peak?

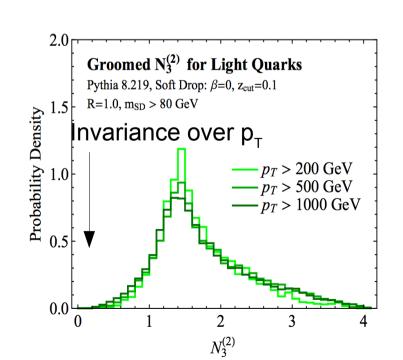
The End Game

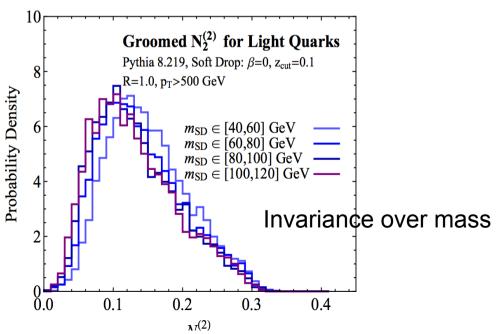
Meanwhile...

Theorists decided to build in the scale invariance
 New Angles on Energy Correlation Functions

Ian Moult, Lina Necib, Jesse Thaler (Submitted on 23 Sep 2016)

- Into a new set of substructure observables
- Guiding principles are to exploit invariances in QCD

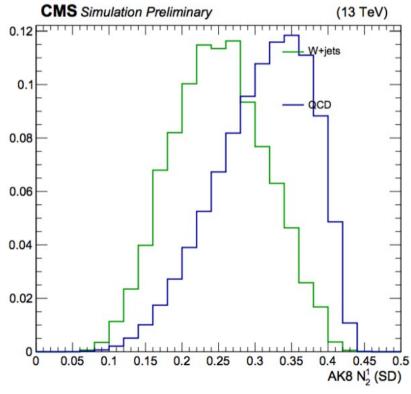


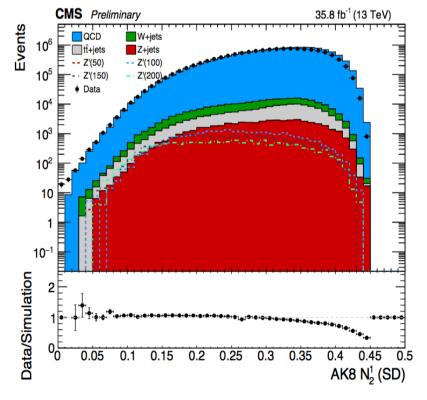


New Substructure Observables

$$N_2(eta) = rac{2e_3^eta}{(e_2^eta)^2} egin{array}{c} {}_{1}e_2^eta = e_2^eta = \sum\limits_{1 \leq i < j \leq n_j} z_i z_j \Delta R_{ij}^eta & z_i \equiv rac{p_{Ti}}{\sum_{j \in ext{jet}} p_{Tj}} \ & z_i \equiv rac{p_{Ti}}{\sum_{j \in ext{jet}} p_{Tj}} \ & z_i = e_2^eta = \sum\limits_{1 \leq i < j < k \leq n_j} z_i z_j z_k \min\{\Delta R_{ij}^eta \Delta R_{ik}^eta, \Delta R_{ij}^eta \Delta R_{jk}^eta, \Delta R_{ik}^eta \Delta R_{jk}^eta\} \end{array}$$

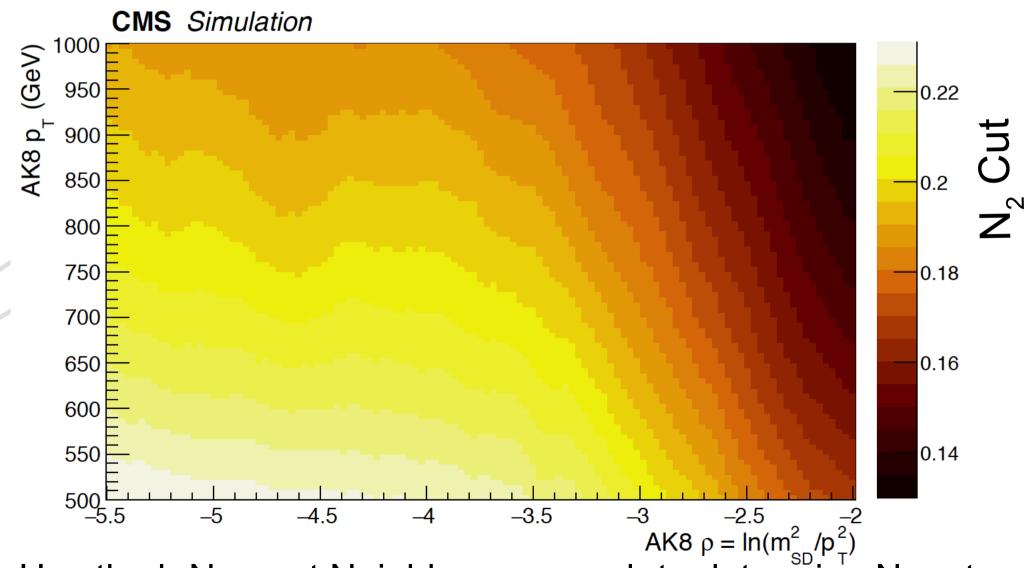
Using AK8 PUPPI jets





We use N₂ to see the W peak

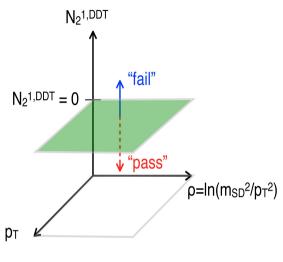
Full Decorrelation scheme



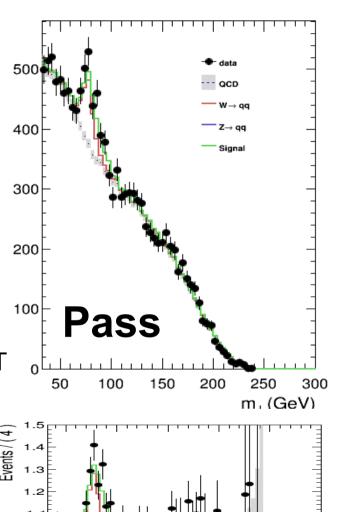
Use the k-Nearest Neighbor approach to determine N₂ cut EXO-17-001

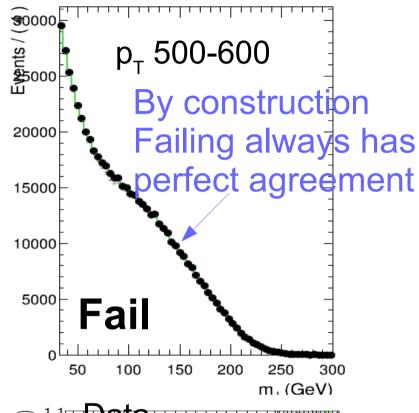
All Pieces are in Place

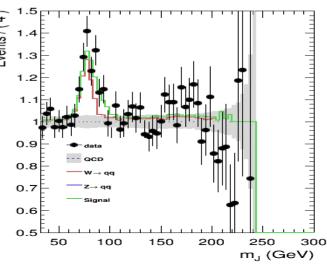
The final fit

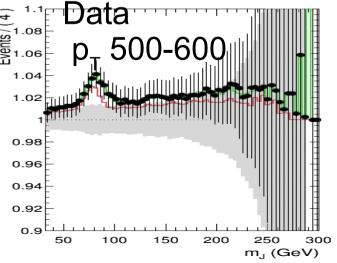


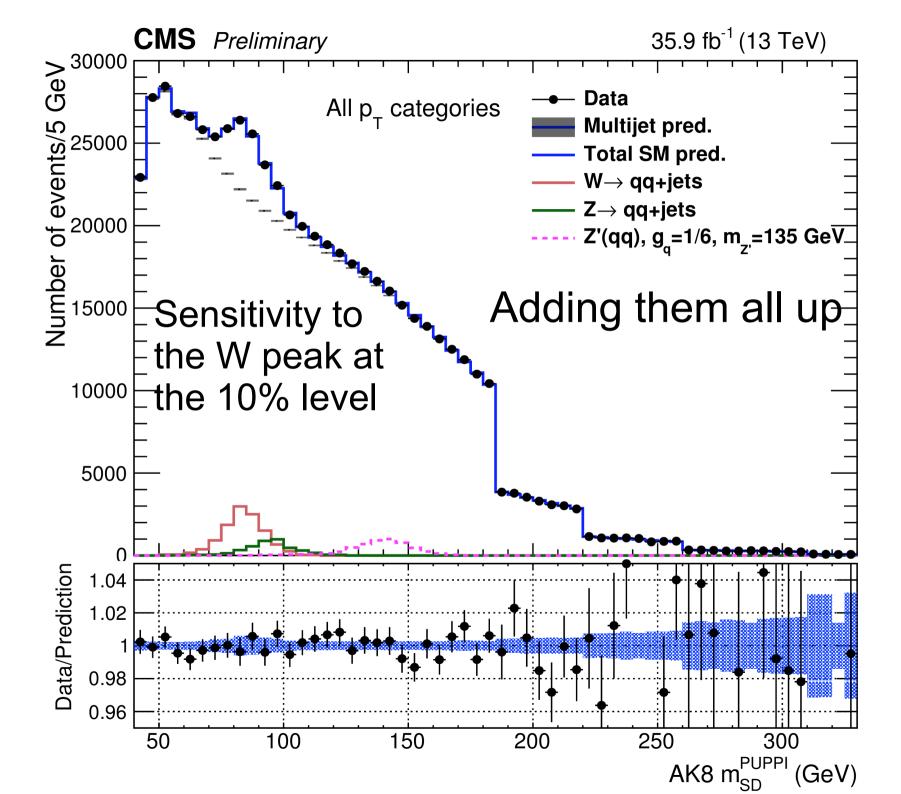
Use 5 bins in p_{T 0} 500-1000 GeV (100 GeV bins)^(*)/₂ 1.3

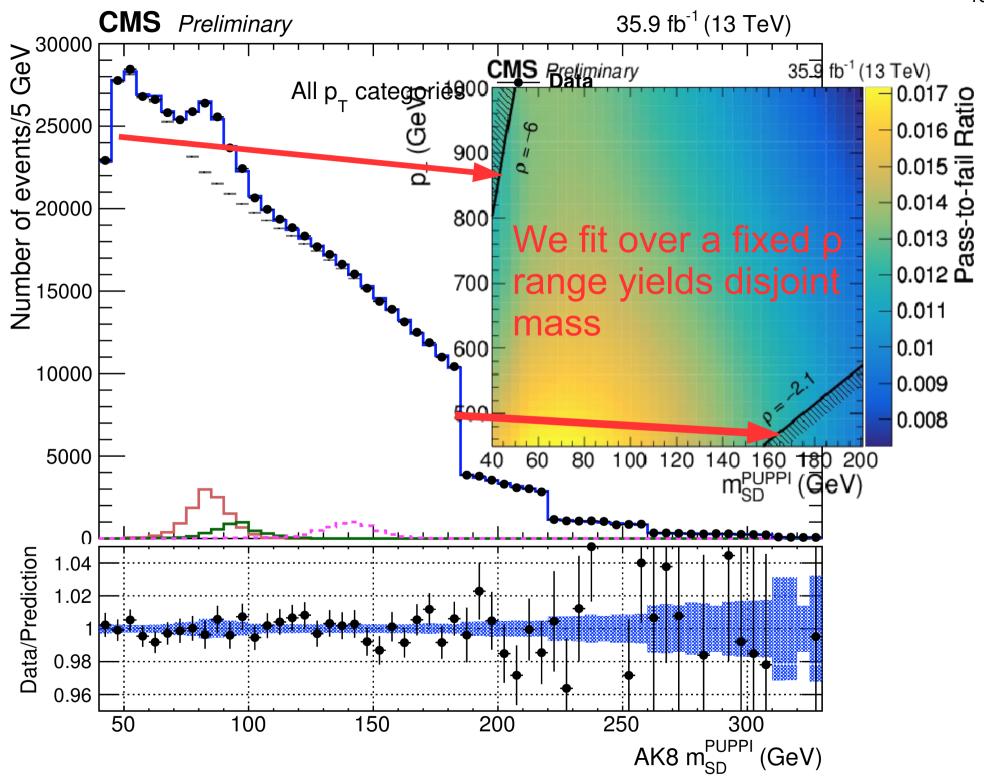






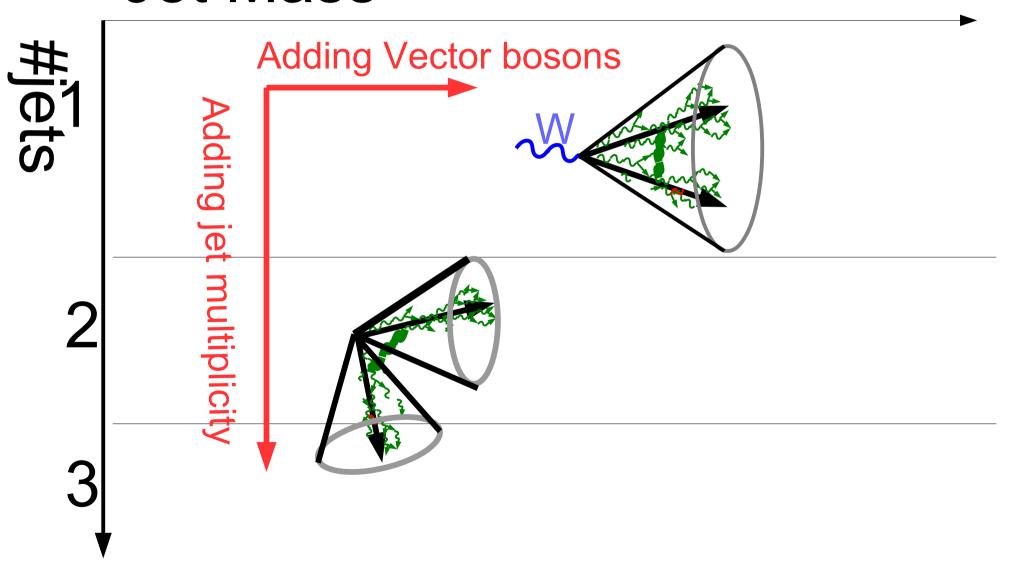




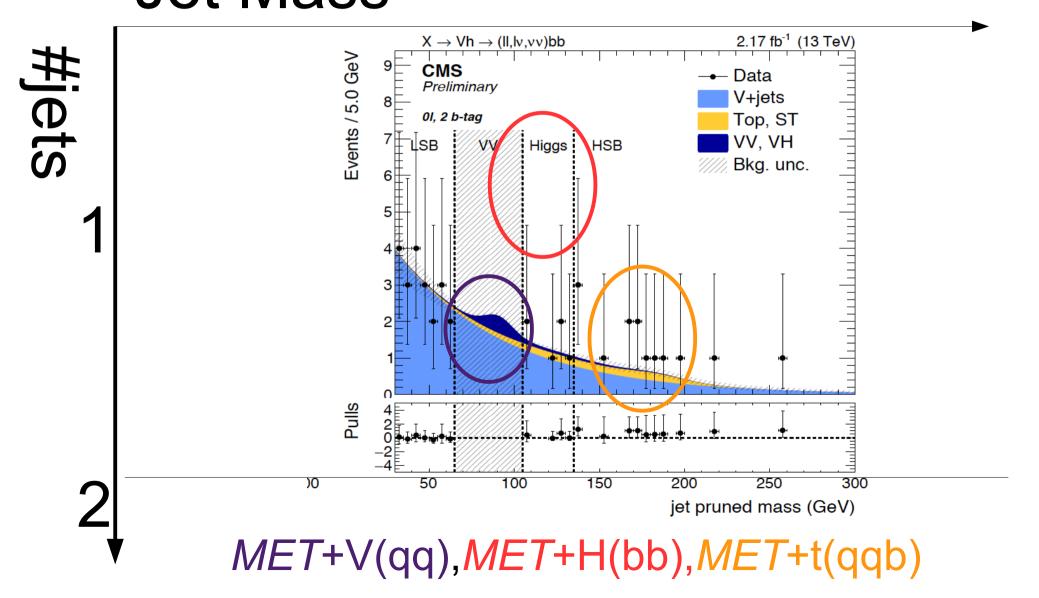


Monojet Extenstion Plane

Jet Mass

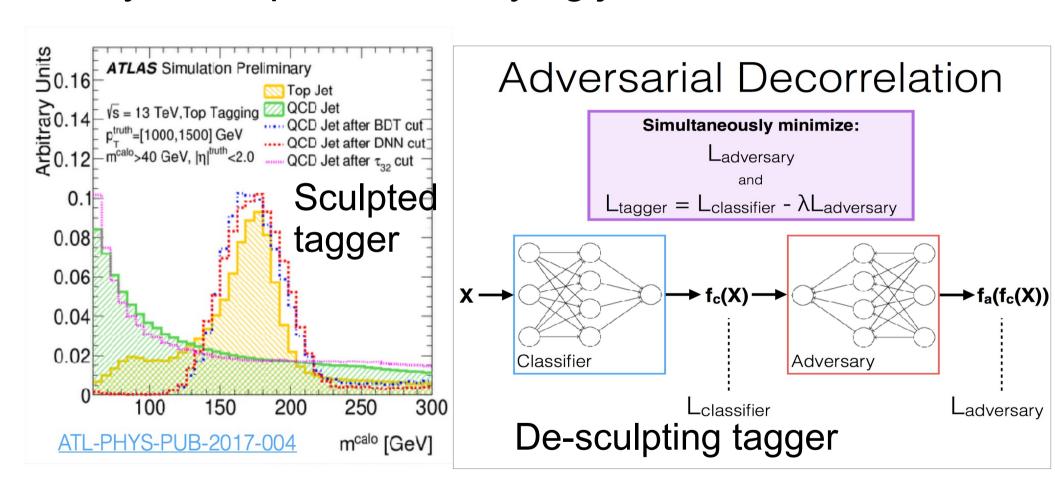


Monojet Extenstion #1 (V→qq) Jet Mass

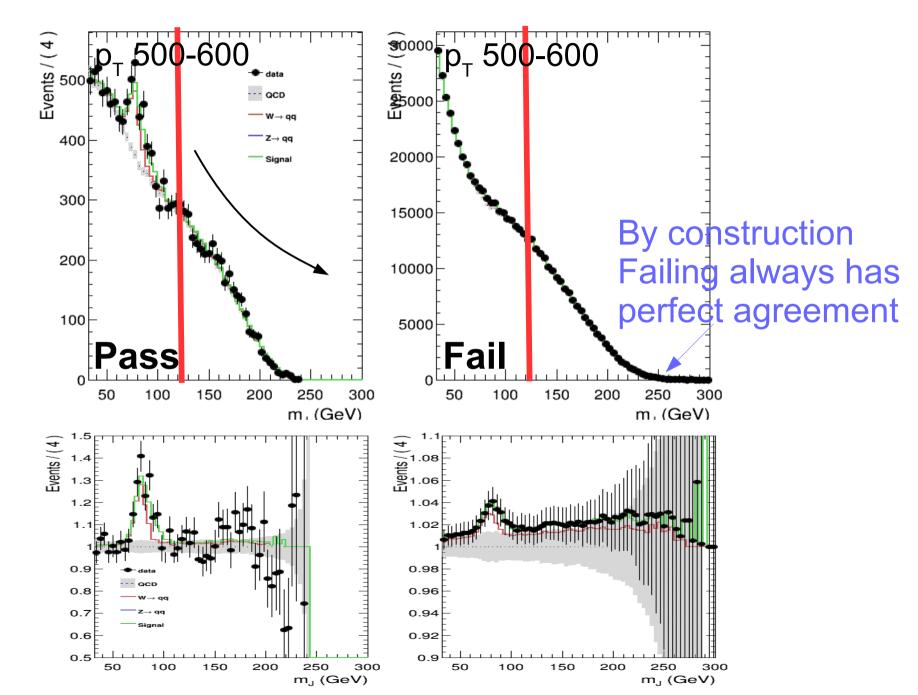


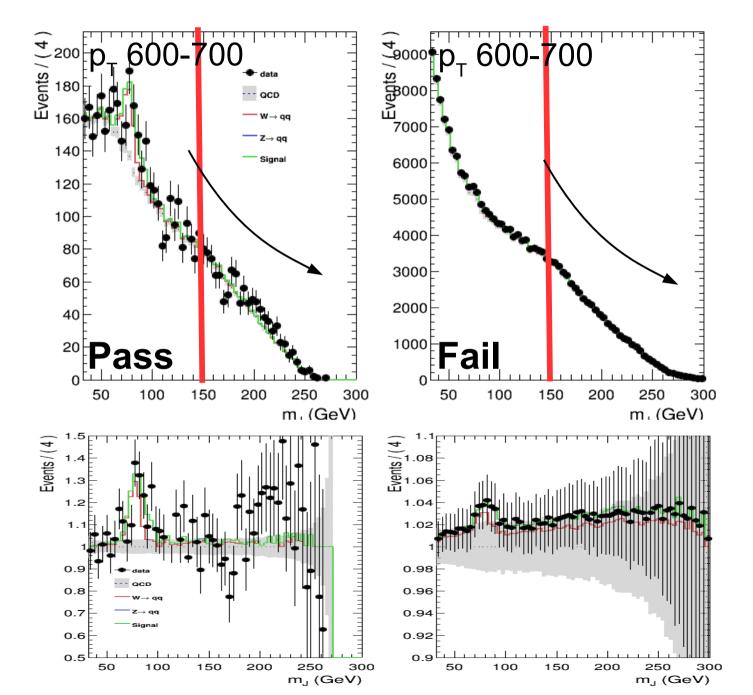
New Directions

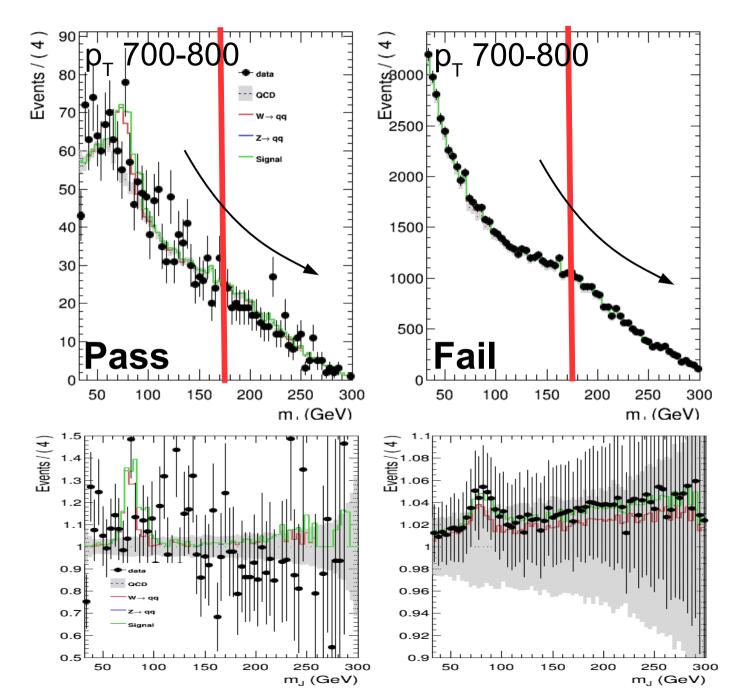
Key concept was modifying jet substructure

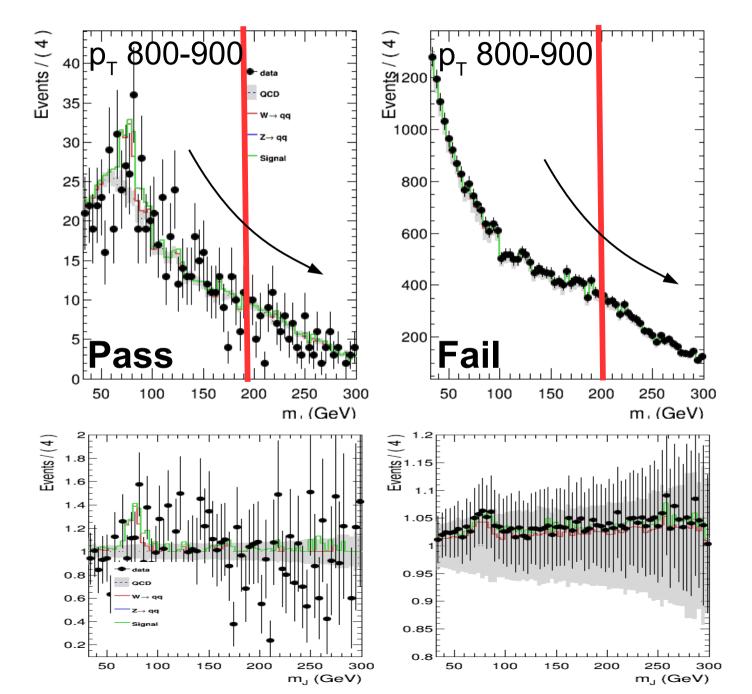


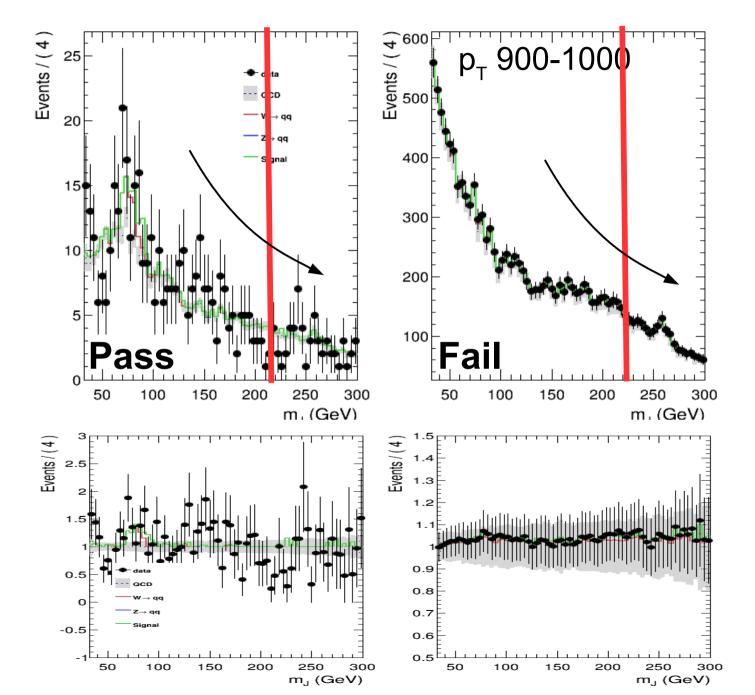
New approaches w/deep learning can decorrelate observables



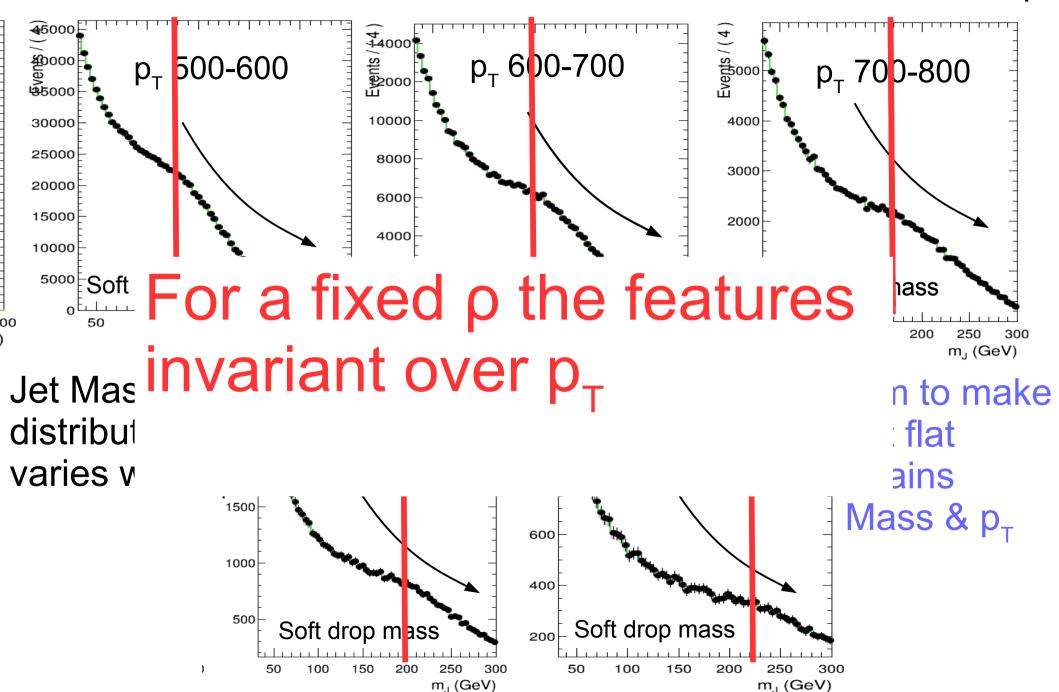


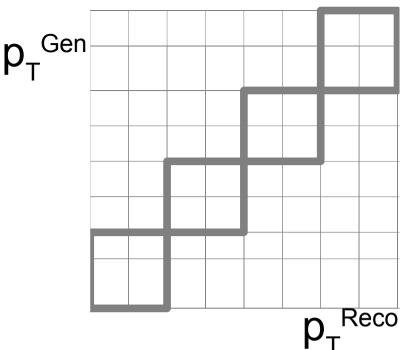






Sudakov peak variation over p_T



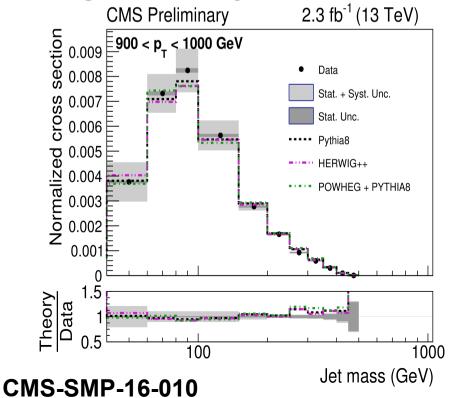


MGen

Unfolded

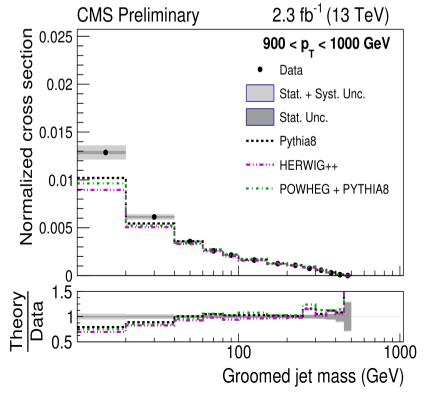
4D unfolding M^{reco} , p_T^{reco} to M^{Gen} , p_T^{Gen}

Ungroomed jet mass



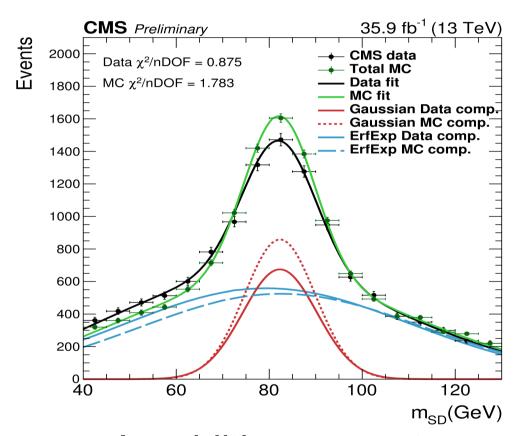
mMDT(Sofdrop β =0) jet mass

MReco



Jet Mass Resolution

Mass resolution obtained with top events



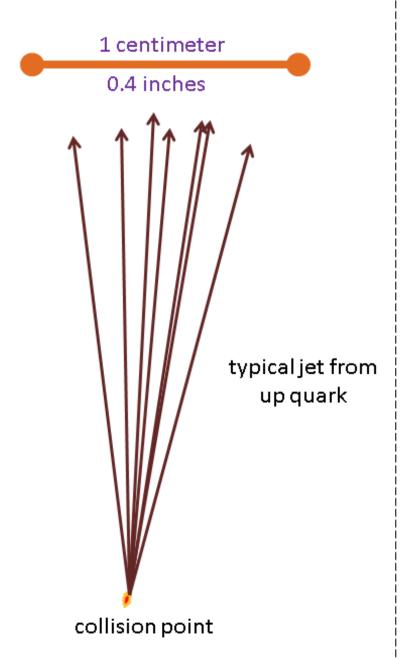
Jet mass and resolution calibrated on W peak in ttbar events

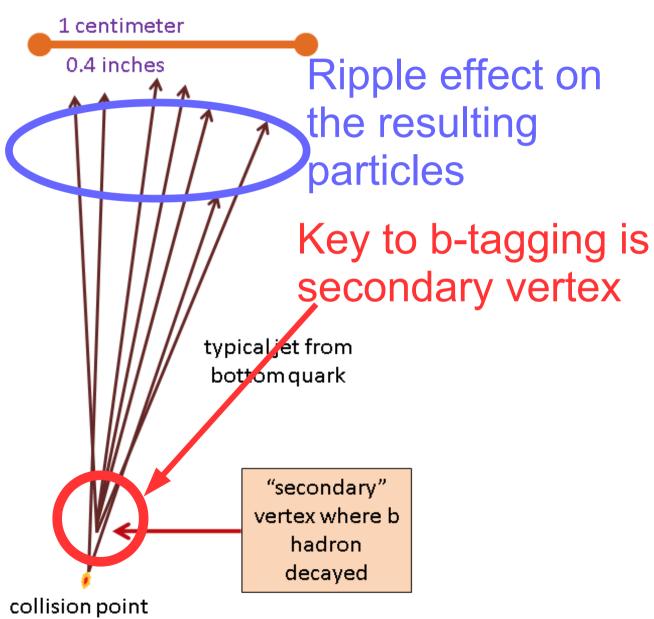
Inc extrapolated to all phase space

In addition compute uncertainty based:
Jet energy corrections/resoultion,Pileup,
PDF and Physics model

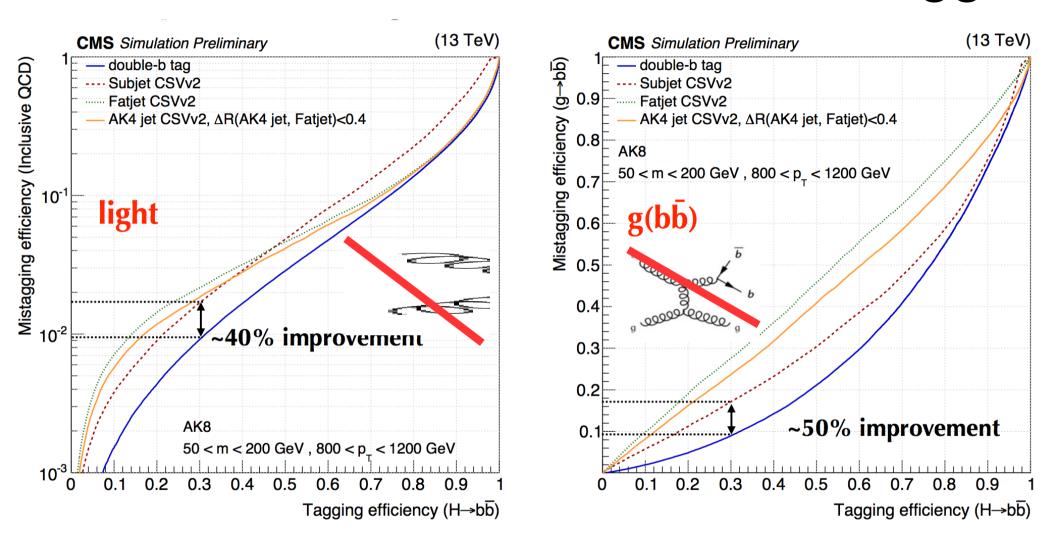
CMS-SMP-16-010

A b-tag?



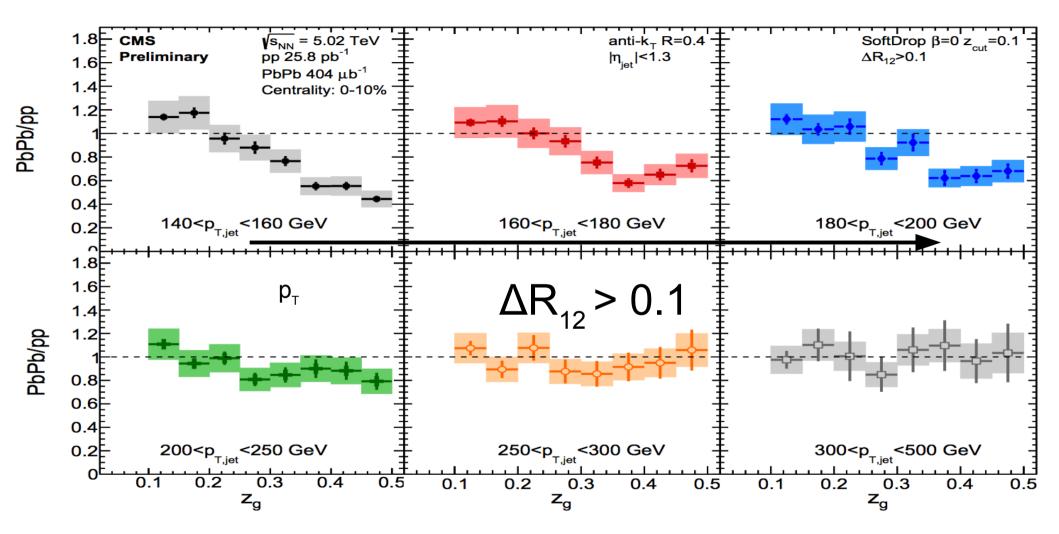


Double B-tagger



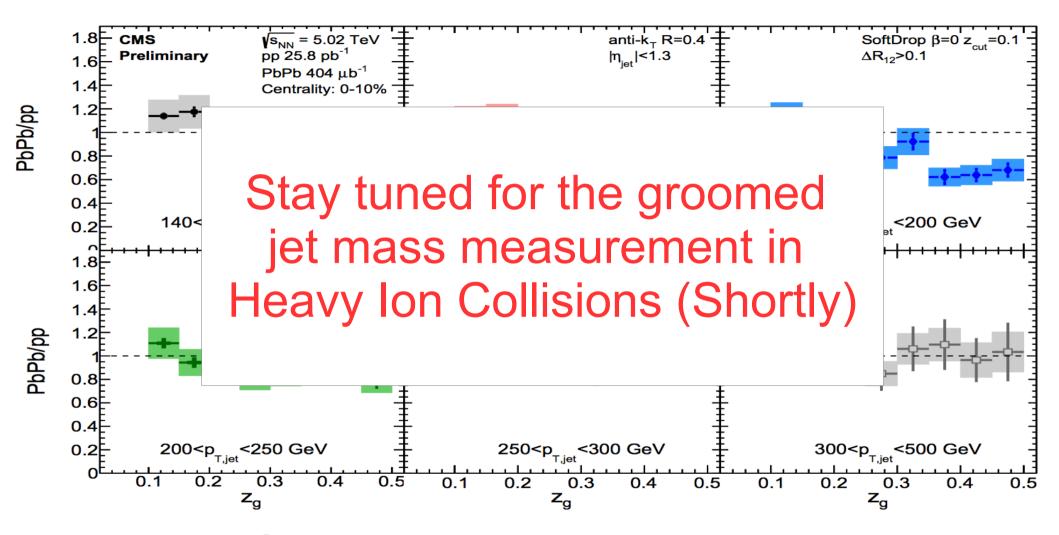
Resulting combination gives 50% improvement over previous

Modification in the medium



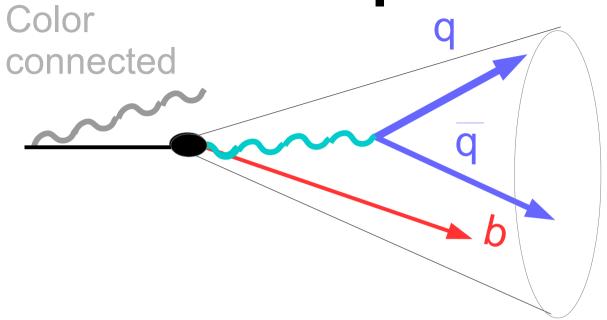
A clear modification is present with subsides at high p_T

Modification in the medium



A clear modification is present with subsides at high p_T

The Top Jet Mass



Top jet decays are a great way to test top mass

High p_T regime allows us to factorize effects

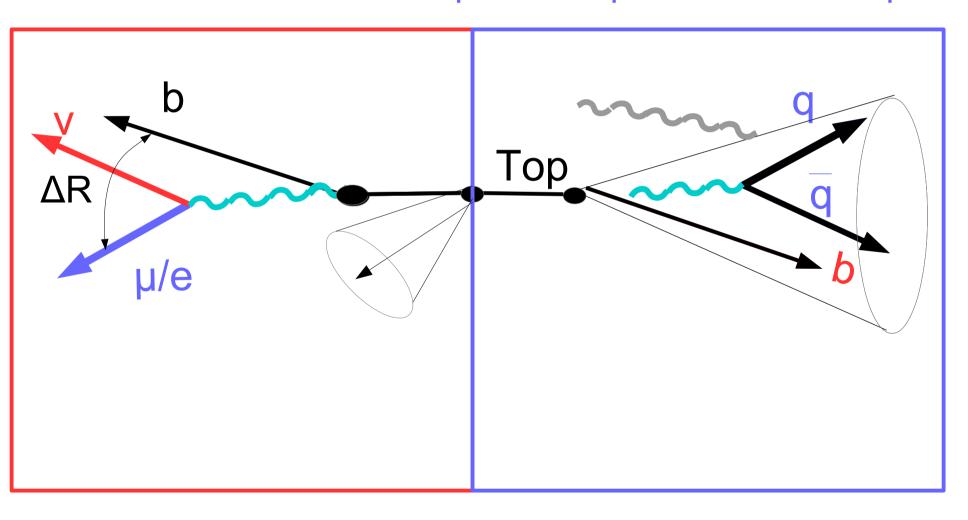
Potential for a better understanding of mass

Question: How sensitive are we to top mass?

Selecting top events

Name of the game: don't bias the top mass

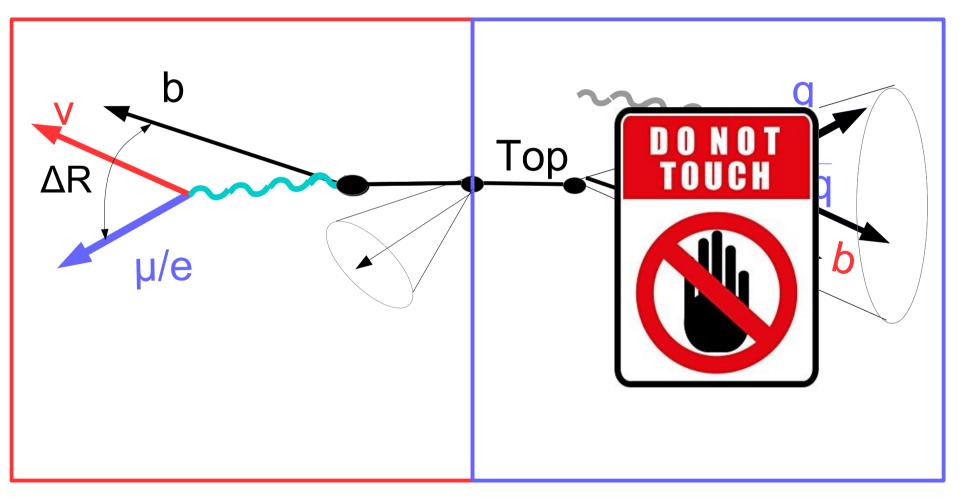
Goal here is to isolate a pure sample of boosted tops



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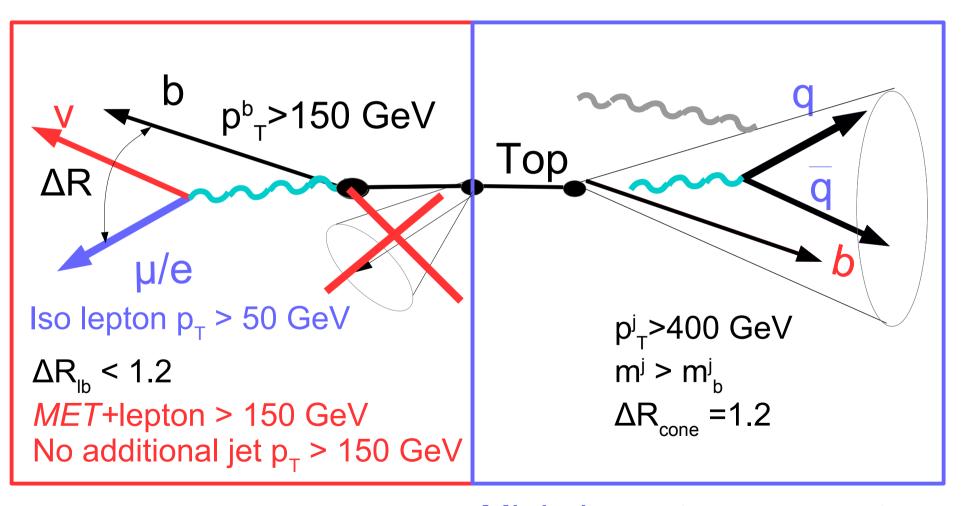
Cut on many parameters

Minimize cut on parameters

Selecting top events

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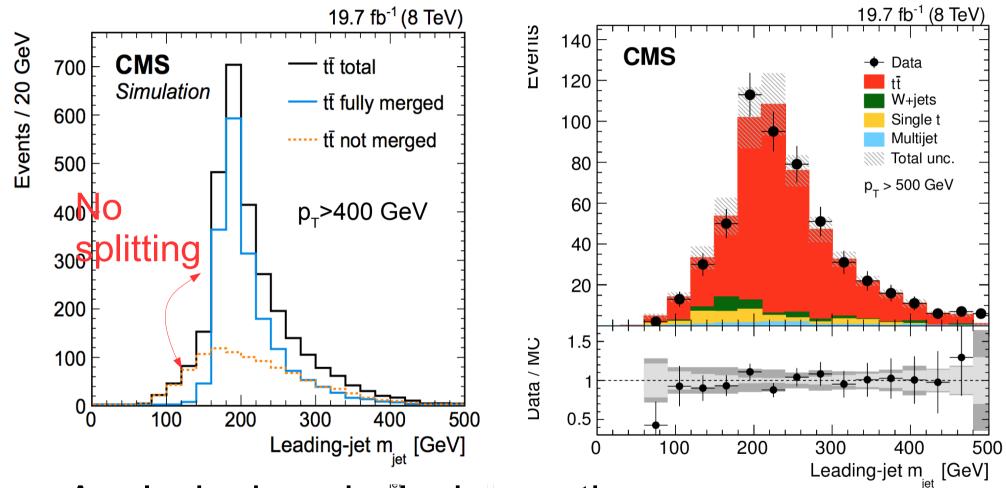
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Cut on many parameters

Minimize cut on parameters

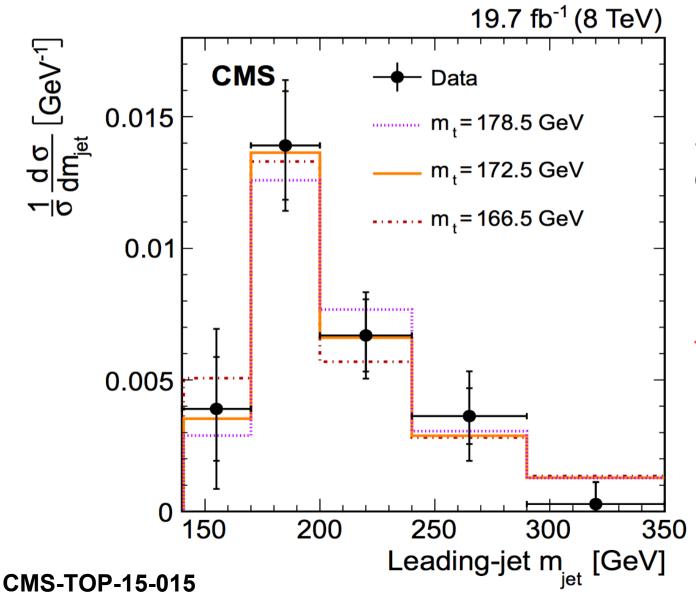
Top Mass



Analysis done inclusive on the mass
Avoid splitting merged and unmergd @ all cost
Goal is unfold mass model independently

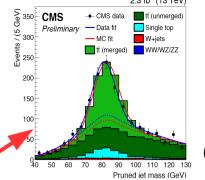
CMS-TOP-15-015

Top Mass Unfolded



Same scheme as QCD jet mass

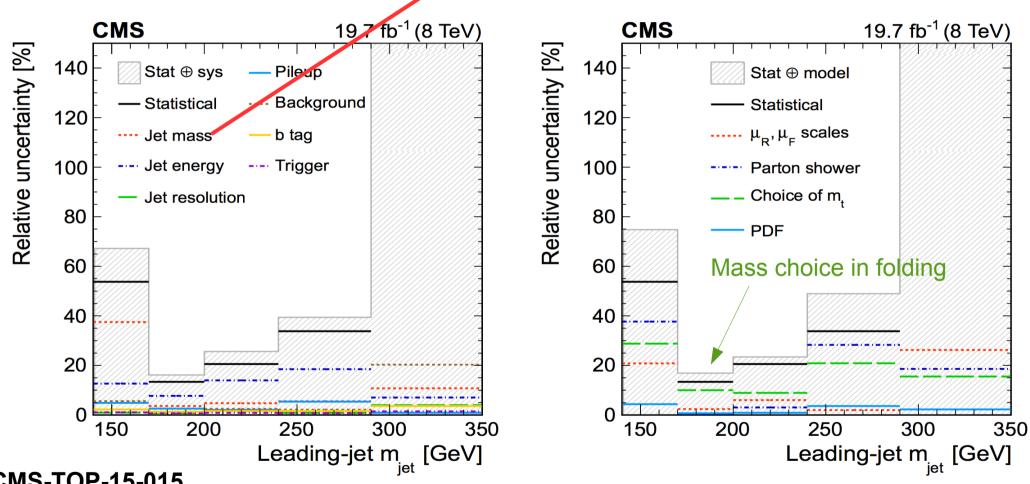
+ accounting for migration from tight cuts



Top Mass

The unfolded result

(ungroomed)

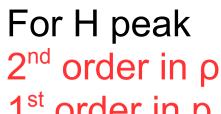


CMS-TOP-15-015

 $m_{\rm t} = 170.8 \pm 6.0 \, ({\rm stat}) \pm 2.8 \, ({\rm syst}) \pm 4.6 \, ({\rm model}) \pm 4.0 \, ({\rm theo}) \, {\rm GeV}$

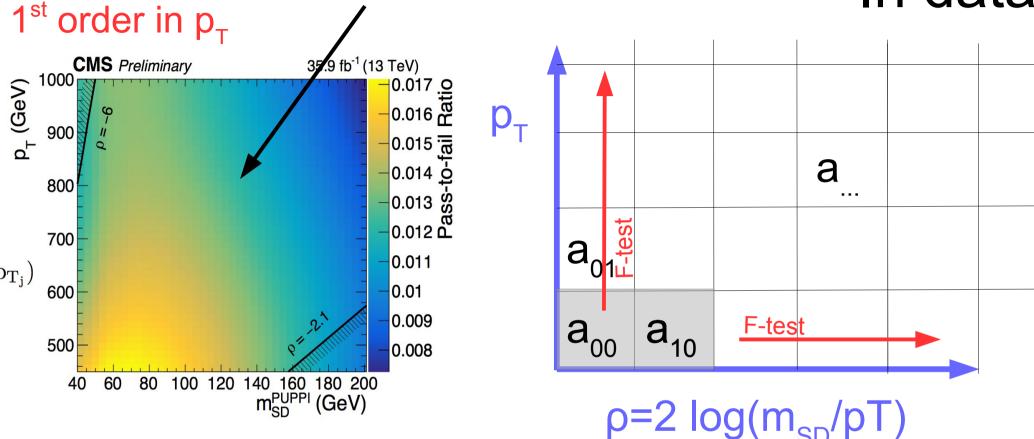
$$=170.8 \pm 9.0 \,\text{GeV}$$

$$\mathrm{m_t^{~SM}} \!\!=\! 173.34 \pm 0.27 \, \mathrm{(stat)} \pm 0.71 \, \mathrm{(syst)} \, \mathrm{GeV}$$



Fitted Surface

In data



Following

$$N_{\mathrm{pass}}^{\mathrm{QCD}}(m_{\mathrm{SD}i}, p_{\mathrm{T}j}) = \epsilon^{\mathrm{QCD}} \cdot \left(\sum_{k,\ell} a_{k\ell} \rho_{ij}^k p_{\mathrm{T}j}^\ell \right) \cdot N_{\mathrm{fail}}^{\mathrm{QCD}}(m_{\mathrm{SD}i}, p_{\mathrm{T}j})$$

CMS-HIG-17-011