

Gluon Tagging and Quark & Gluon Samples

How well can we do at the 7 TeV LHC?

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Harvard

12 April 2011

- **Biggest Motivation:** Reject **Gluey** LHC Backgrounds
- **Part 1:** The Gluon Tagger
- **Part 2:** Finding Pure Samples of **Quark** and **Gluon** Jets

Gluon Tagging Motivation

Other than “Wouldn’t it be nice to know?”

Most *new physics* gives **quark** rather than **gluon** jets:

Interesting *standard model physics* also tends to be quark-heavy

- Tops ($t\bar{t} \rightarrow 4$ or 6 quarks)
- W 's decaying hadronically (there's no b-tag): $W^+ \rightarrow u\bar{d}$ or $c\bar{s}$
- $WW \rightarrow 4$ light quarks

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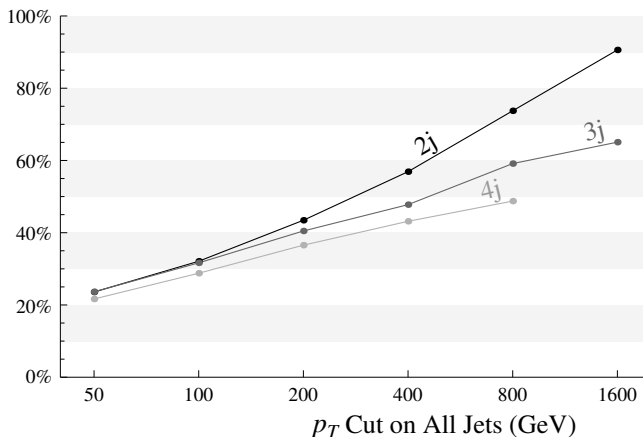
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Eventually combine Gluon-Tagging with B-Tagging and τ -Tagging

But There's a Lot of Glue to Get Stuck In

Chance EACH Jet is Quark



So chance that all 4 jets $\gtrsim 100$ GeV are quark: $(30\%)^4 = 0.8\%$

- **Biggest Motivation:** Reject **Gluey** LHC Backgrounds
- **Part 1:** The Tagger
 - Example Observables: Jet Mass and Charged Track Count
 - Evaluating the power of observables: Background Rejection
 - Familiar presentation of ‘Jet Shape’ and its problems
 - Measuring ‘size’ of jets
 - Combining 2 or more observables
- **Part 2:** Finding Pure Samples of **Quark** and **Gluon** Jets

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- LHC is very jetty and pp is more gluey.
- The most difficult signals are buried under multi-jet events.

Which observables are useful:

- Individually?
- When combined?

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Interesting variables can be:

- Studied theoretically
- Verified experimentally

Differences in Quarks vs Gluons

- Color Charge: C_F vs C_A \rightarrow jet mass, size, track count
- Color Connections: 1 vs 2 \rightarrow eccentricity and pull
- Electrical Charge \rightarrow charge-weighted track p_T
- Spin: 1/2 vs 1 \rightarrow not explicitly used
- ...

Gluon has a greater effective color charge (squared) than **quark**:

Gluon adjoint's C_A vs **Quark** fundamental's C_F

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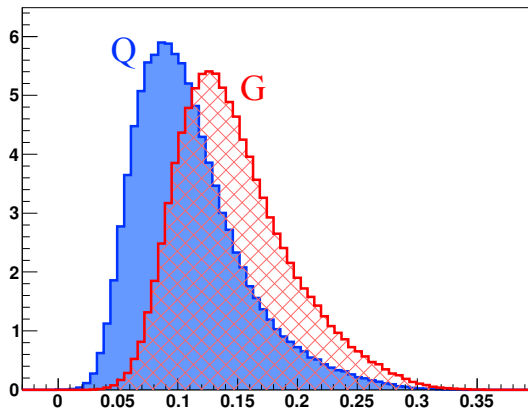
Jet Mass in the small angle limit:

$$\langle M^2 \rangle = C \frac{\alpha_s}{\pi} p_T^2 R^2$$

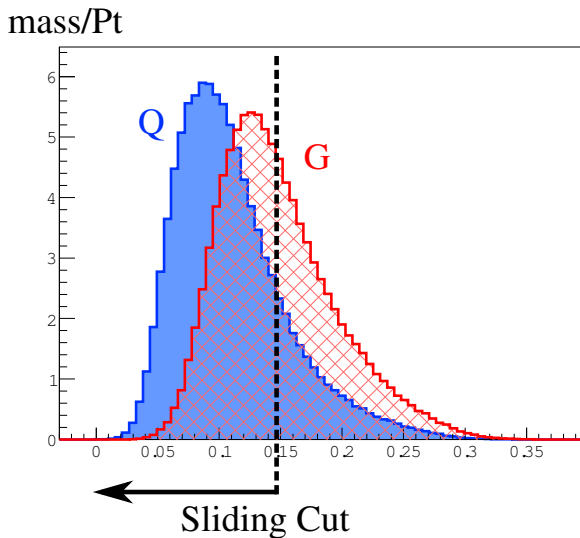
where $C \sim C_A$ for **gluon** jets, and $\sim C_F$ for **quark** jets.

- Normalizing by p_T (200 GeV in this sample) generalizes better.

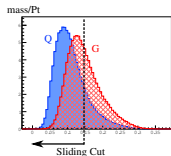
mass/Pt



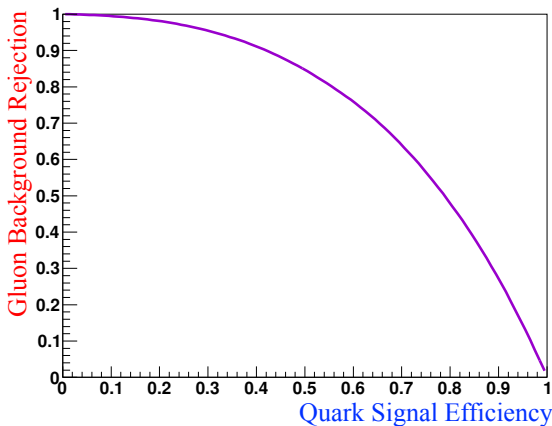
Evaluating the Observable: Sliding Cut



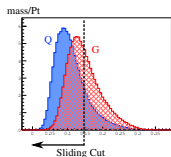
ROC Curve



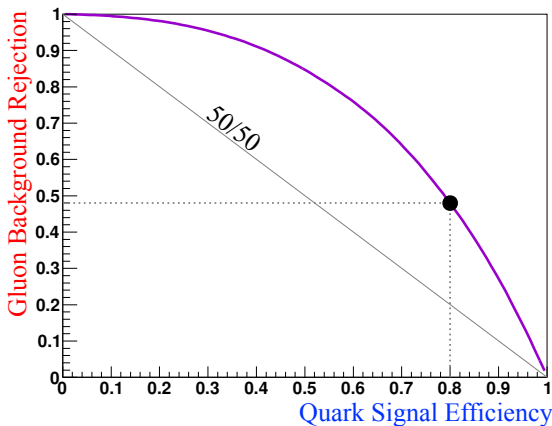
ROC Curve for $mass/Pt$



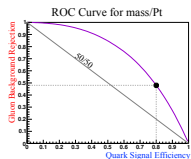
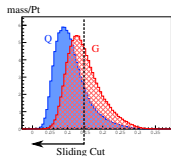
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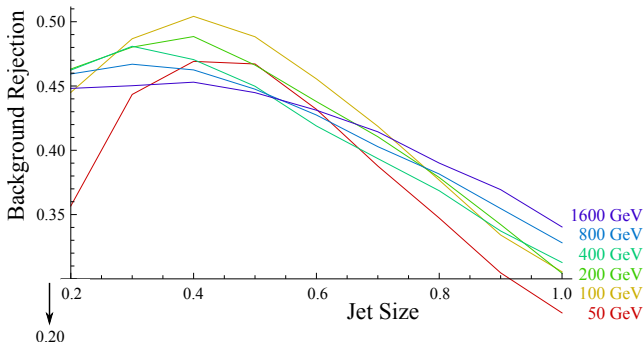
ROC Curve for $mass/Pt$



Other Jet Sizes and p_{TS}



mass/Pt @ 80% Signal Efficiency



Rather than showing $10 * 6 = 60$ ROC Curves, pick 80% point on each

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Multiplicity of *any* particle in a gluon jet should be $C_A/C_F = 9/4$ times greater (confirmed at LEP).

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$$\frac{\langle N_g \rangle}{\langle N_q \rangle} = \frac{C_A}{C_F} \qquad \frac{\sigma_g^2}{\sigma_q^2} = \frac{C_A}{C_F}.$$

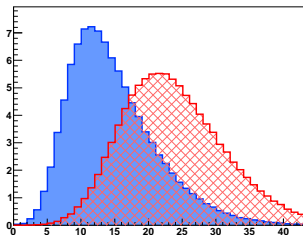
(Calculated to N³LO by Capella, et al. hep-ph/9910226)

No detector simulation, but require charged particles $p_T > 500$ MeV.

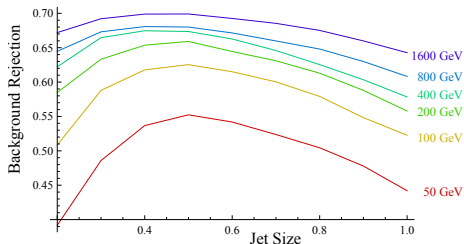
Charged Particles Count

...this old favorite does quite well at high p_T :

components_jet0_ak05_charged_count

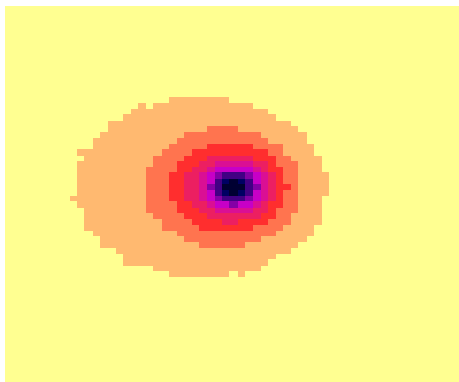


Charged Track Count @ 80% Signal Efficiency

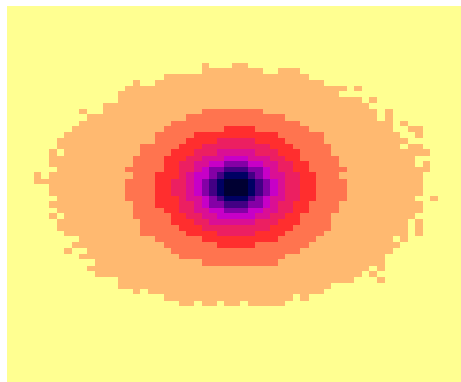


Higher p_T means more charged tracks and more ‘time’ to establish C_A/C_F .

Accumulate 3 million back-to-back dijet events



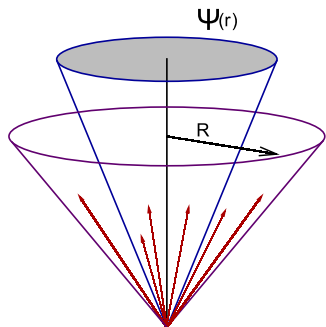
Quark Jets



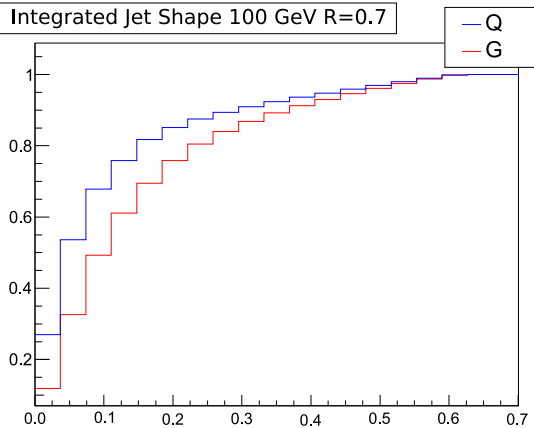
Gluon Jets

(Same total amount of p_T , which is hidden by logarithmic color bands.)

Jet Shape

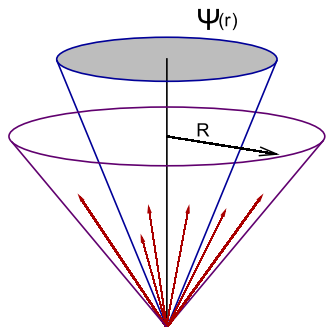


Integrated Jet Shape 100 GeV $R=0.7$

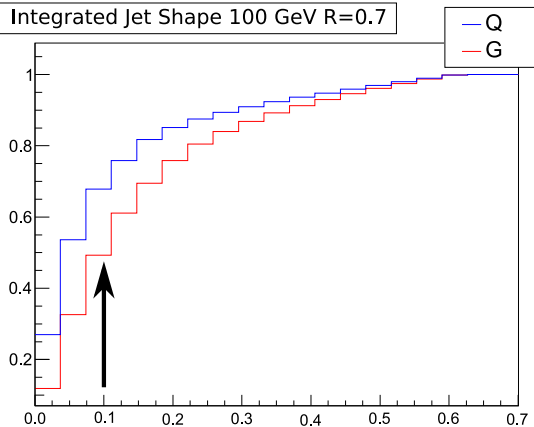


r

Jet Shape



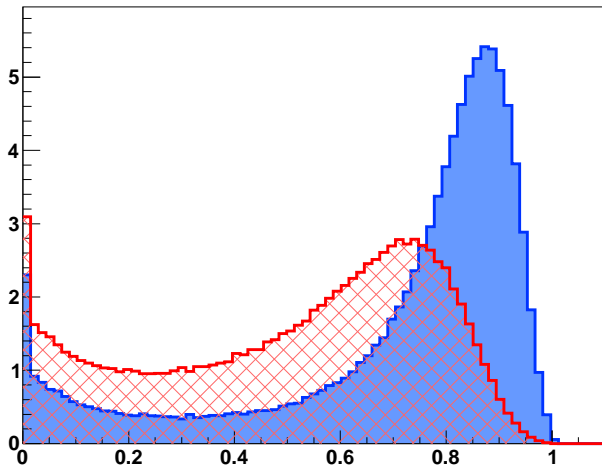
Integrated Jet Shape 100 GeV $R=0.7$



r

Integrated Jet Shape out to $r = 0.1$

for 100 GeV

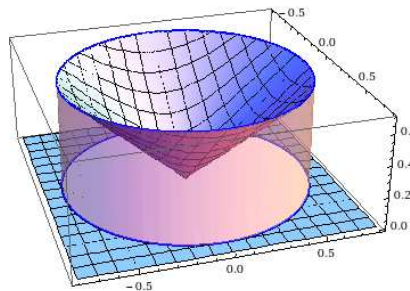


- Distribution is *not* narrow gaussian around average
- Correlations *between* bins is also useful

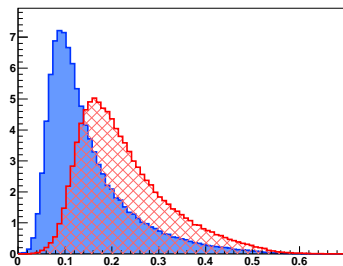
Radial Moment – a measure of the “girth” of the jet

Weight p_T deposits by distance from jet center

Radial Moment, or Girth :
$$g = \sum_{i \in \text{jet}} \frac{p_T^i}{p_T^{\text{jet}}} |r_i|$$



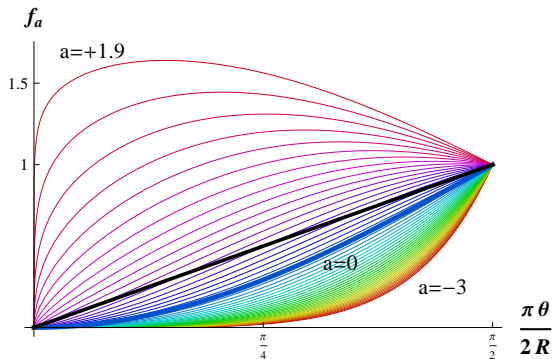
radial moment



Angularities

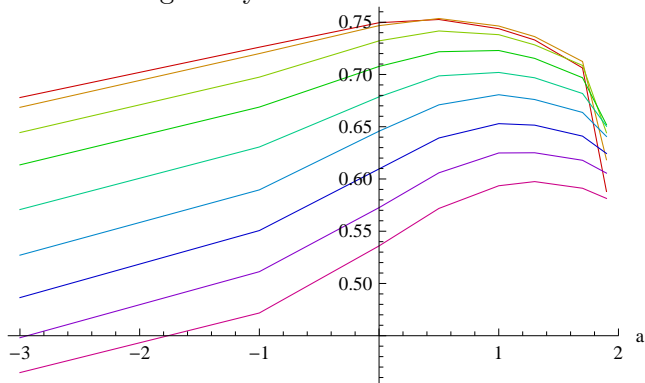
$$\text{Jet Angularities : } A_a = \sum_{i \in \text{jet}} E_i f_a(\theta)$$

$$f_a(\theta) = \sin^a \theta (1 - \cos \theta)^{1-a} \quad \text{with } \theta = \frac{\pi |r_i|}{2R} \quad \text{or just } \theta$$



Normalization? none, mass, jet energy, jet p_T .

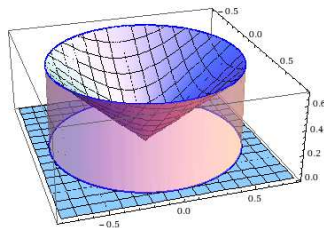
Angularities vs a for different Jet Sizes



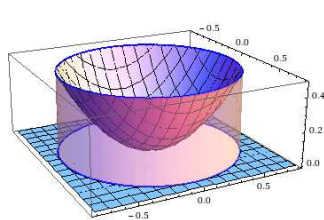
Small $R=0.2$ Jets (red) perform better than Large $R=1.0$ Jets (pink)

Radial Moments and Their Kernels

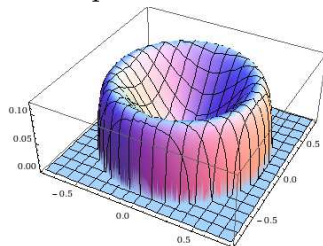
Linear Moment



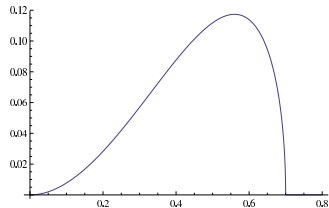
Quadratic Moment



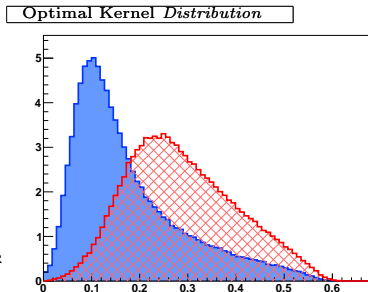
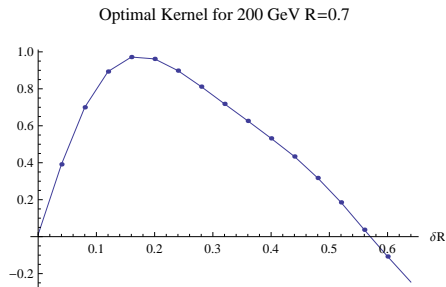
Tapered Moment



Tapered Radial Kernel

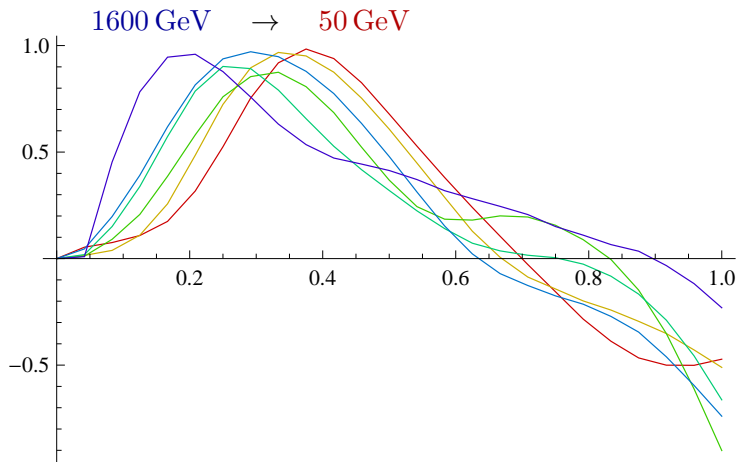


Optimal Kernel



- Positive kernel weights mean gluon-like.
- Overall vertical shift or scaling leads to same distribution.
- Quarks have most of their p_T near the center.

Optimal Kernel for different p_T 's and $R = 1.0$

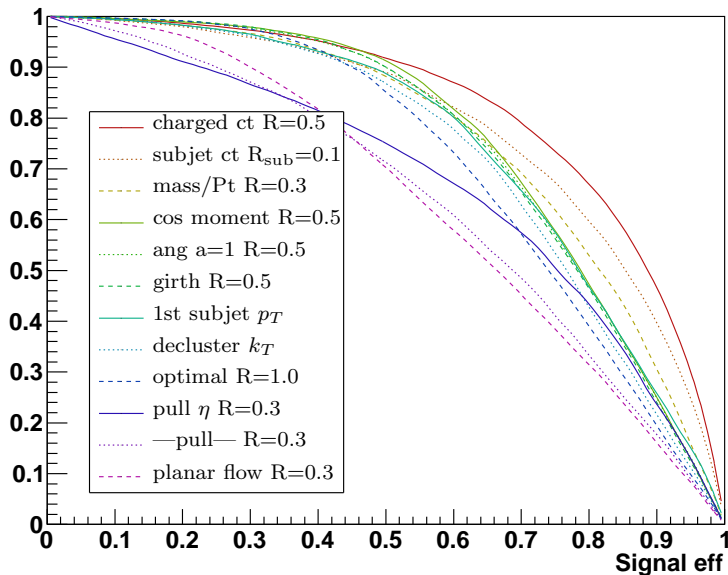


The menu, including varying jet size

- Distinguishable particles/tracks/subjects
 - multiplicity, $\langle p_T \rangle$, σ_{p_T} , $\langle k_T \rangle$,
 - charge-weighted p_T sum
- Moments
 - mass, girth, broadening
 - angularities
 - optimal kernel
 - 2D: pull, planar flow
- Subjet properties
 - Multiplicity for different algorithms and R_{sub}
 - First subjet's p_T , 2nd's p_T , etc.
 - Each subjet's mass
 - Splitting k_T scale

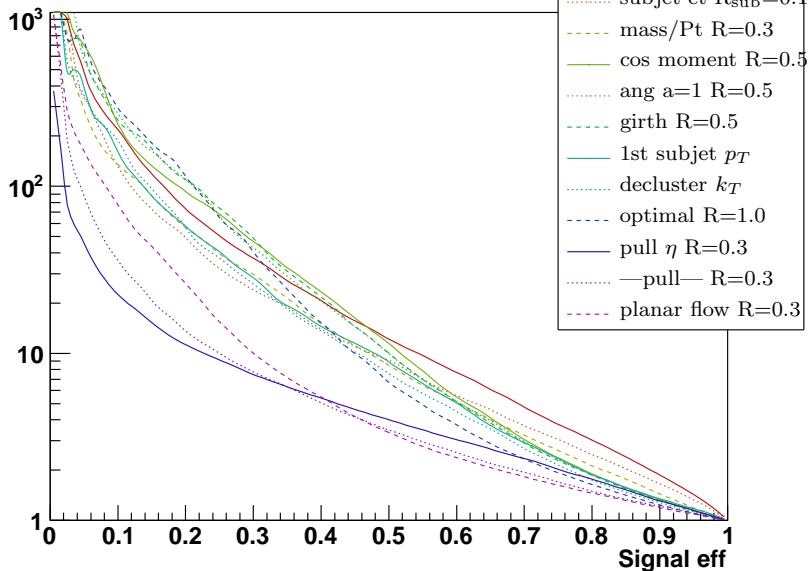
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LHC 200 : Background Rejection



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- Optimize S/B ?
- Optimize S/\sqrt{B} ?

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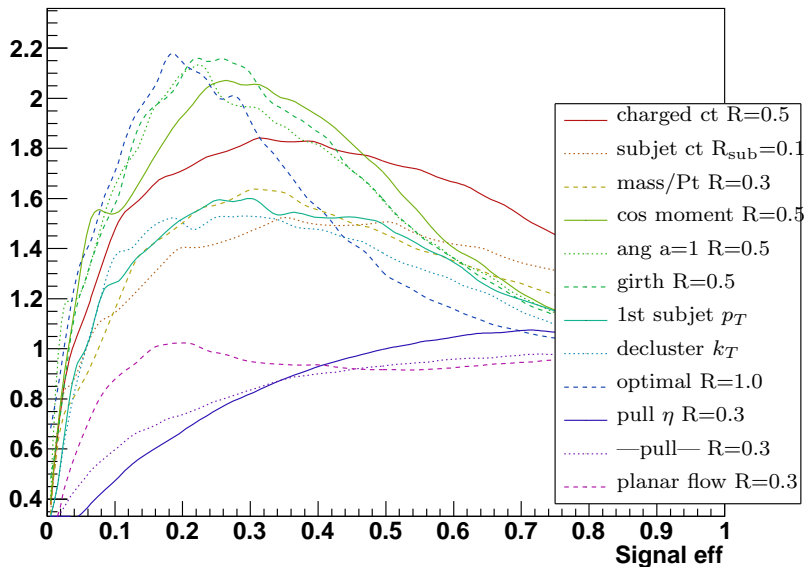
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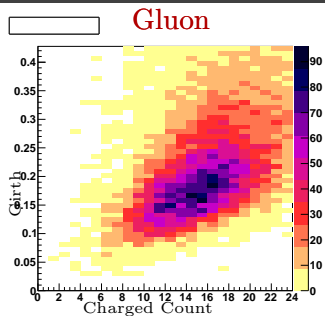
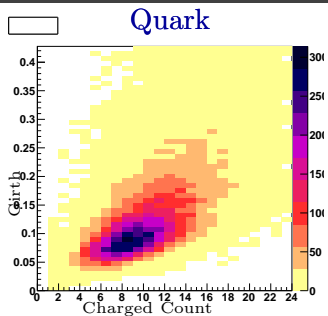
Cutting can improve significance only to a point...

Significance Improvements for Best Single Variables

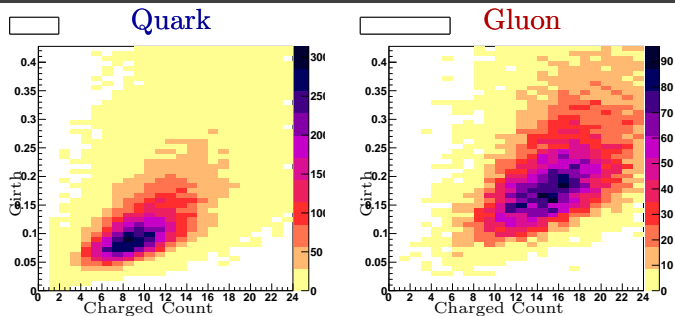
LHC 200 : Significance



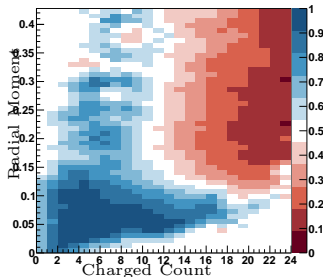
Combining Variables: Ex. Girth vs Charged Count



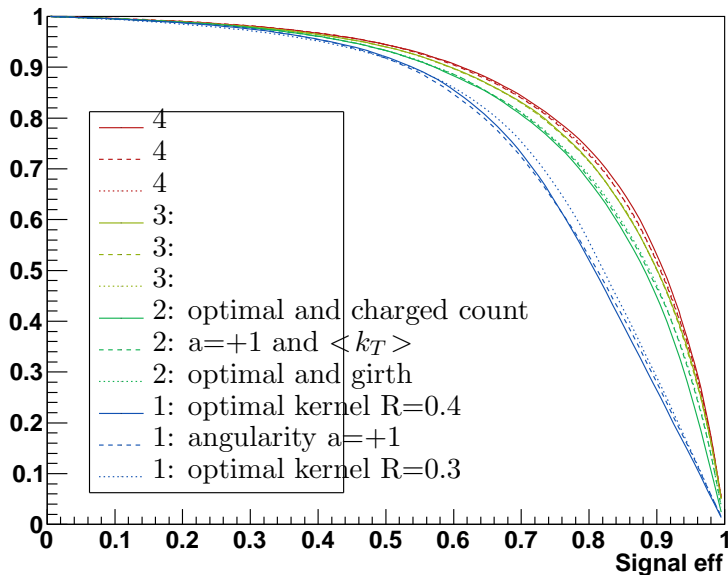
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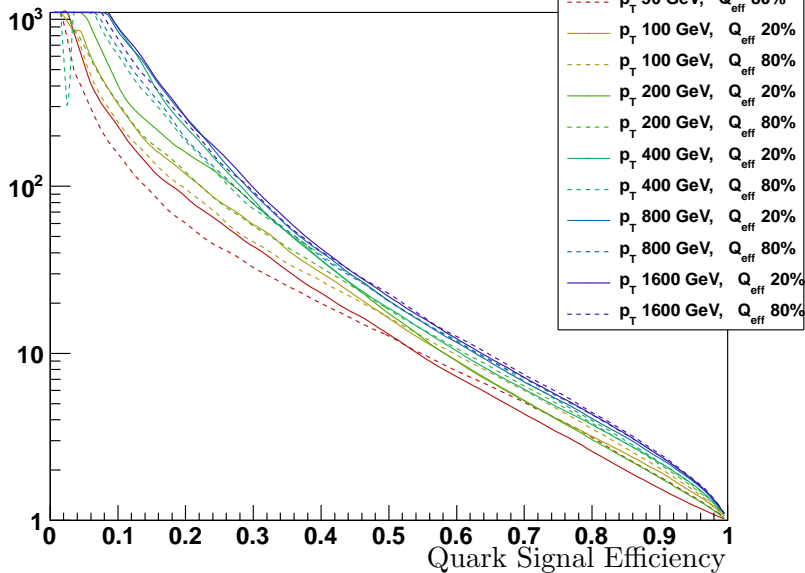
Likelihood: $q/(q + g)$



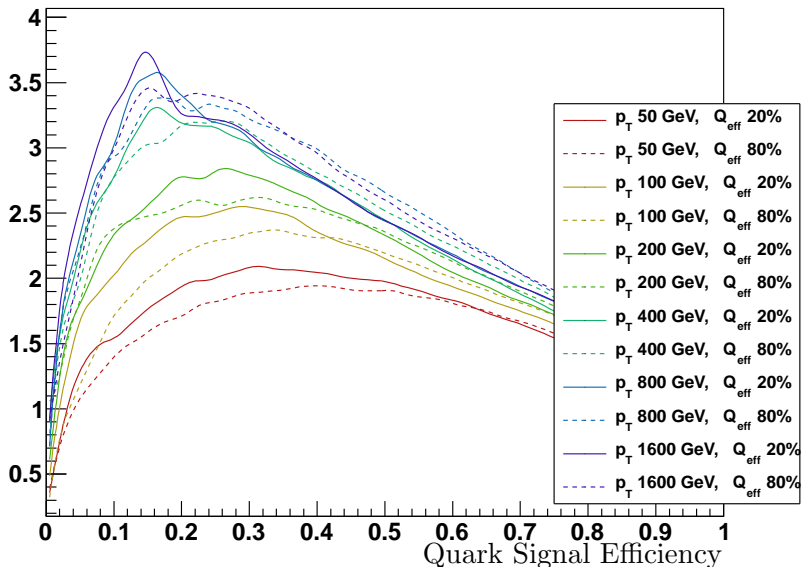
LHC 0100 : Background Rejection



Gluon Background Rejection



Significance Improvement



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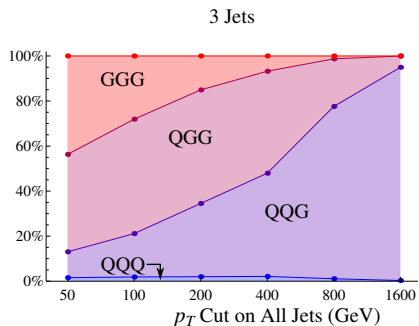
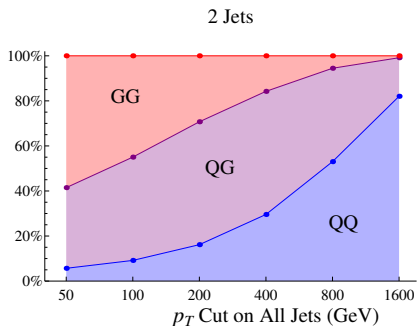
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- Integrate these variables into FASTJET OR SPARTYJET.

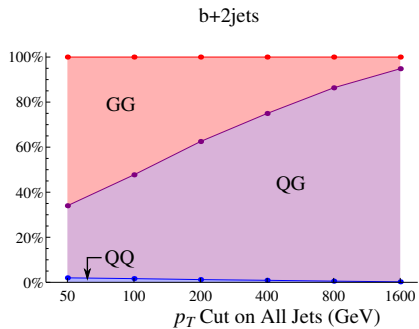
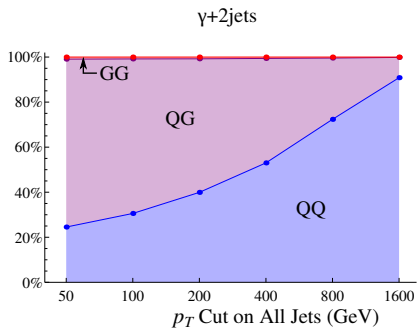
- **Biggest Motivation:** Reject **Gluey** LHC Backgrounds
- **Part 2:** The Gluon Tagger
- **Part 2:** Finding Pure Samples of **Quark** and **Gluon** Jets
 - Goal: High Purity with a high Cross Section
 - Use MADGRAPH tree-level samples
 - Find kinematic variables to cut on
 - 2D combinations and/or Multivariate Techniques
 - 99% **Quark** purity from $\gamma+2\text{jets}$
 - 95% **Gluon** purity from 3jets
 - **arXiv:1104.1175 [hep-ph]** with Matt Schwartz

Detailed Multi-Jet Composition

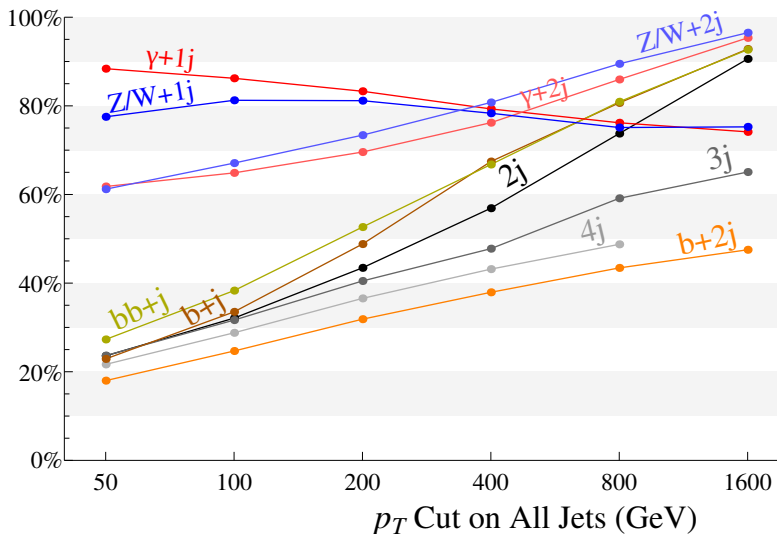


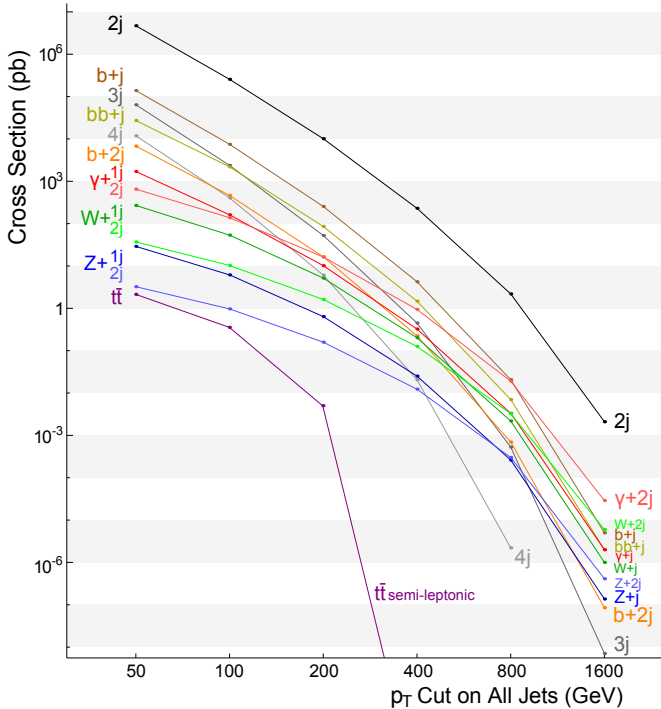
Result of Parton Distribution Functions

X+2jet Composition

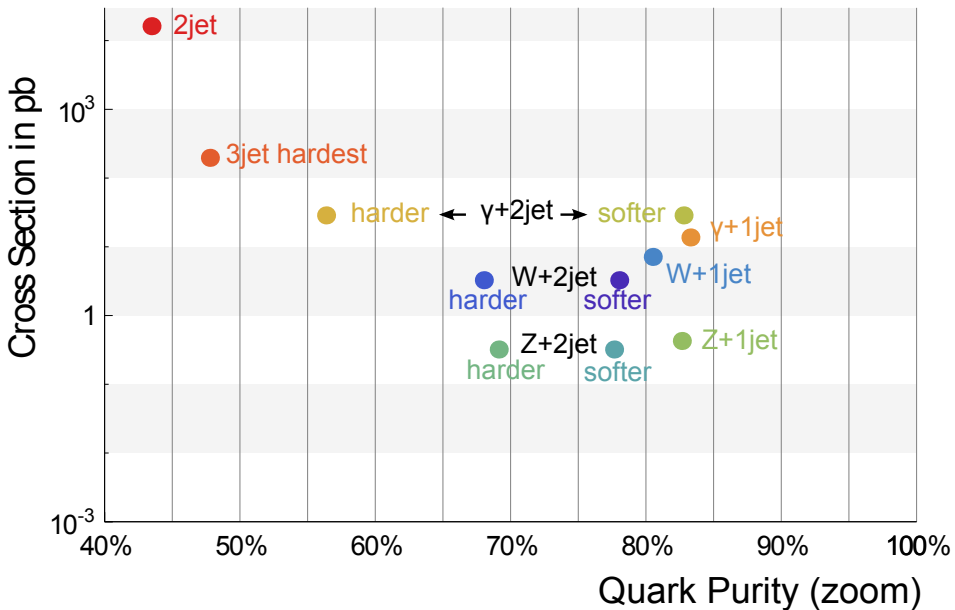


Chance EACH Jet is Quark

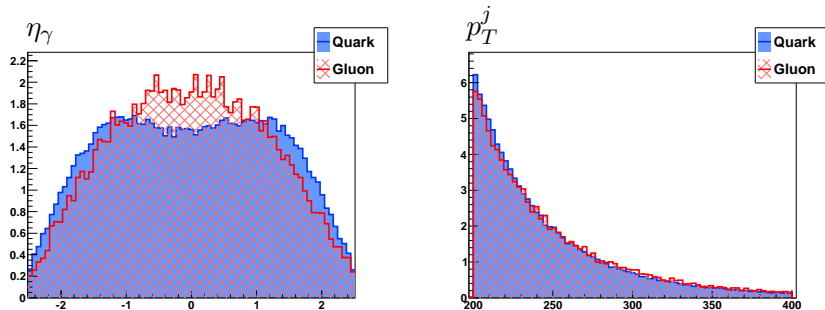




200 GeV Quark Purity



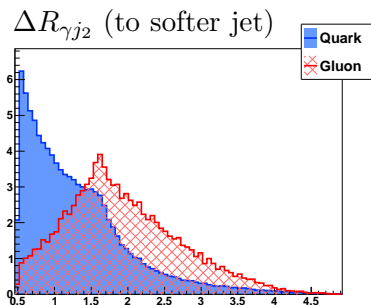
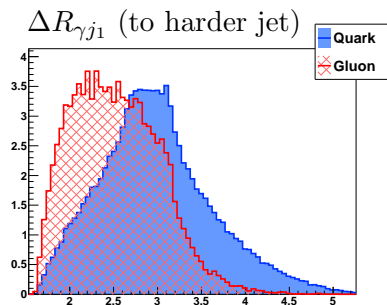
Quark Purification in $\gamma+1\text{jet}$



Kinematics are too similar to do much:

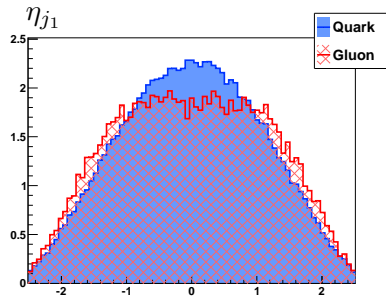
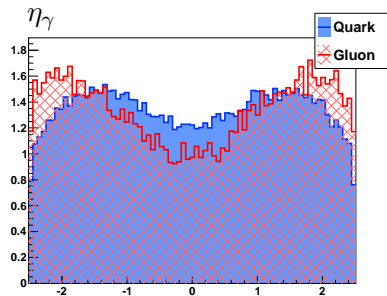
- $gq \rightarrow \gamma q$: Quark signal
- $q\bar{q} \rightarrow \gamma g$: Gluon background

Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet



When the softer jet is quark, The photon is often radiated off of it, rather than the harder jet.

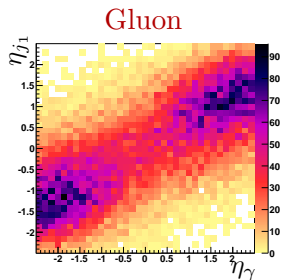
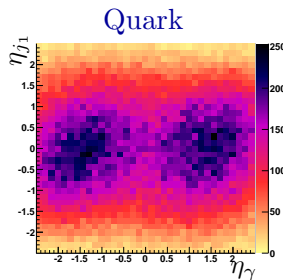
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet



Other useful kinematics (?)

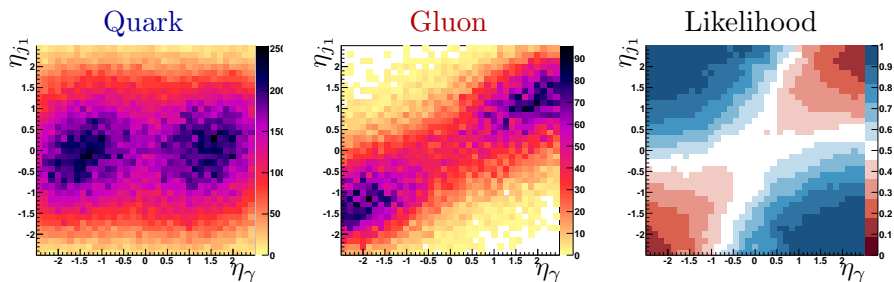
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet

2D version of the same



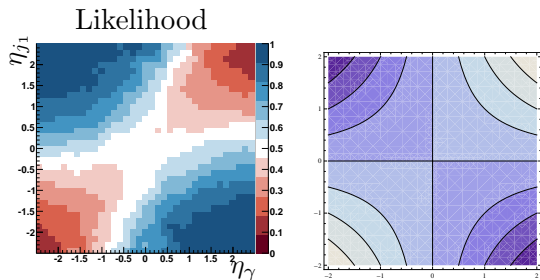
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet

2D version of the same



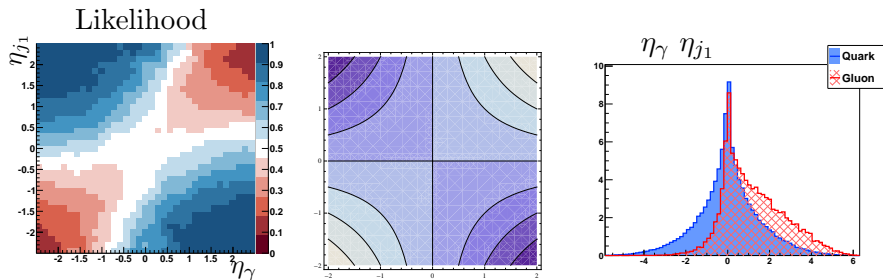
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet

Approximating the Likelihood Contours with $f(x, y) = xy$



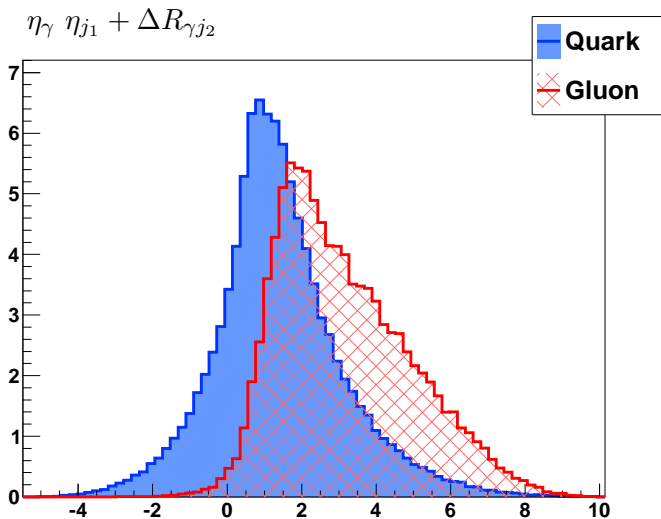
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet

Approximating the Likelihood Contours with $f(x, y) = xy$



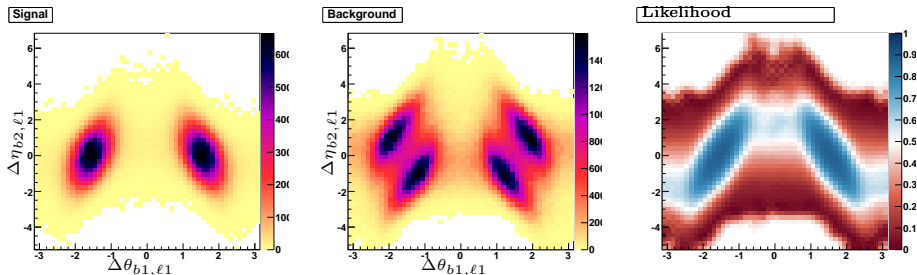
Quark Purification in $\gamma+2\text{jet}$: Look at Softer Jet

Do it again to find an even better combination

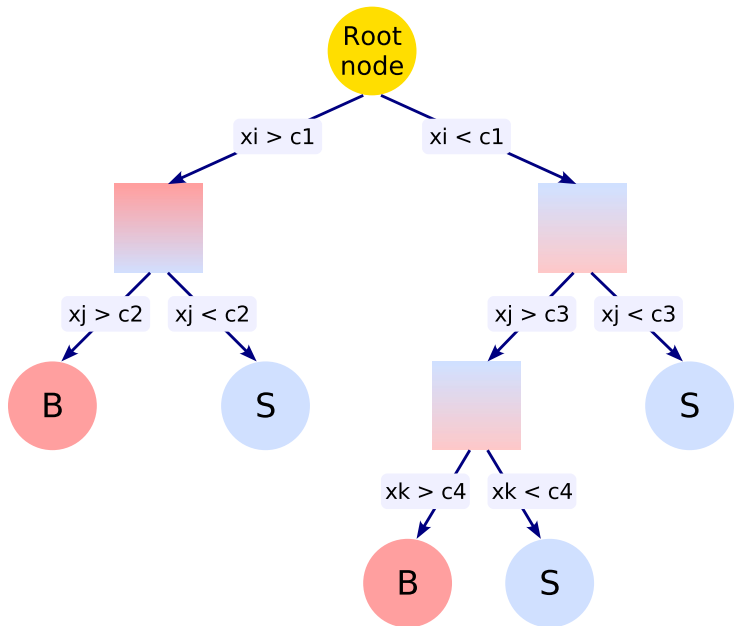


Automating the process with Boosted Decision Trees

Some totally crazy illustrative example from my Higgs+ Z work:

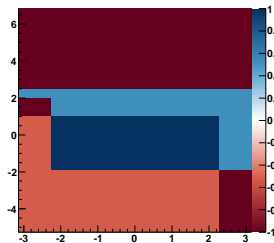


Automating the process with Boosted Decision Trees

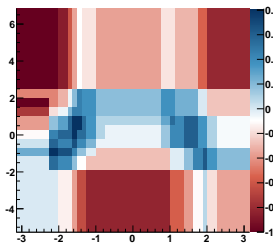


Do Not *Fear* Boosted Decision Trees

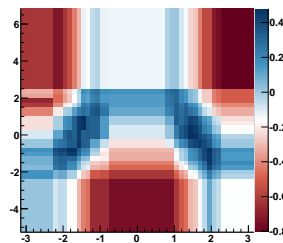
BDT 2



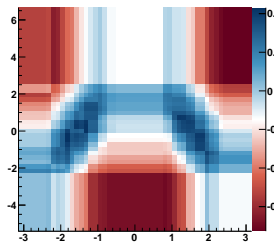
BDT 8



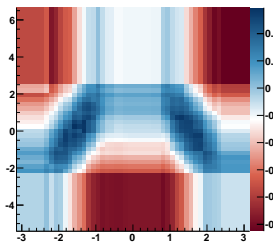
BDT 32



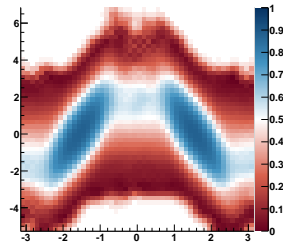
BDT 64



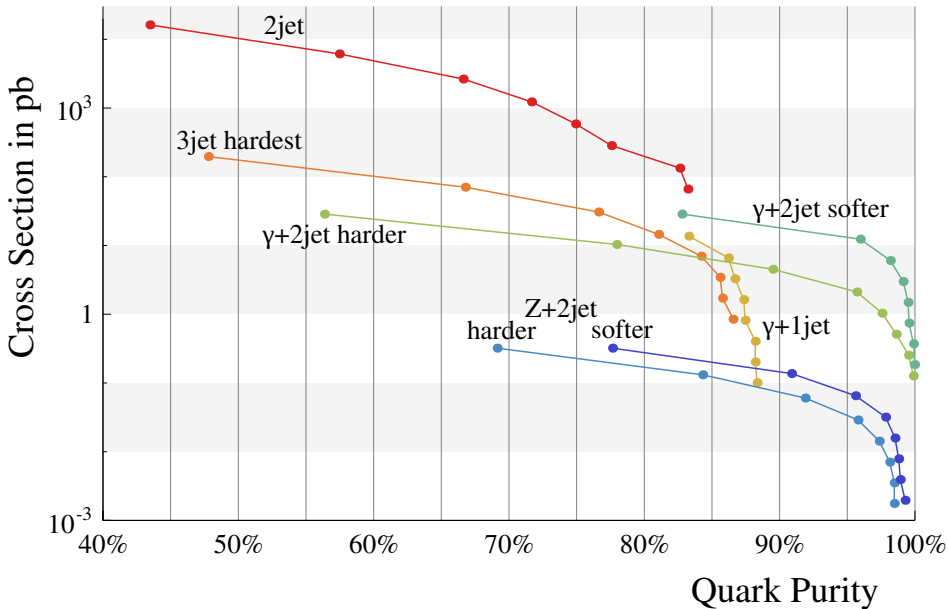
BDT 256



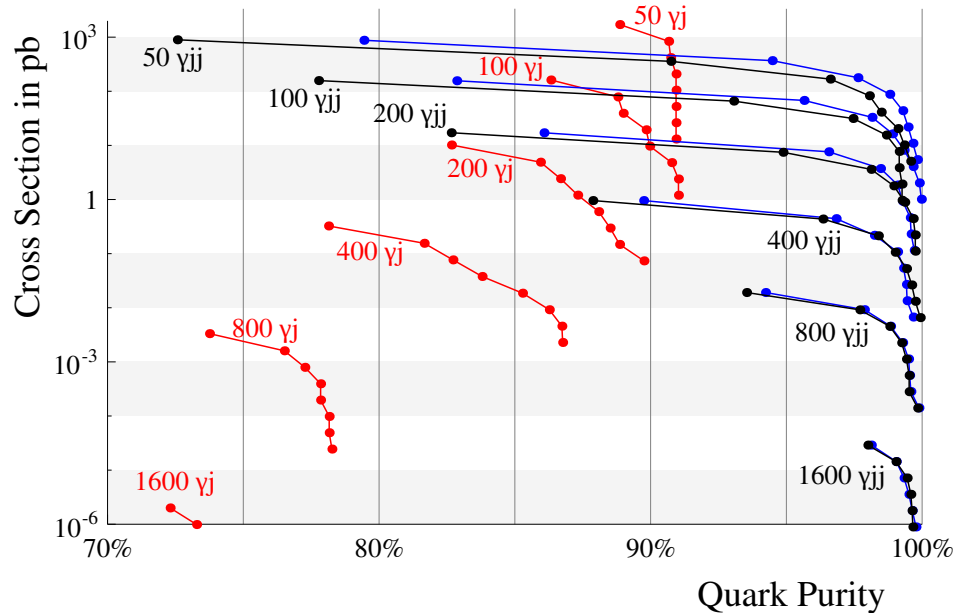
Likelihood



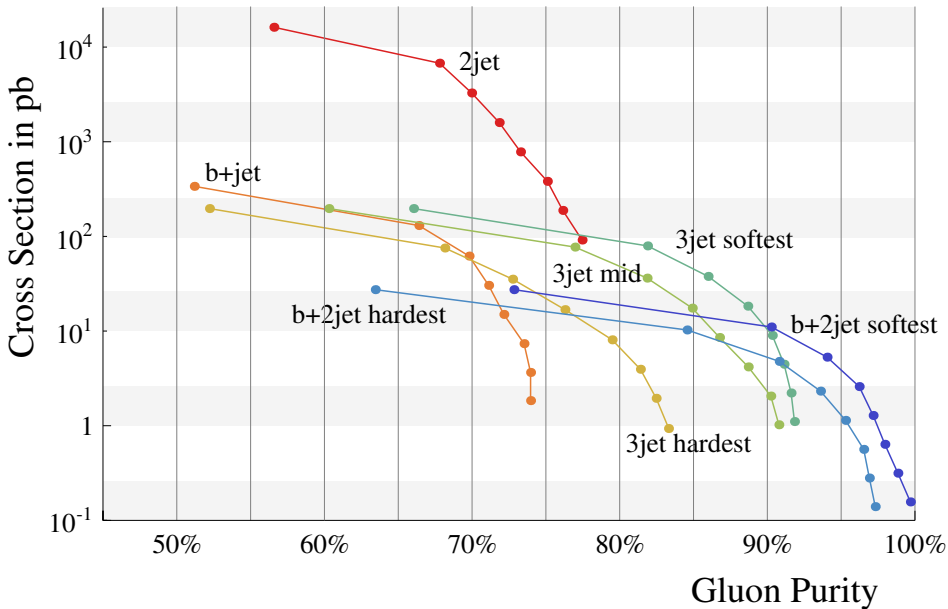
200 GeV Quark Purity



Quark Purity for Different p_T



200 GeV Gluon Purity



Summary of Finding Samples

- **Quark** samples at 99% purity for γ +jet
- **Gluon** samples at 90%-95% purity for 3jets

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Summary of Finding Samples

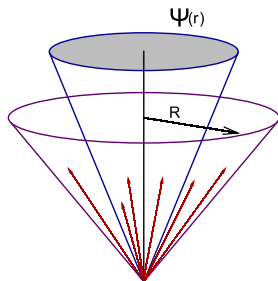
- **Quark** samples at 99% purity for γ +jet
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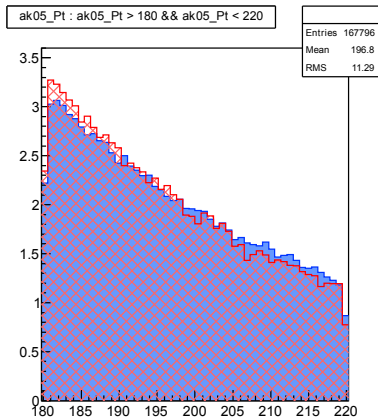
Now go forth and use these tools for good.... Thanks!

In case waving my hands proves insufficient ...

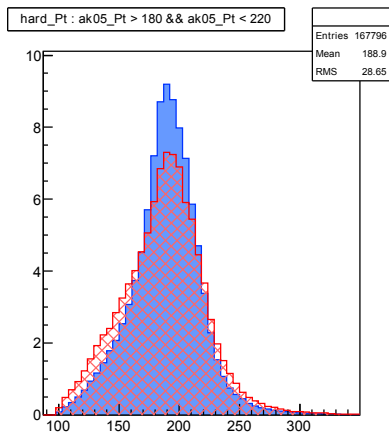
- Number of charged tracks
- Jet Shape (shown)
- LEP $e^+e^- \rightarrow Zg \rightarrow b\bar{b}g$



Event Generation

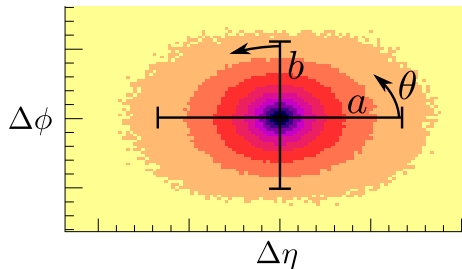


Jet p_T : anti- k_T R=0.5

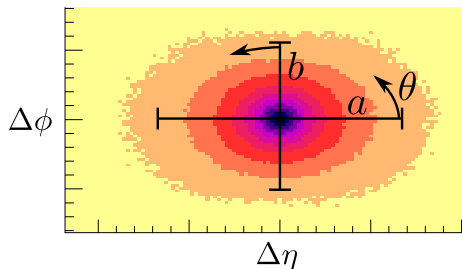


Hard Parton p_T

Covariance Tensor:
$$\mathbf{C} = \sum_{i \in \text{jet}} \frac{p_T^i}{p_T^{\text{jet}}} \begin{pmatrix} \Delta\eta_i \Delta\eta_i & \Delta\eta_i \Delta\phi_i \\ \Delta\phi_i \Delta\eta_i & \Delta\phi_i \Delta\phi_i \end{pmatrix}$$



Covariance Tensor:
$$\mathbf{C} = \sum_{i \in \text{jet}} \frac{p_T^i}{p_T^{\text{jet}}} \begin{pmatrix} \Delta\eta_i \Delta\eta_i & \Delta\eta_i \Delta\phi_i \\ \Delta\phi_i \Delta\eta_i & \Delta\phi_i \Delta\phi_i \end{pmatrix}$$



Combination of Eigenvalues

Girth: $g = \sqrt{a^2 + b^2}$

Determinant: $\det = a \cdot b$

Ratio: b/a

Eccentricity: $\epsilon = \sqrt{a^2 - b^2}$

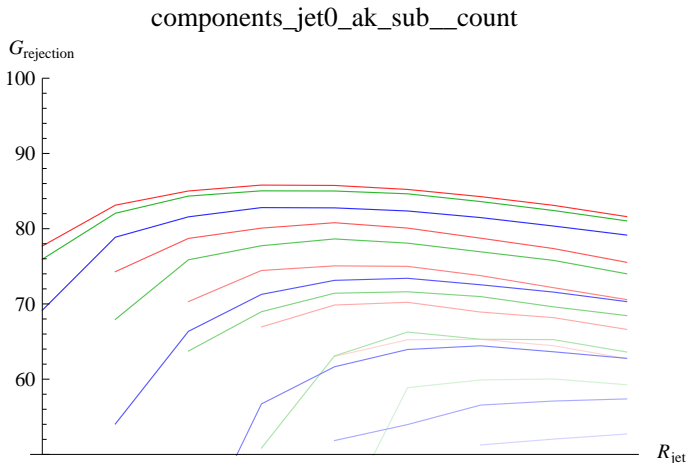
Planar Flow: $pf = \frac{4ab}{(a+b)^2}$

Orientation: θ

Not useful for Q vs G: first emission sets this shape, and has similar 2-body kinematics.

Subjets – Smaller is Better

- Subjet Algorithm: anti- k_T , CA, k_T
- Subjet Size: Darkest is $R_{\text{sub}} = 0.1$, lightest $R_{\text{sub}} = R_{\text{jet}}$



(Background Rejection at 50% Quark vs Initial Jet Size)

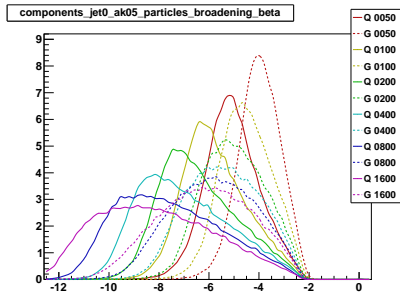
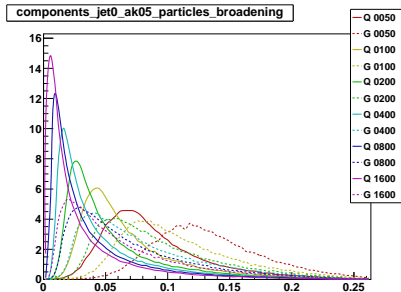
Explosion of Variables

- Different Jet sizes ($R = 0.1, 0.2, 0.4, 0.7, 1.0, 1.4, \dots$)
- Different Jet definitions (anti-kt, kt, CA, SisCone)
- Different Generators: Pythia vs Herwig
- Different Samples: Dijet vs γ +jet vs 8-Jets
- Different Subjet sizes and types
- Different Powers in the various moments
- Charged Tracks or Calorimeter deposits?

And different variables are better for different Jet p_T ranges.

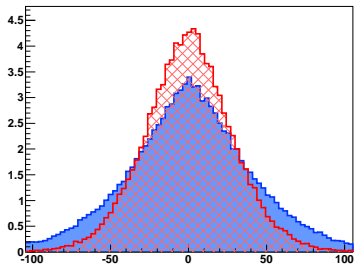
Jet Broadening similar to linear moment for small-angles: $k_T \approx p_T r$

$$B_{\text{jet}} = \frac{\sum_i |\vec{p}_i \times \hat{n}_{\text{jet}}|}{\sum_i |\vec{p}_i|} = \frac{\sum_i |\vec{k}_{Ti}|}{\sum_i |\vec{p}_i|}$$

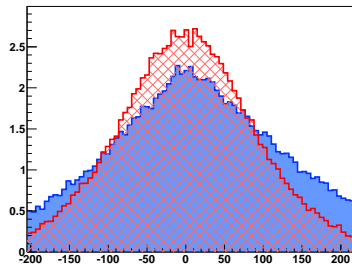


Charge Weighted by p_T

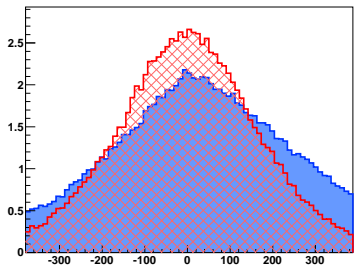
50 GeV



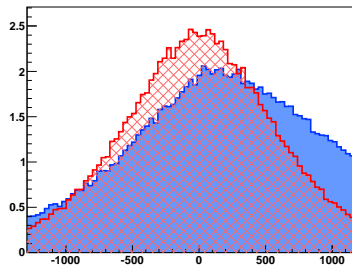
200 GeV



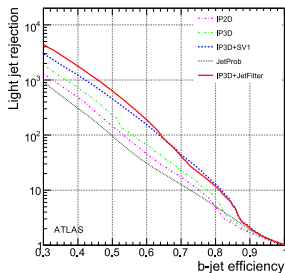
400 GeV



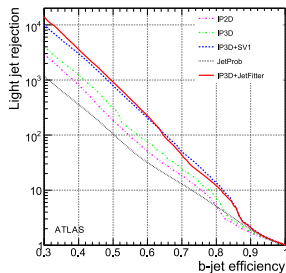
1600 GeV



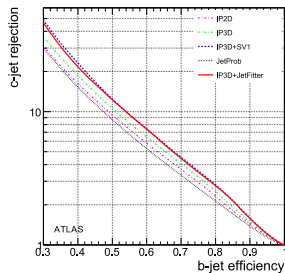
Compare to ATLAS B-Tagging



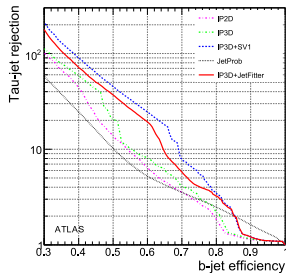
(a) Non-purified light jets



(b) Purified light jets

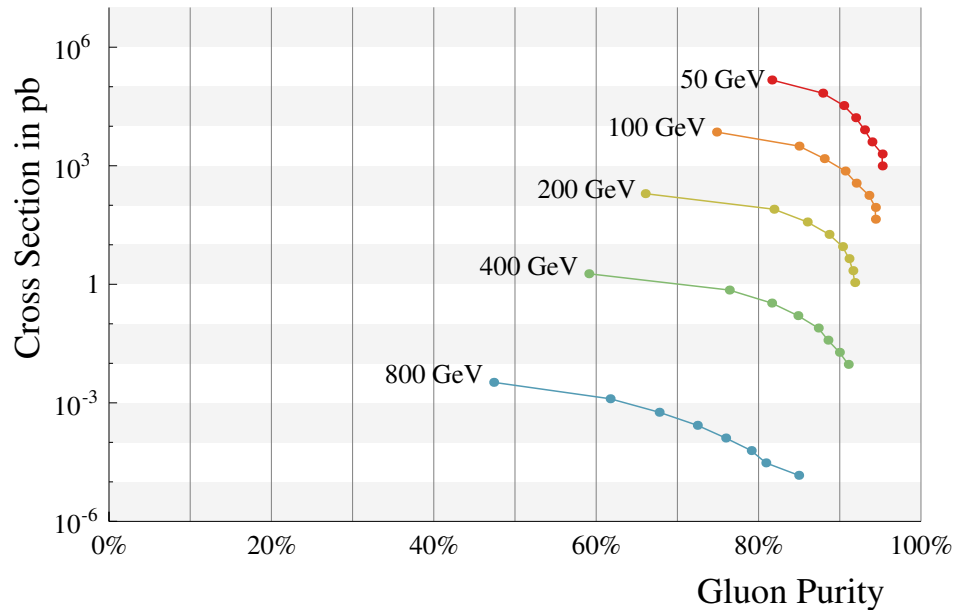


(c) c-jets

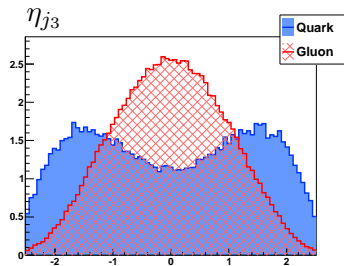


(d) τ -jets

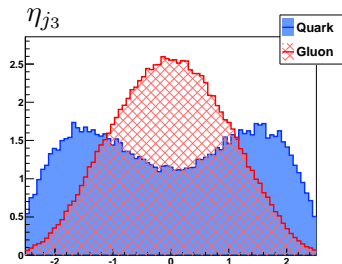
Softest Trijet Gluon Purity



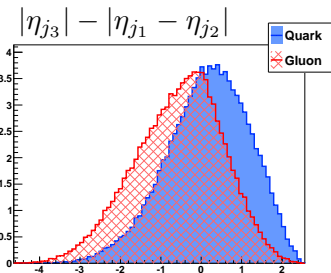
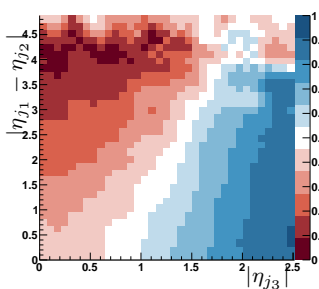
Gluon Purification: Lesson about Harsh Cuts



Gluon Purification: Lesson about Harsh Cuts



Likelihood



Trijet Sample with Different Kinematic Cuts

