

# Jet Substructure Without Trees

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# Goal: Find Hard Scales in Jets

- Define an angular correlation function
- Define an angular transform to find important scales
- Construct a robust method for finding structure in the transform
- Define IRC safe observables that can be used to characterize the structure of a jet
- Test by constructing a top tagger

# Angular Correlations

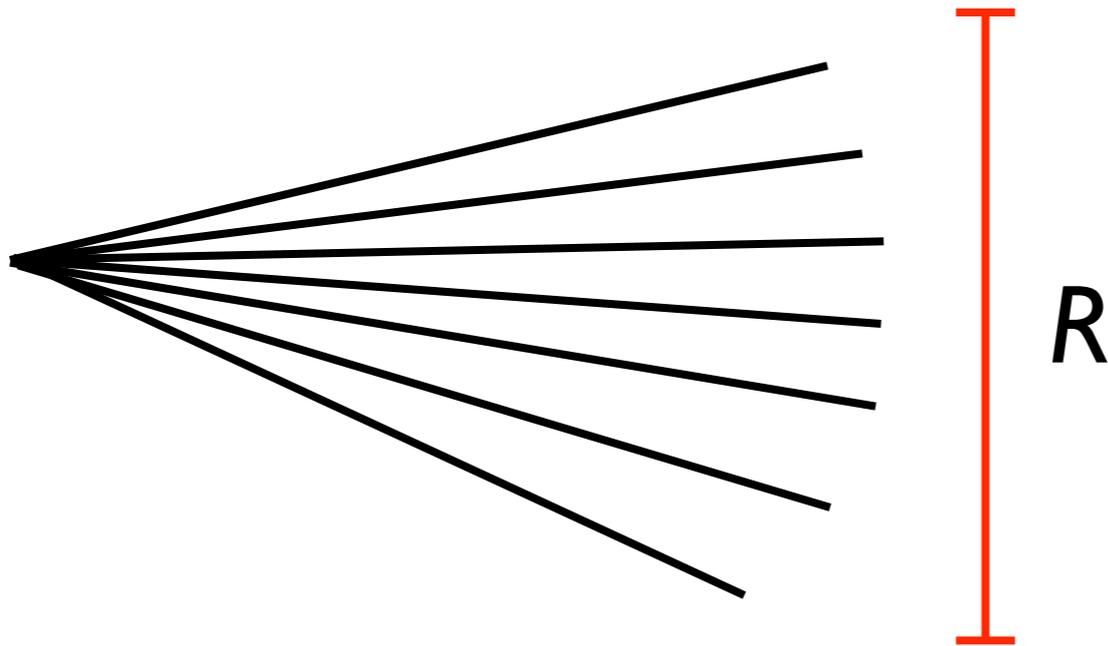
- For any IRC safe set of particles  $\{i\}$ :

$$\mathcal{G}(R) \equiv \frac{\sum_{i \neq j} p_{Ti} p_{Tj} \Delta R_{ij}^2 \Theta(R - \Delta R_{ij})}{\sum_{i \neq j} p_{Ti} p_{Tj} \Delta R_{ij}^2} \approx \frac{\sum_{i \neq j} p_i \cdot p_j \Theta(R - \Delta R_{ij})}{\sum_{i \neq j} p_i \cdot p_j}$$

- $R$  is **not** measured wrt jet center
- Distinct from angular profile
- Quantifies jet scaling in an IRC safe way

# Angular Correlations

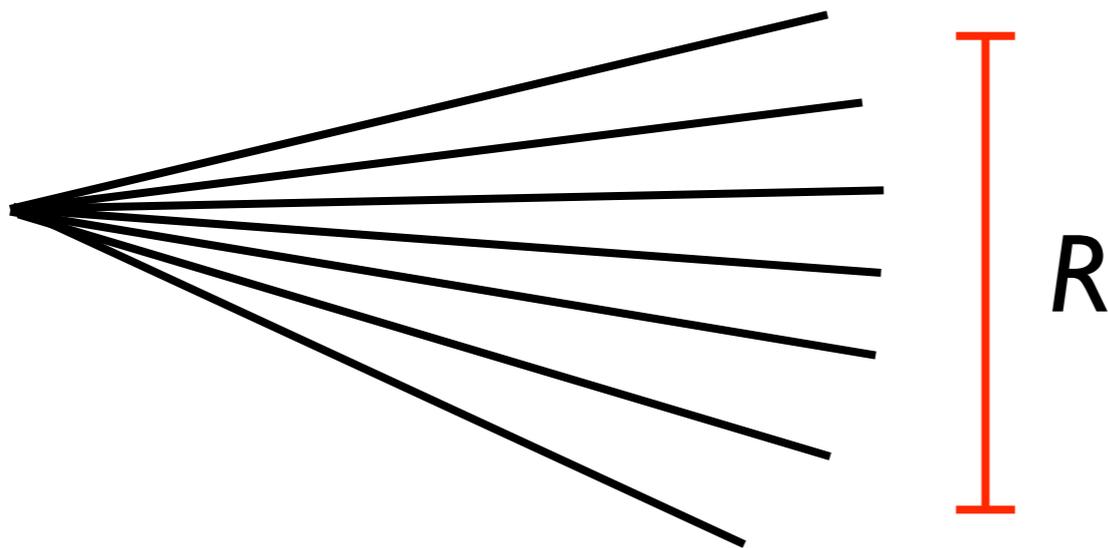
- What is the physical picture?
- Jet with  $\sim$ no substructure



- Angular correlation function is smooth
- In QCD,  $\mathcal{G}(R) \sim R^2$

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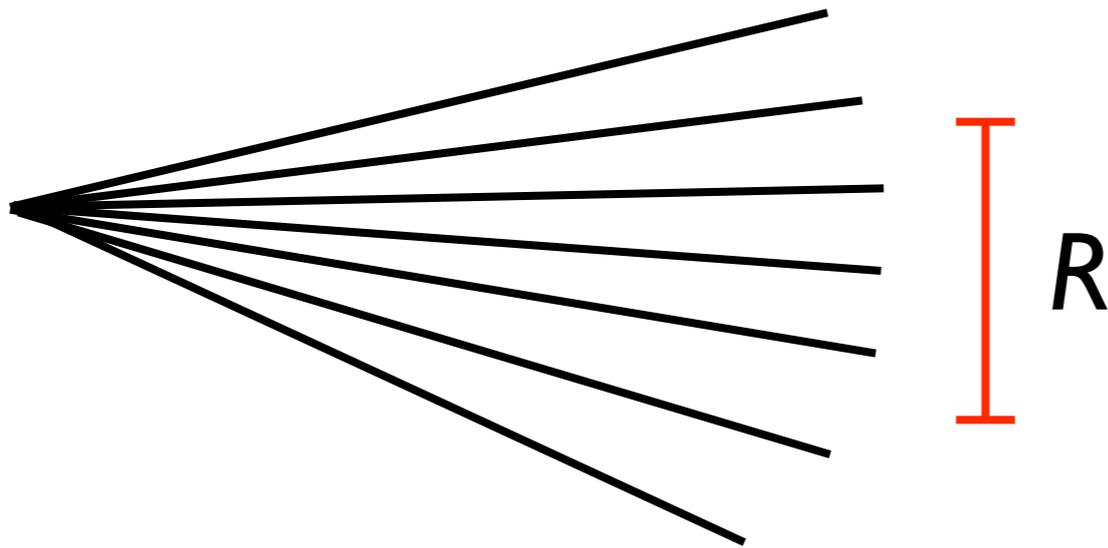
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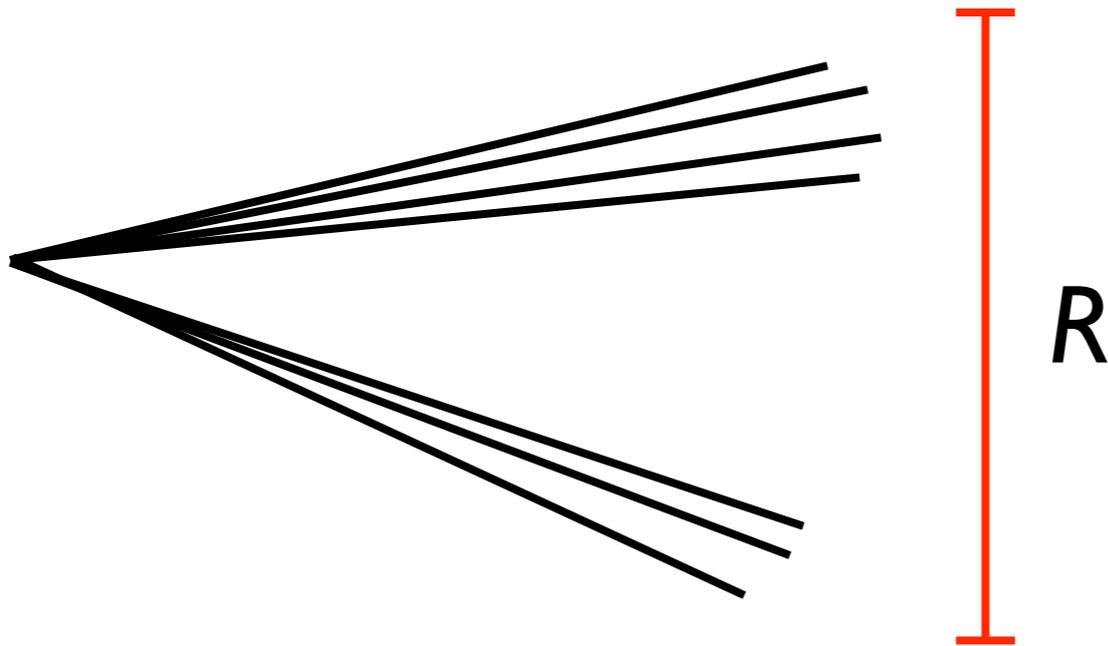
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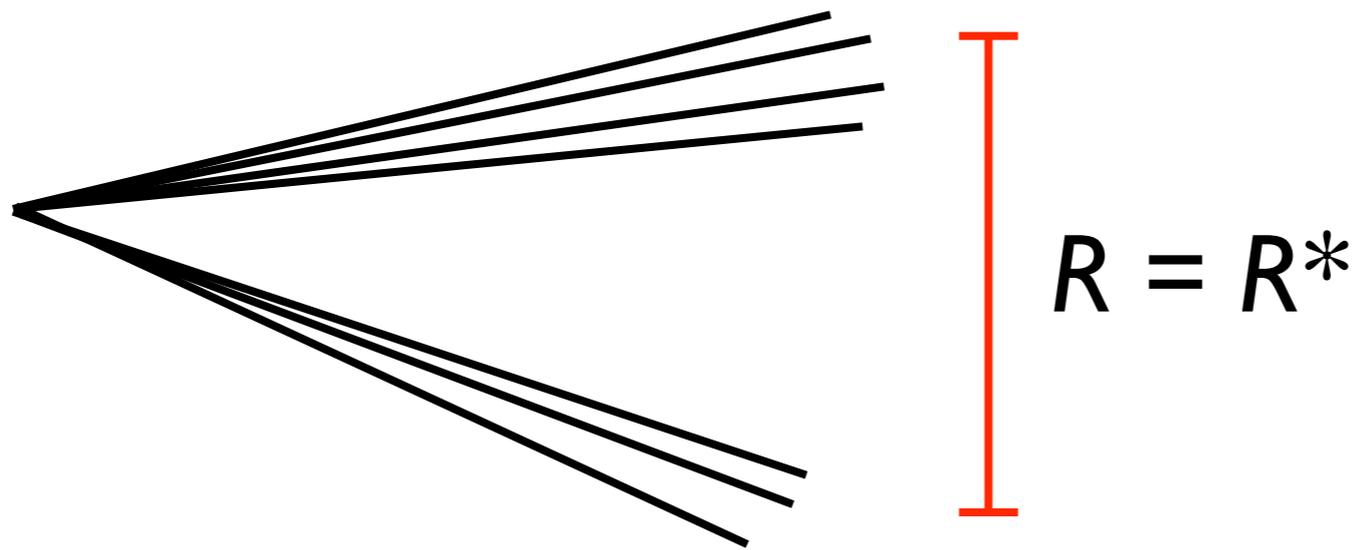
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- $\mathcal{G}(R) \sim 1$

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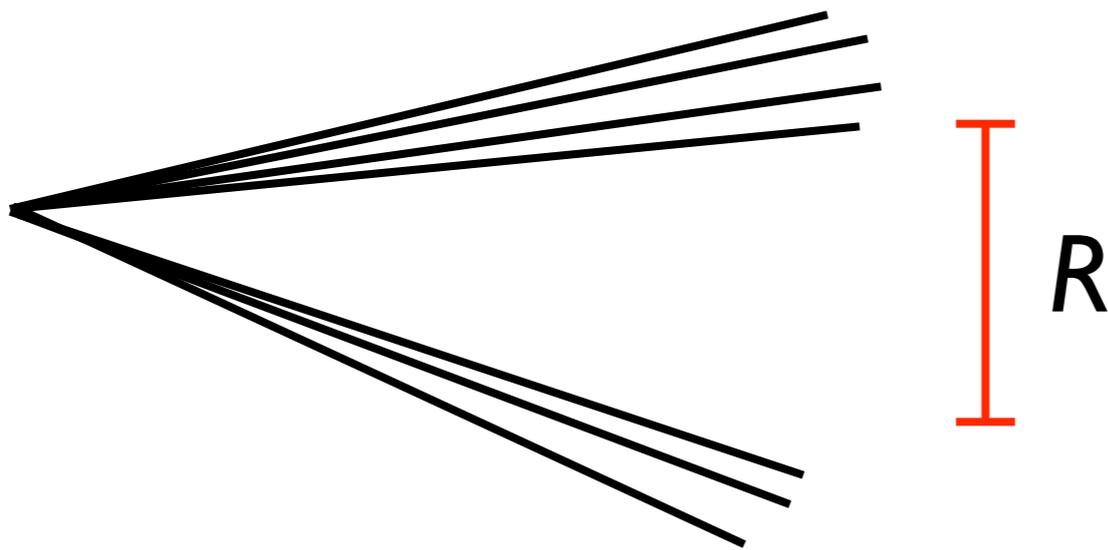
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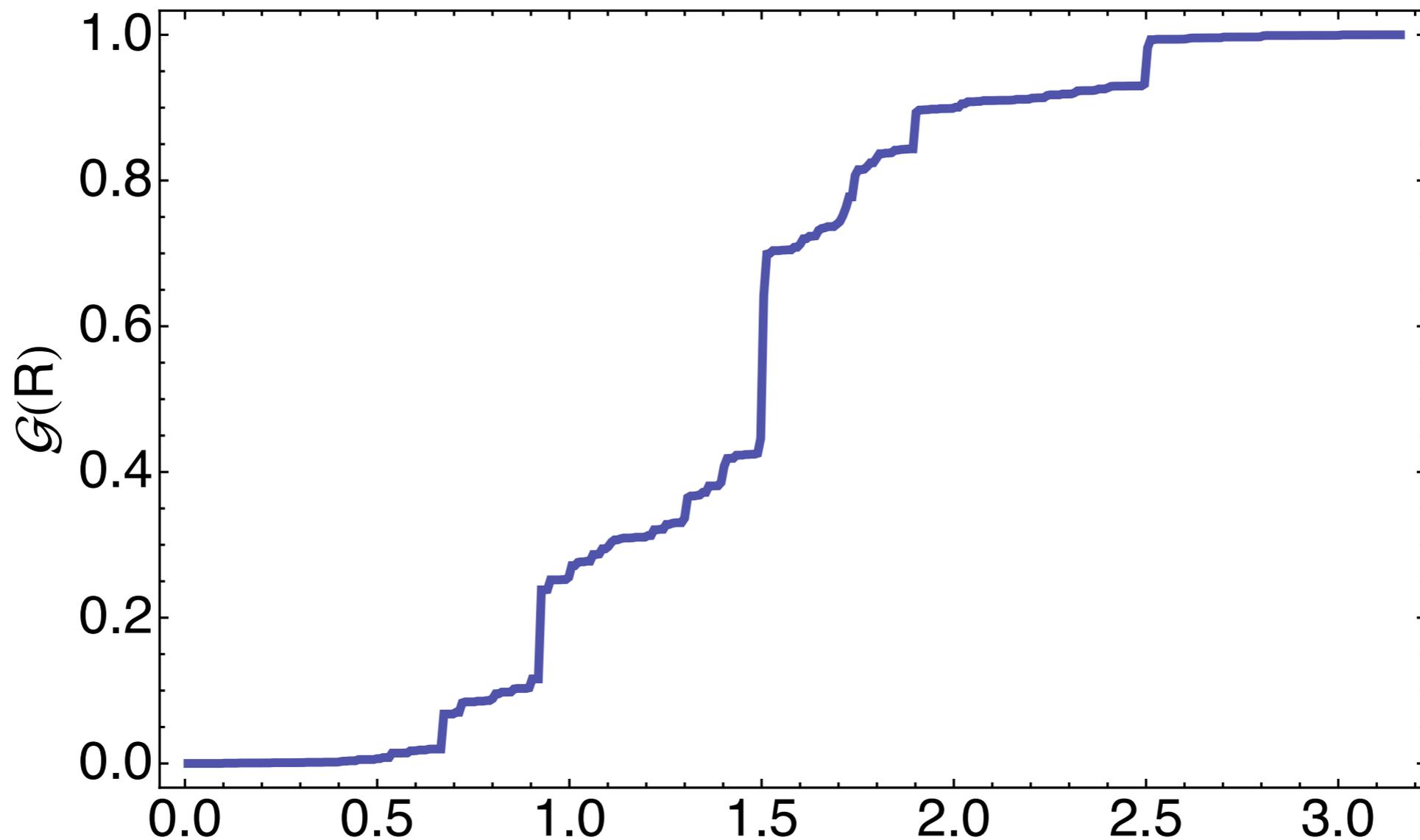
- What is the physical picture?
- Jet with substructure



- $\mathcal{G}(R) \sim 0$
- Angular correlation is discontinuous at  $R^*$

# Angular Correlations

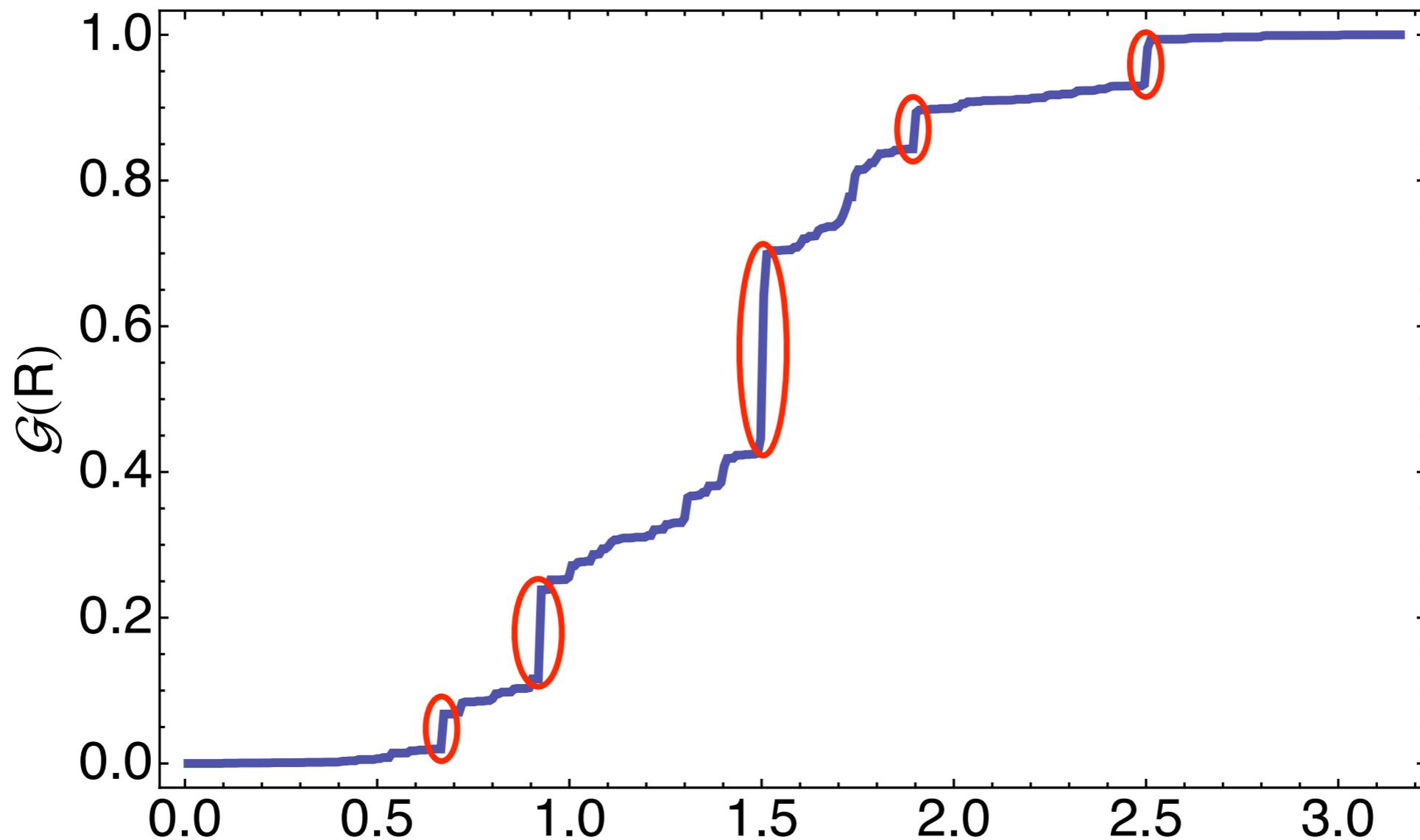
- Ledges in  $\mathcal{G}(R)$  = separation of hard subjects



- $\mathcal{G}(R)$  for a top quark jet<sup>R</sup>

# Angular Correlations

- Ledges in  $\mathcal{G}(R)$  = separation of hard subsets



- Which correspond to  $R$  something physical?

# Angular Structure

- How to find ledges
  - Find peaks in the derivative!
  - Problem: really want ratio of masses
  - Take derivative of  $\log \mathcal{G}(R)$

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- How to find ledges
  - Find peaks in the derivative!
  - Problem: really want ratio of masses
  - Take derivative of  $\log \mathcal{G}(R)$
- QCD is  $\sim$ scale invariant
  - Take derivative wrt  $\log R$
  - Reduces noise at small  $R$

# Angular Structure

- Look for peaks in  $d \log \mathcal{G}(R) / d \log R$

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- Look for peaks in  $d \log \mathcal{G}(R) / d \log R$
- Angular structure function:

$$\Delta \mathcal{G}(R) \equiv R \frac{\sum_{i \neq j} p_{Ti} p_{Tj} \Delta R_{ij}^2 K(R - \Delta R_{ij})}{\sum_{i \neq j} p_{Ti} p_{Tj} \Delta R_{ij}^2 \Theta(R - \Delta R_{ij})}$$

- $K$  is taken to be a smooth gaussian kernel:

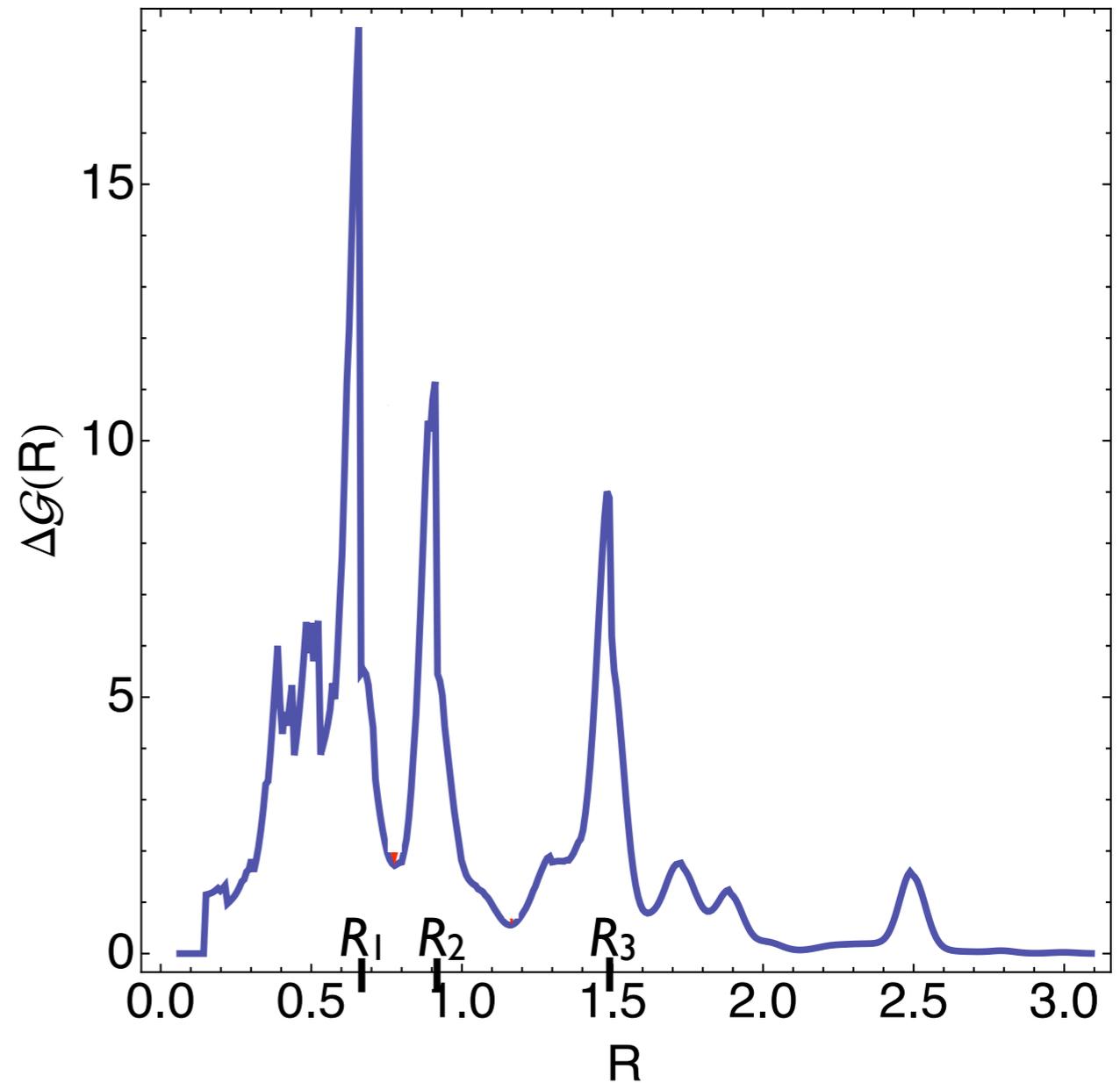
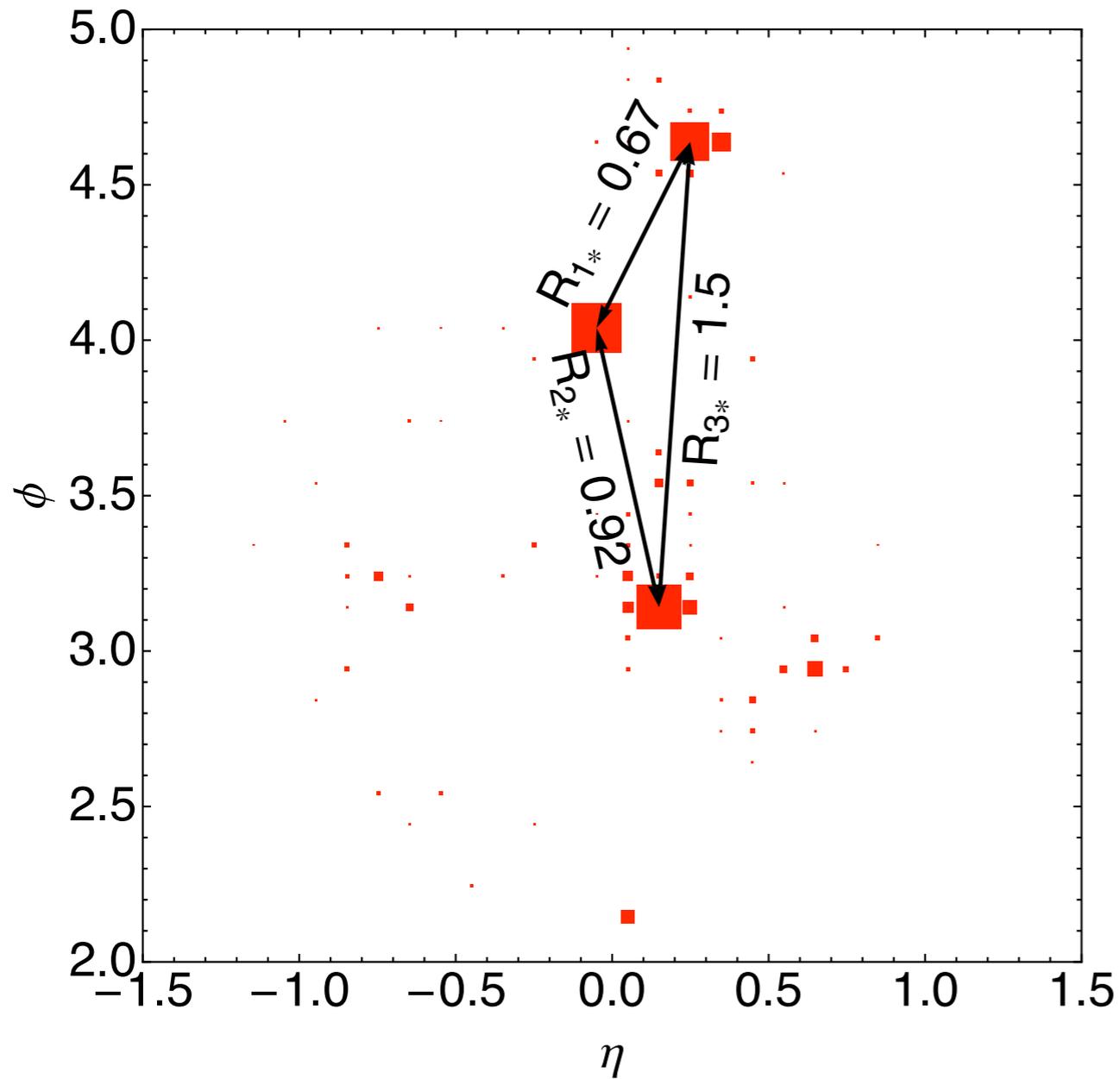
$$\delta(R - \Delta R_{ij}) \simeq \frac{e^{-\frac{(R - \Delta R_{ij})^2}{2dR^2}}}{dR\sqrt{2\pi}}$$

# Angular Structure

Question: Does  $\Delta\mathcal{G}(R)$  determine interesting ledges?

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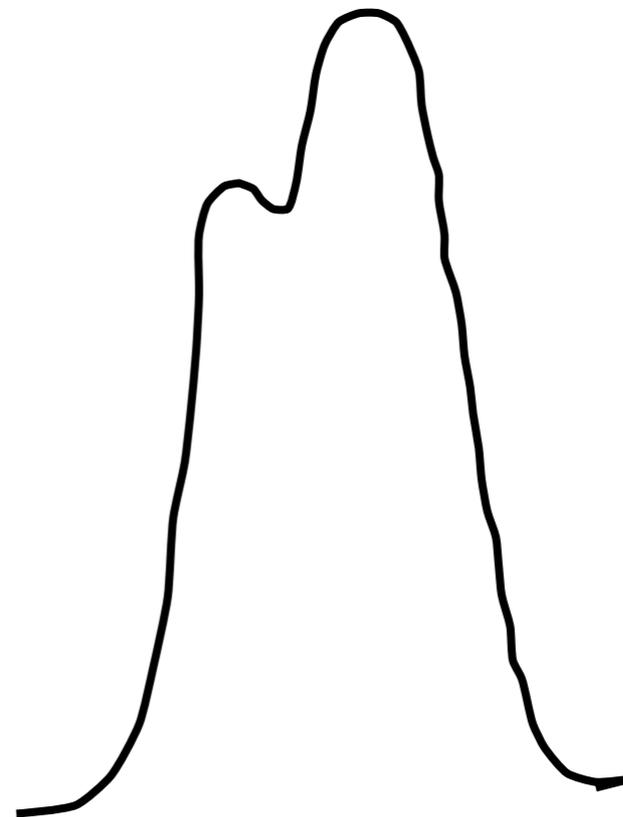


Answer: Yes!

# Prominence

- $\Delta\mathcal{G}(R)$  picks out physical peaks beautifully!
- Still some noise: how can we reduce it?
- How do we define interesting peaks?
  - By height? Why?

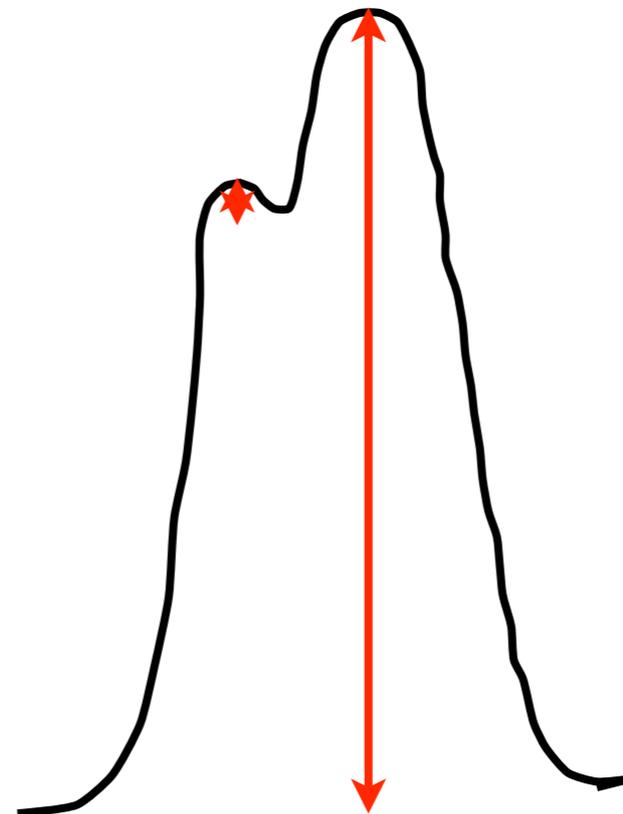
Is the little bump  
interesting?



# Prominence

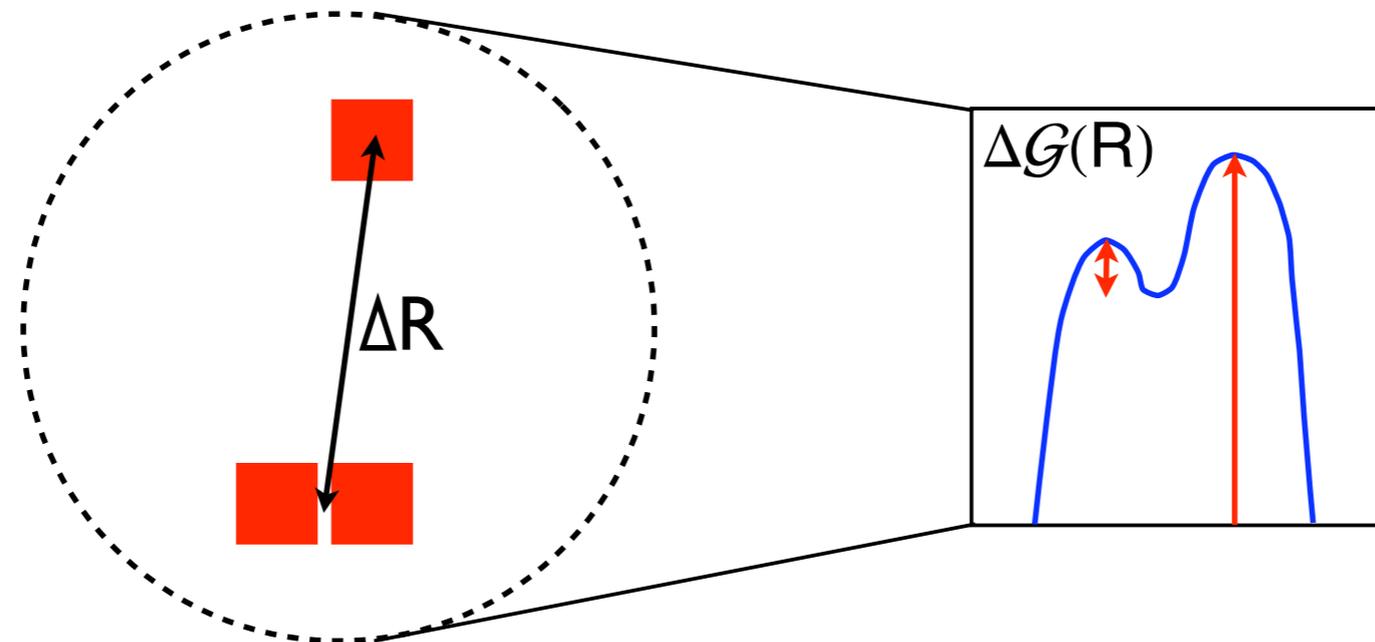
- Proposition: Define peaks by their *prominence*
- Prominence = amount peak sticks out above ambient background

Prominence  
of little bump  
is tiny!



# Prominence

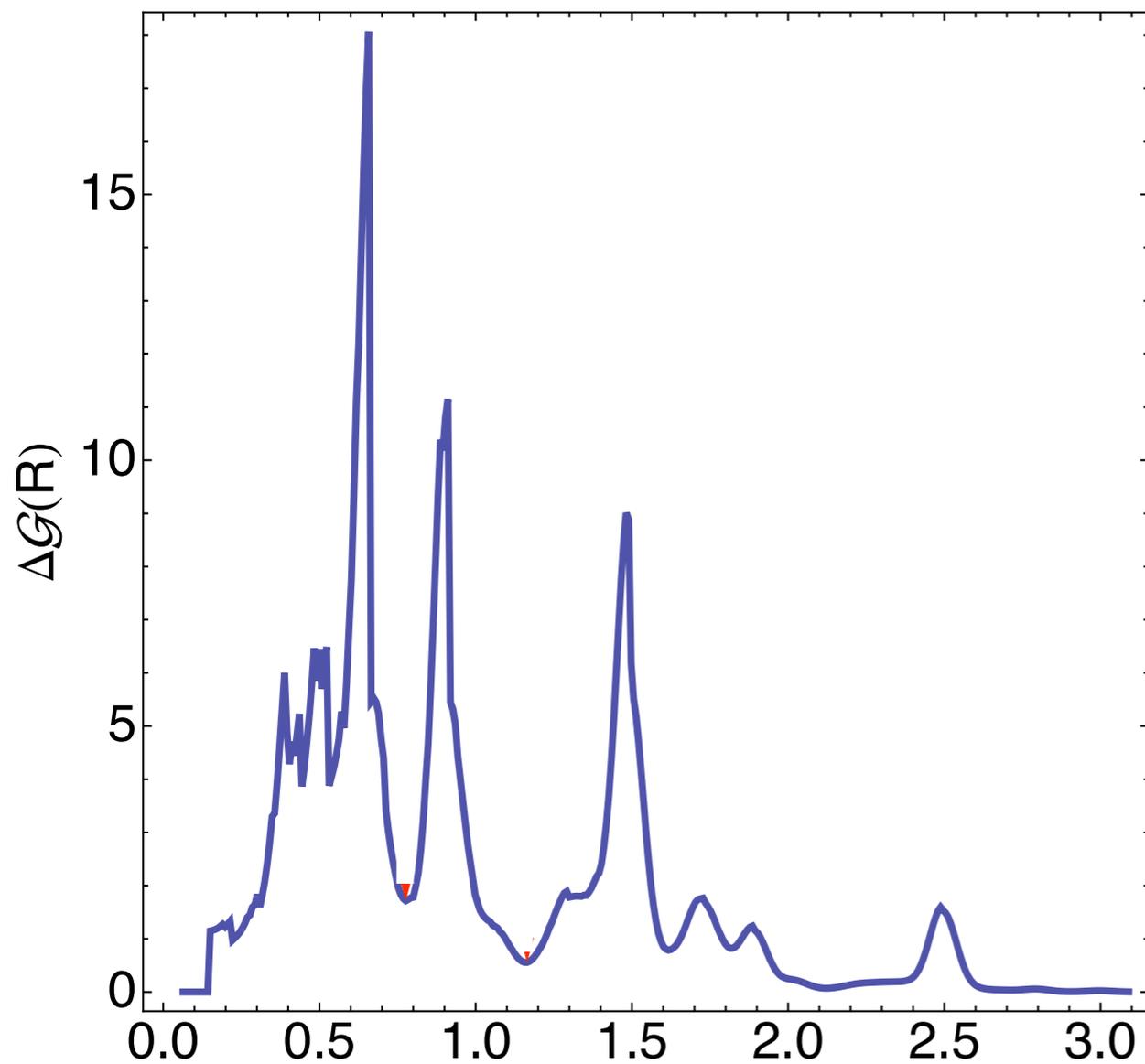
- Possible double counting of angular scales



- Defining interesting peaks by prominence removes double counting ambiguity

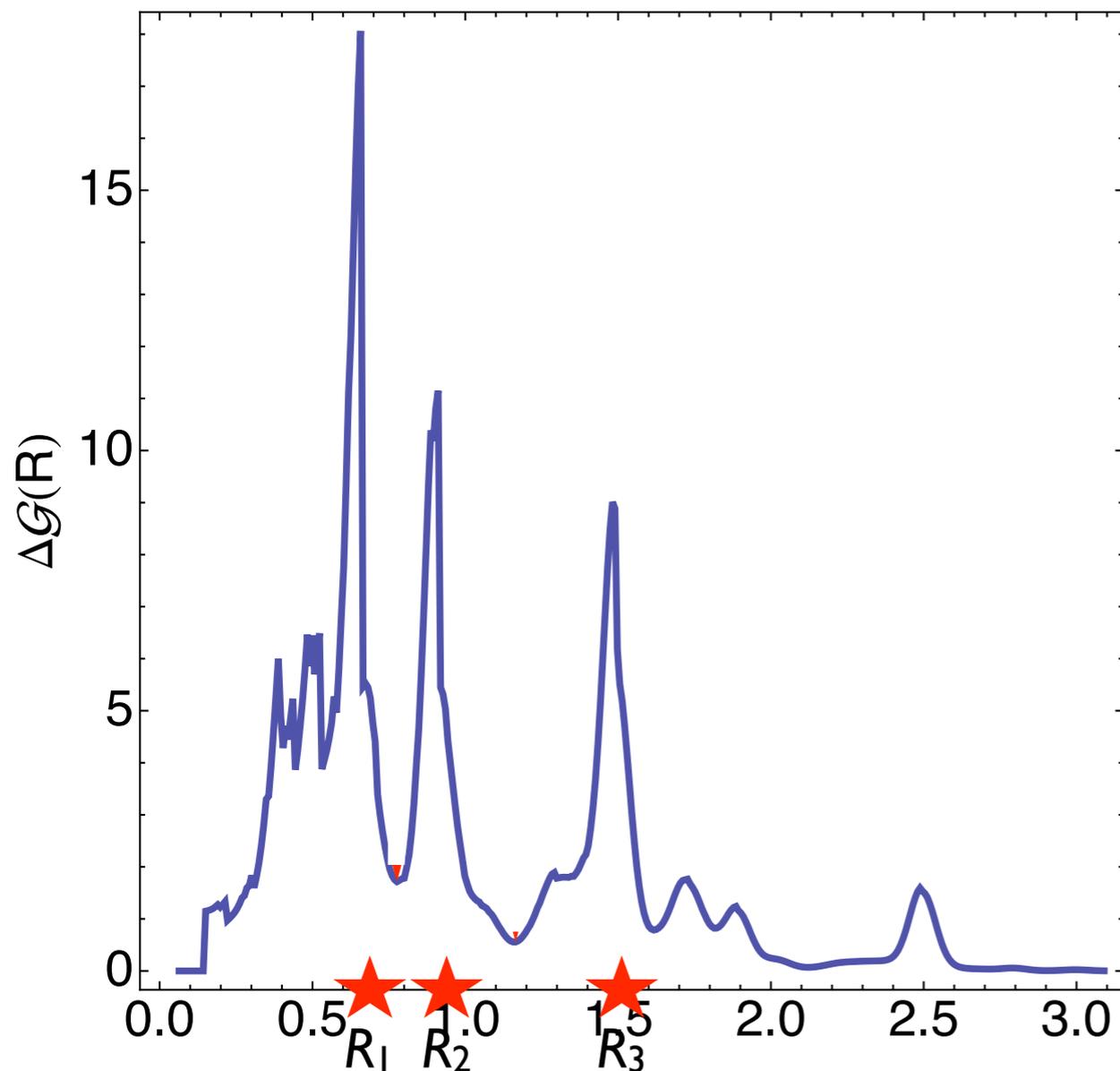
# Defining Observables

- IRC safe observables from  $\Delta\mathcal{G}(R)$ :



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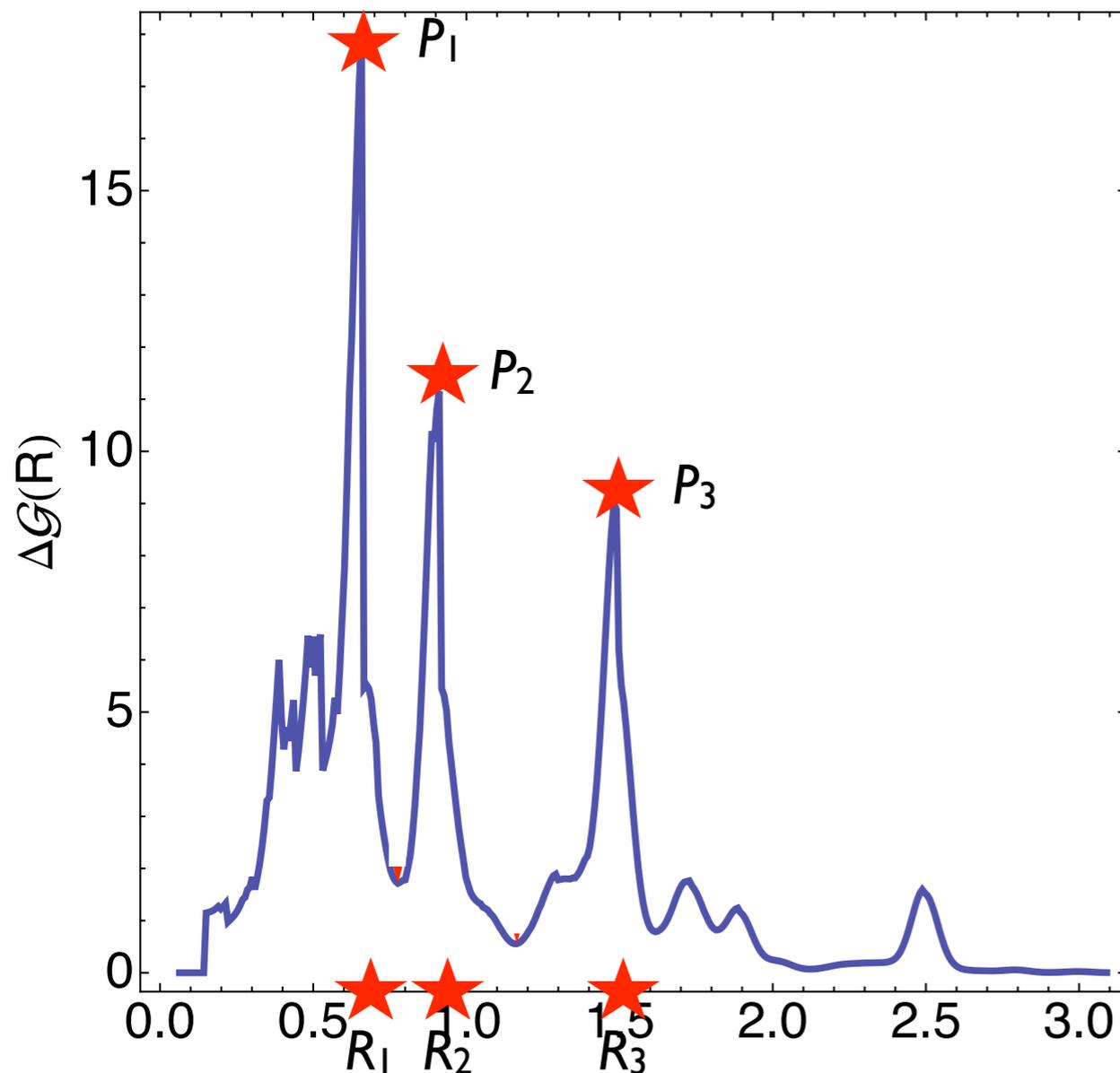
- IRC safe observables from  $\Delta\mathcal{G}(R)$ :



- Entire curve is IRC safe
- Location of peaks in  $R$

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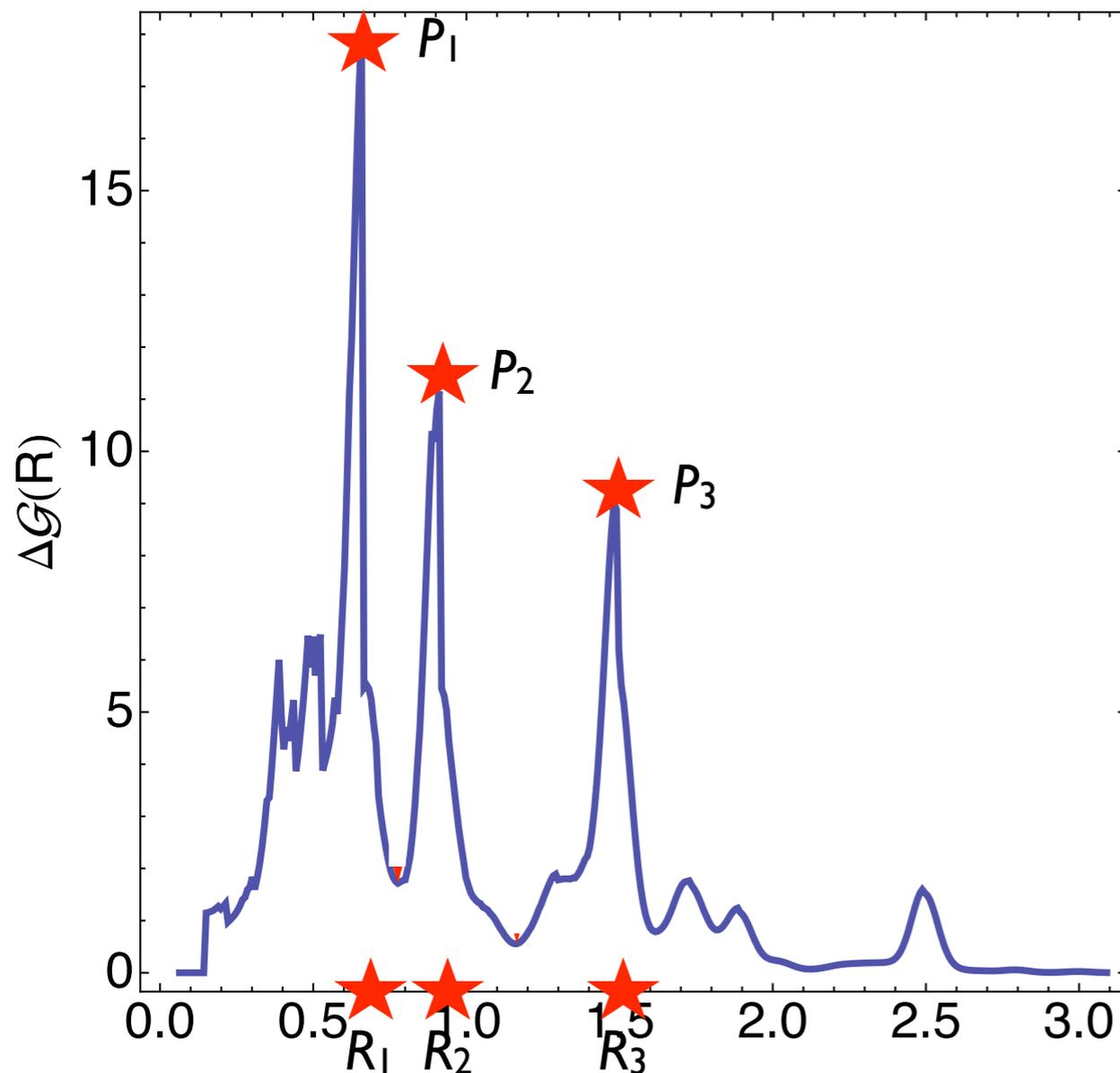
- IRC safe observables from  $\Delta\mathcal{G}(R)$ :



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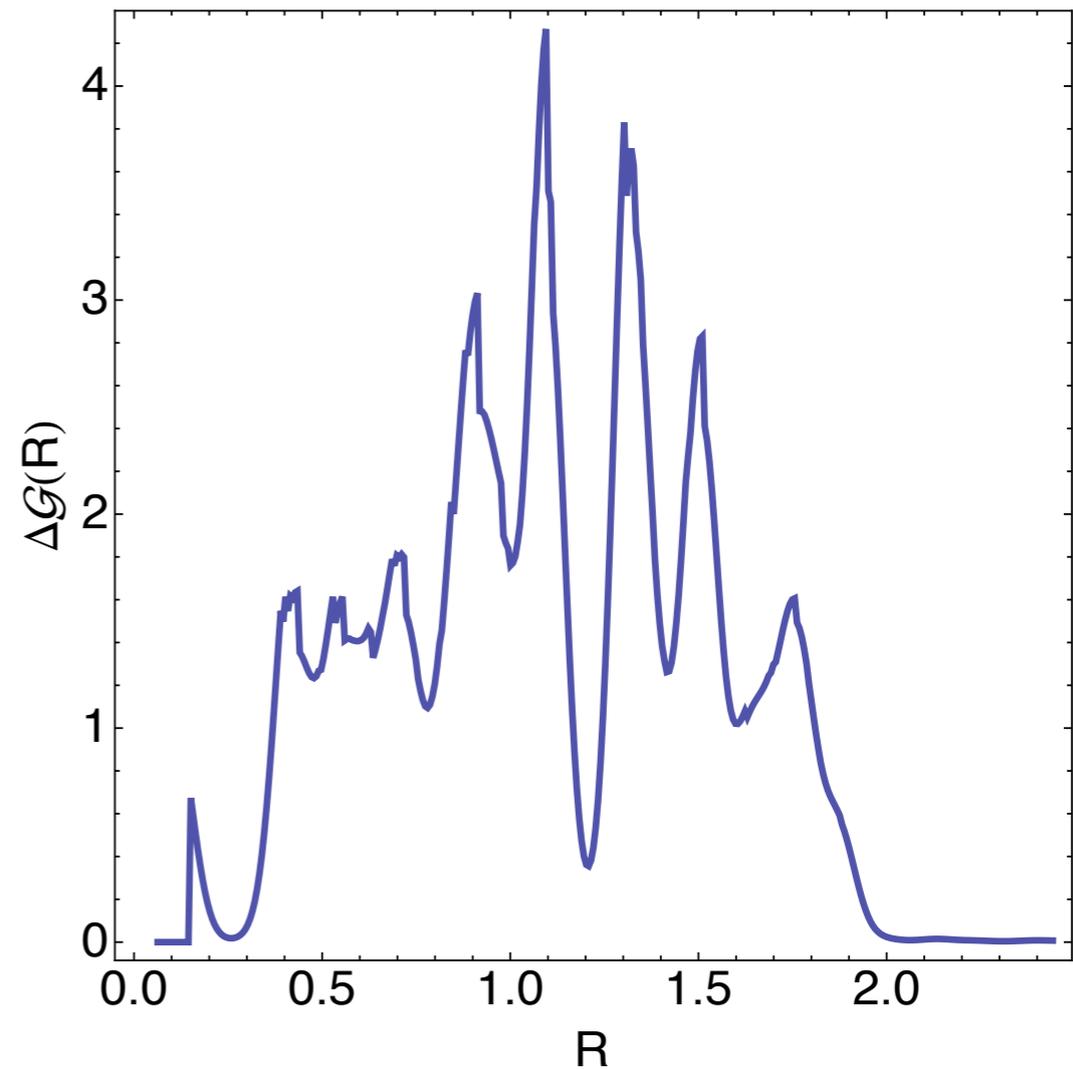
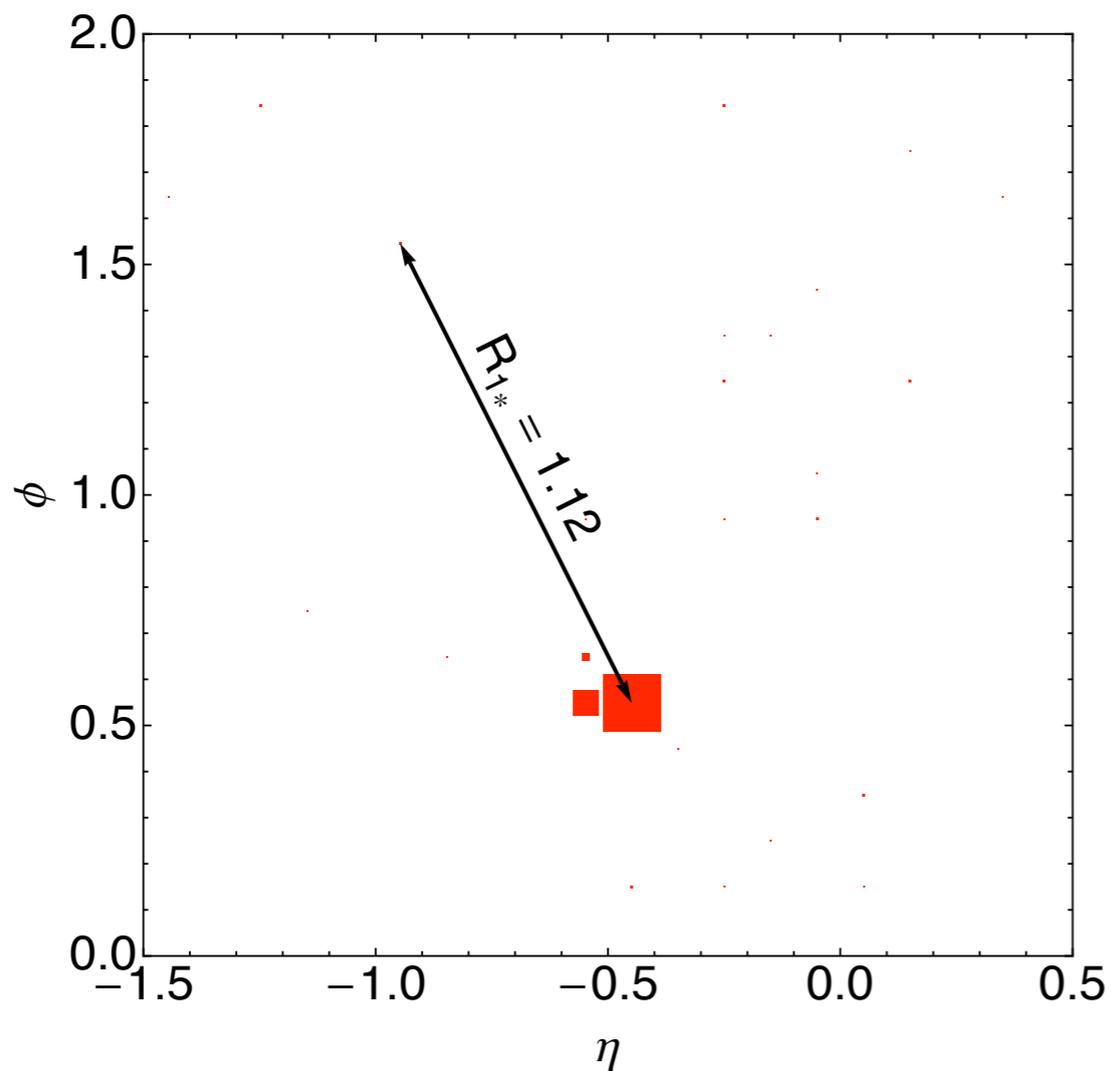
- IRC safe observables from  $\Delta\mathcal{G}(R)$ :



- Location of peaks in  $R$
- Height of peaks
- Number of peaks

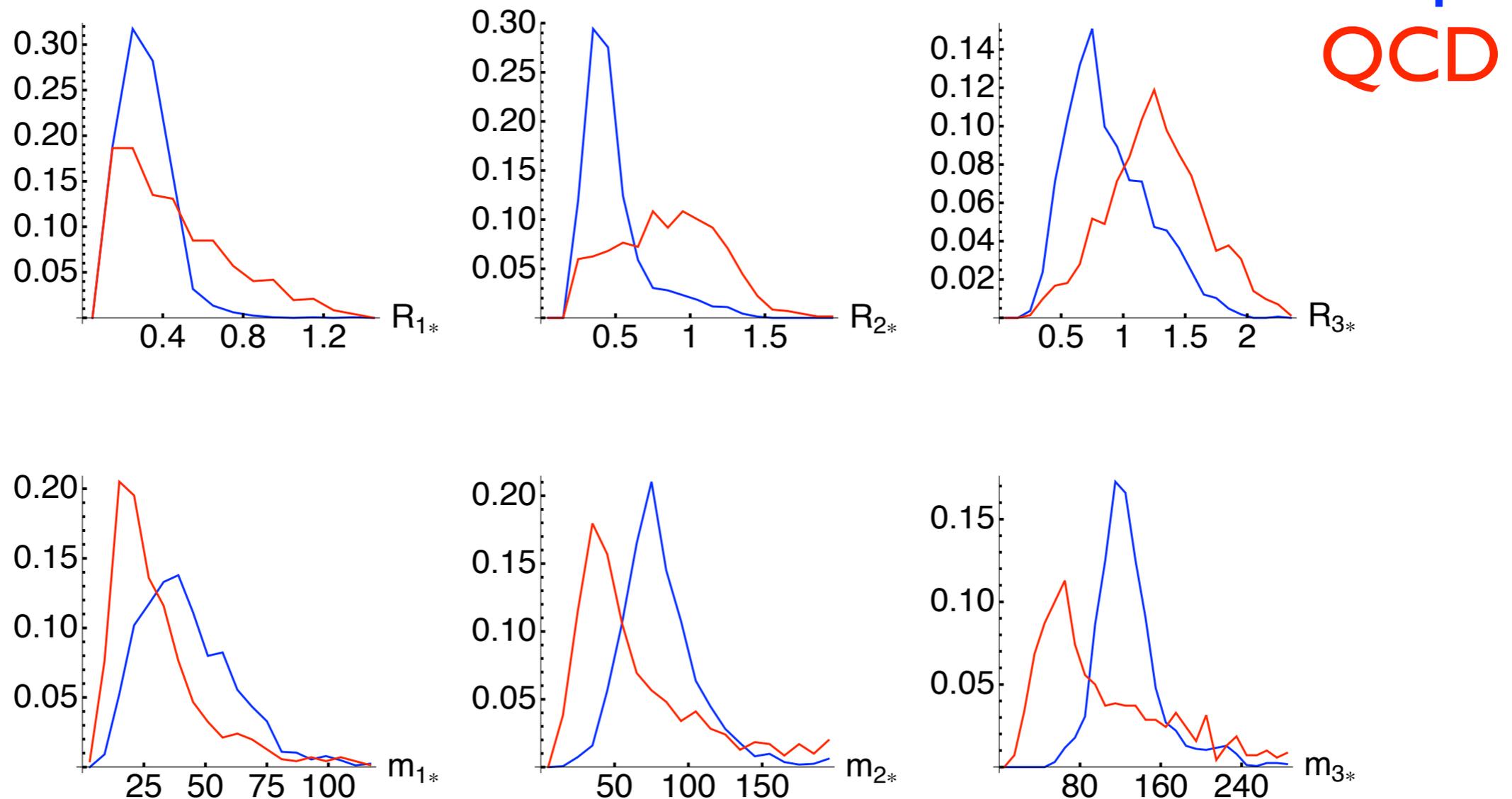
# Current/Future Directions

- Constructed a top tagging algorithm competitive with others in the literature (discussed in paper)



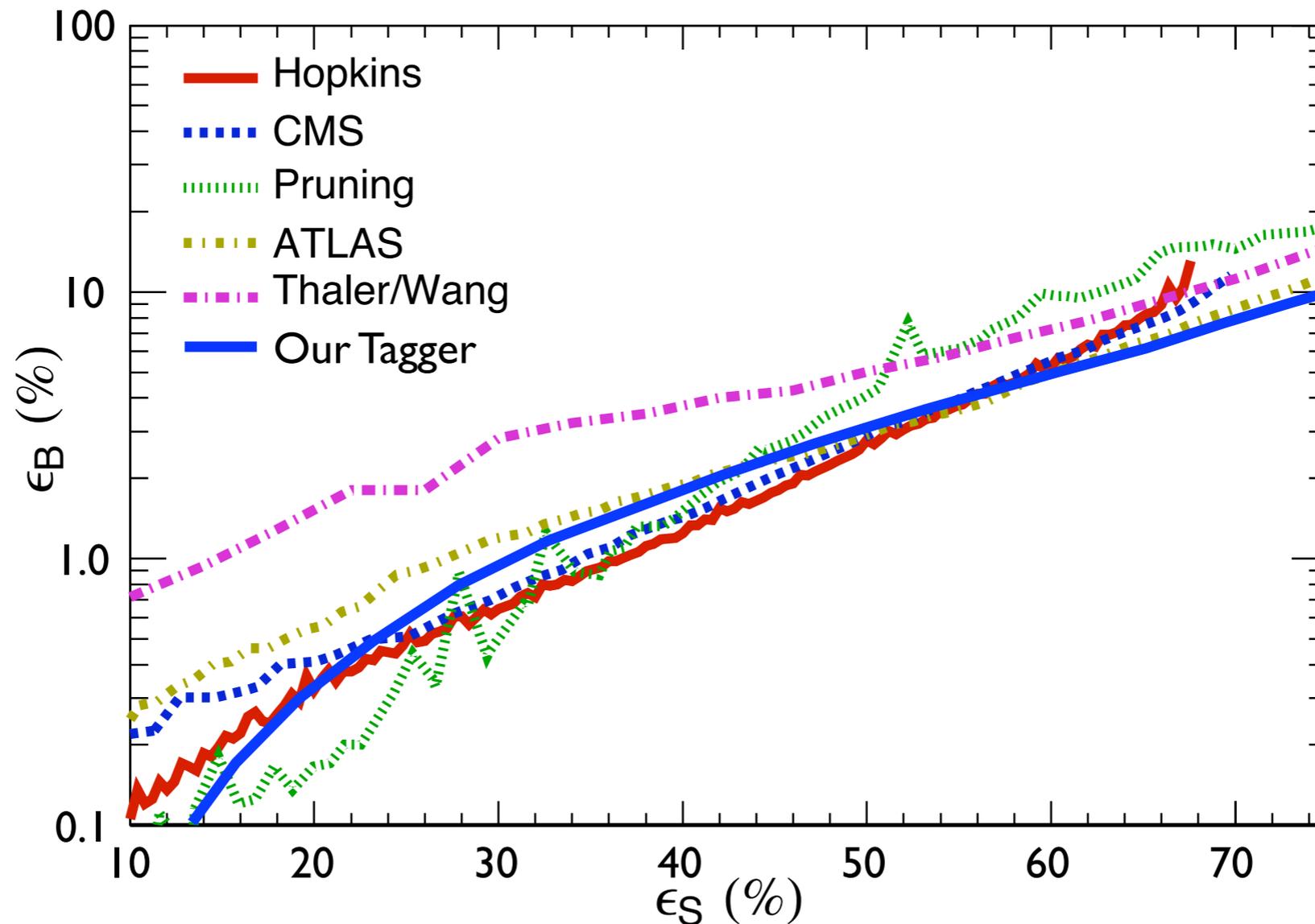
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anti-kT, R=1.0, 500 GeV < pT < 600 GeV

# Back-up Slides

# Prominence

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  - Mt. Rainier, WA



# Jet Substructure Observables

- Our expectations:

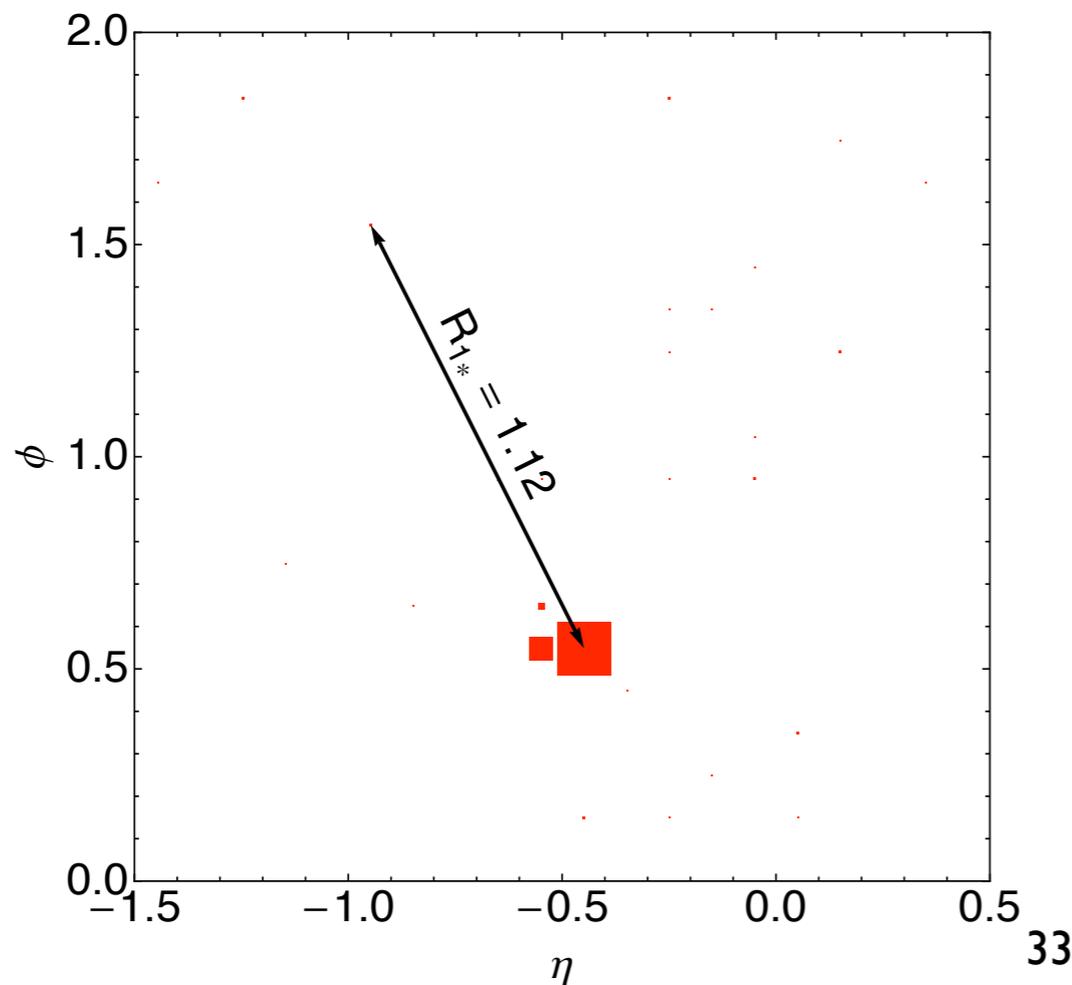
- $n_{\text{peaks}} \simeq \binom{n_{\text{subjets}}}{2}$

# Jet Substructure Observables

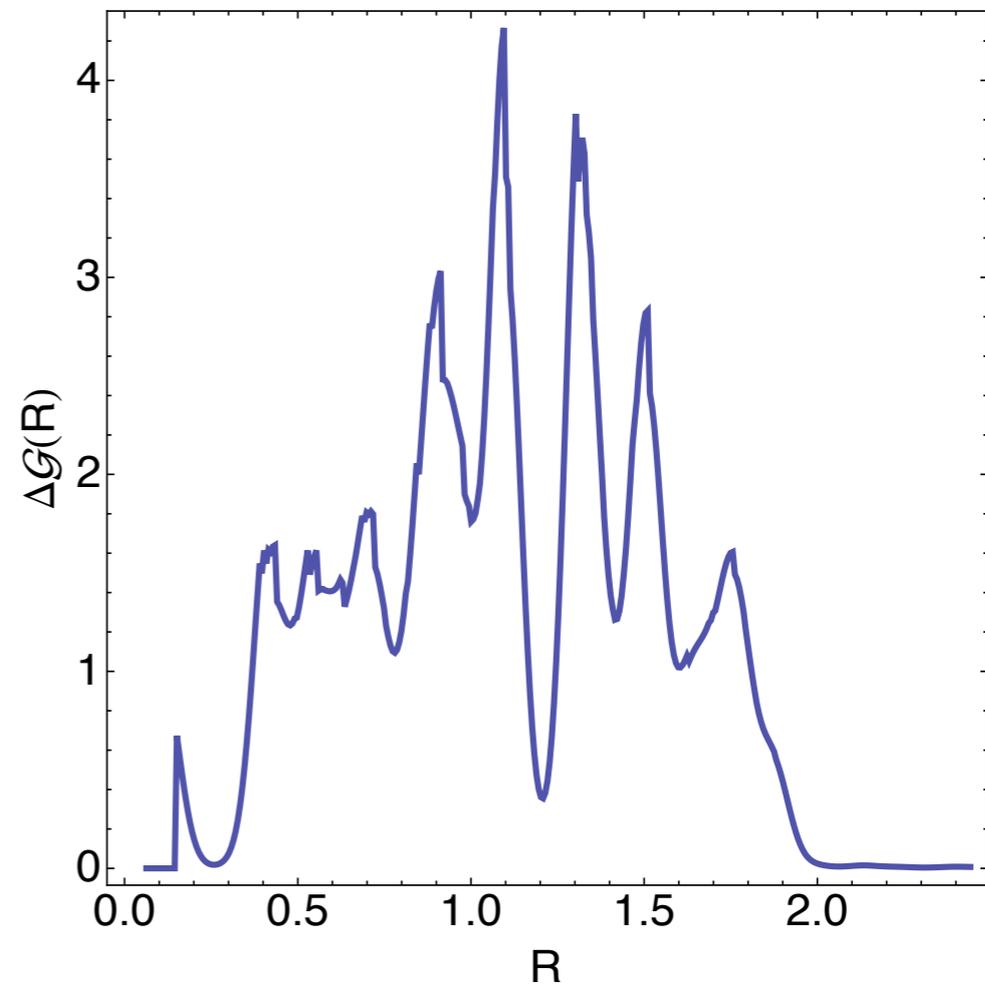
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33



# Jet Substructure Observables

- Our expectations:
  - $n_{\text{peaks}} \simeq \binom{n_{\text{subjets}}}{2}$
  - QCD: Flat distributions of peak locations; small invariant mass of subjets
  - Heavy Particle: Peaks in distributions correlated with masses and momenta

# Application: Top Tagger

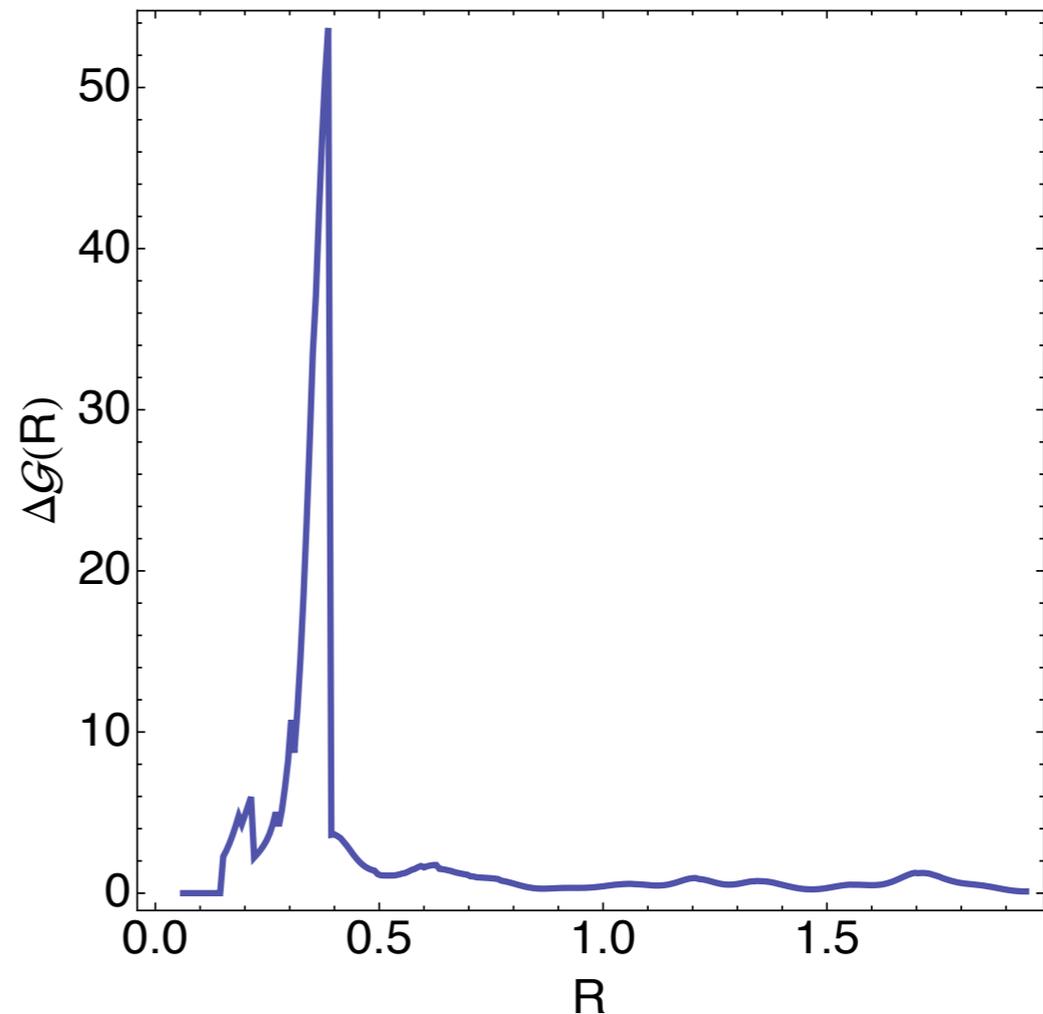
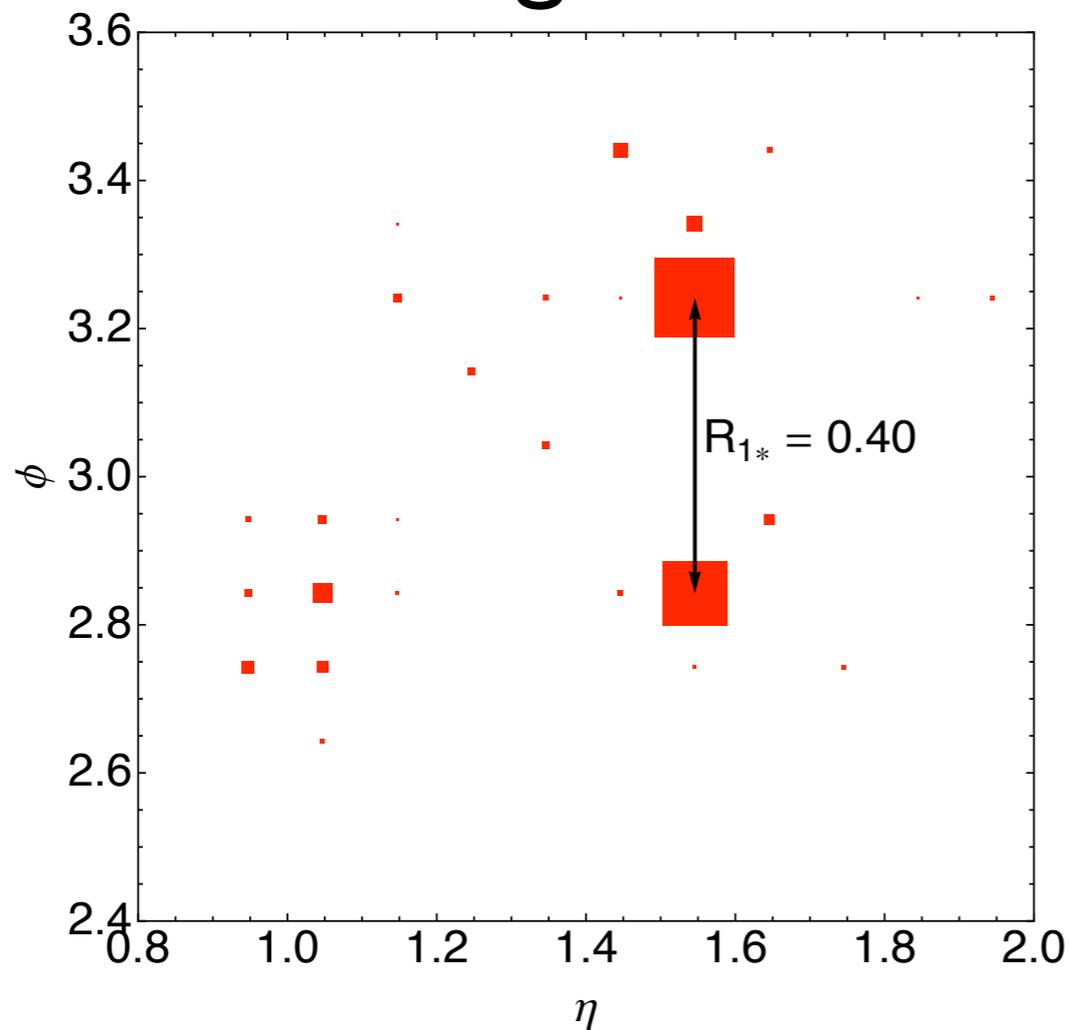
- Our Top Tagger:
  - Use observables from  $\Delta\mathcal{G}(R)$
  - Expectations:
    - Top quark jets will have 3 subjets
    - Separation of subjets will be strongly correlated with  $m_W, m_t$
    - Separation of subjets in QCD jet will be uncorrelated with any mass scale

# Application: Top Tagger

- Our Top Tagger:
  - Within a  $p_T$  bin:
    - Keep jets with 1, 2 or 3 peaks in  $\Delta\mathcal{G}(R)$
    - Parton shower can smear subjets
    - Record each location in  $R$  and peak height for peaks with minimum prominence
    - Also include mass of jet as discriminant

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- More on the number of peaks:
  - $n_{\text{peak}} = 1$  bin  $\rightarrow$   $W$  decay products are unresolved or subjects form an equilateral triangle



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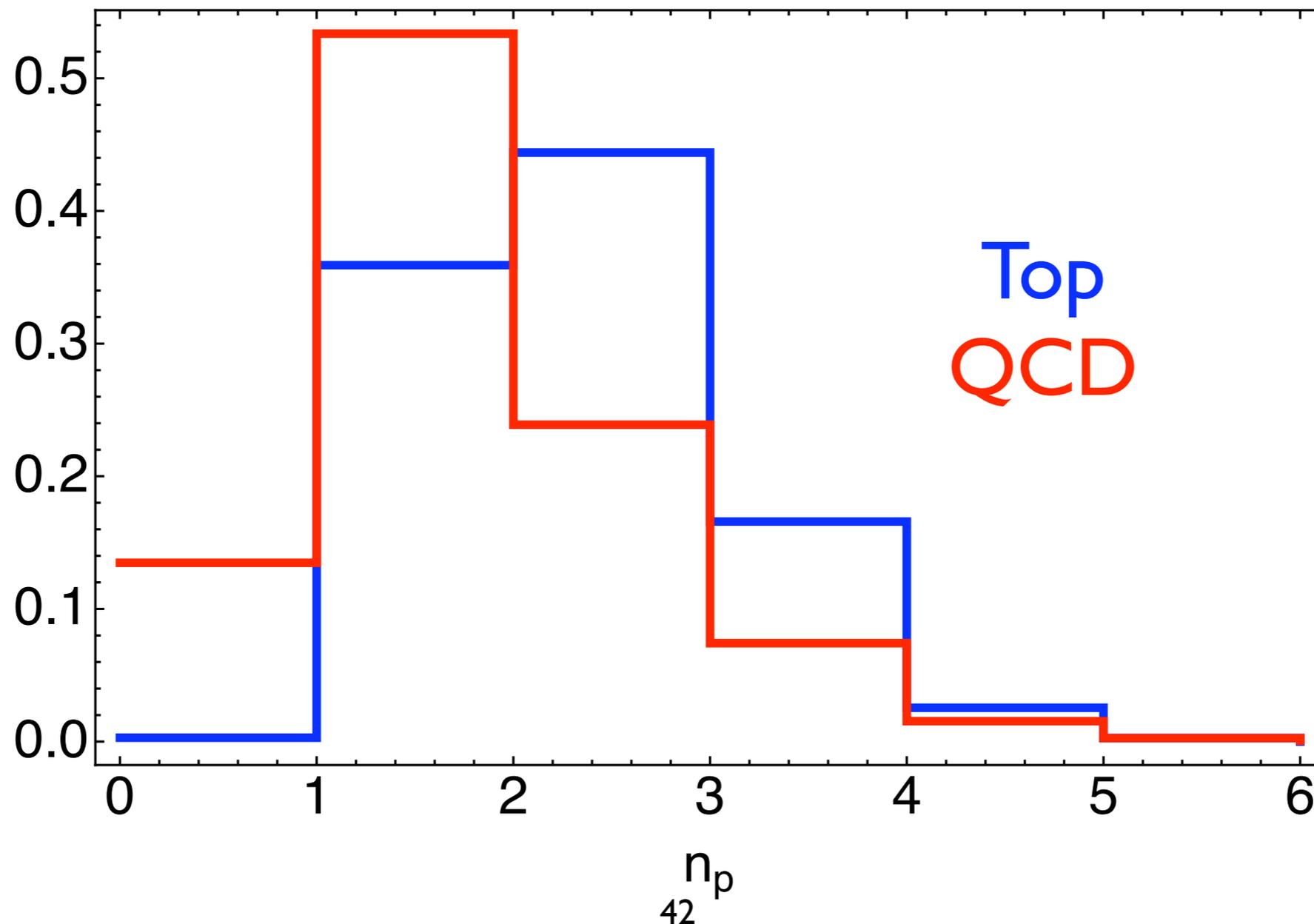
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  - $n_{\text{peak}} = 3$  bin  $\rightarrow$  All subjects of top are resolved
- Higher bins: hard radiation

# Application: Top Tagger

- Use data generated for BOOST 2010 Karagoz, Spannowsky, Vos
- Simulate detector by .1 x .1 binning in  $\eta, \phi$
- Find jets in events with FastJet 2.4.2 Cacciari, Salam  
implementation of CA with  $R = 1.5$
- Study QCD jets and top quark jets in  $p_t$  bins ranging from 200-800 GeV
- Set minimum prominence to 4.0
- Set delta function smoothing width to 0.06

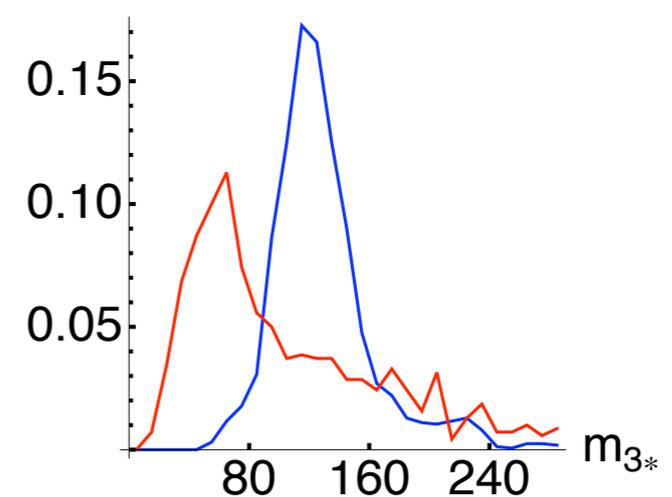
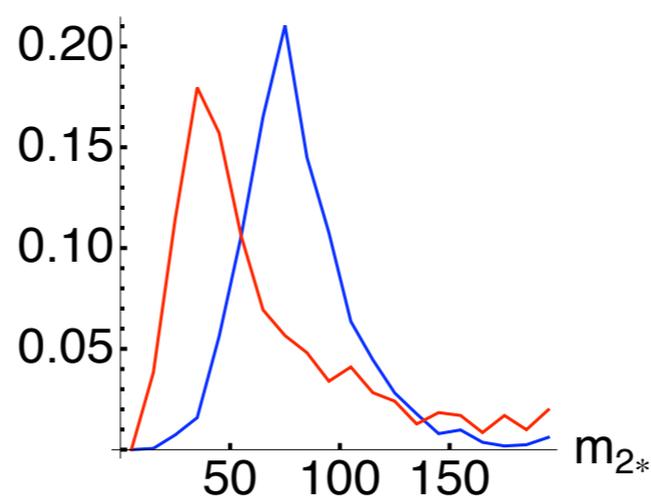
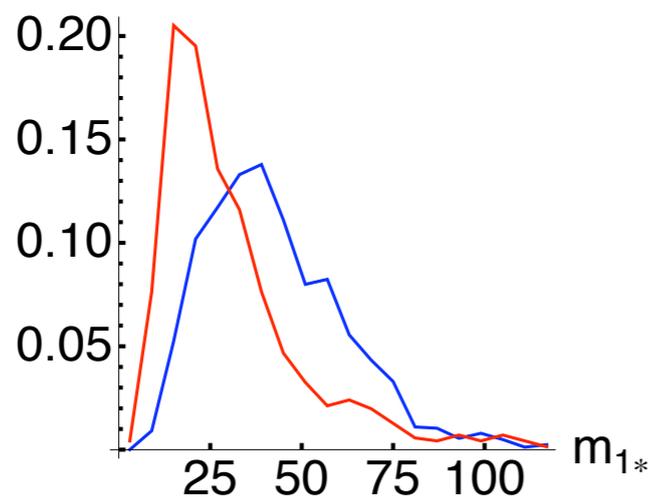
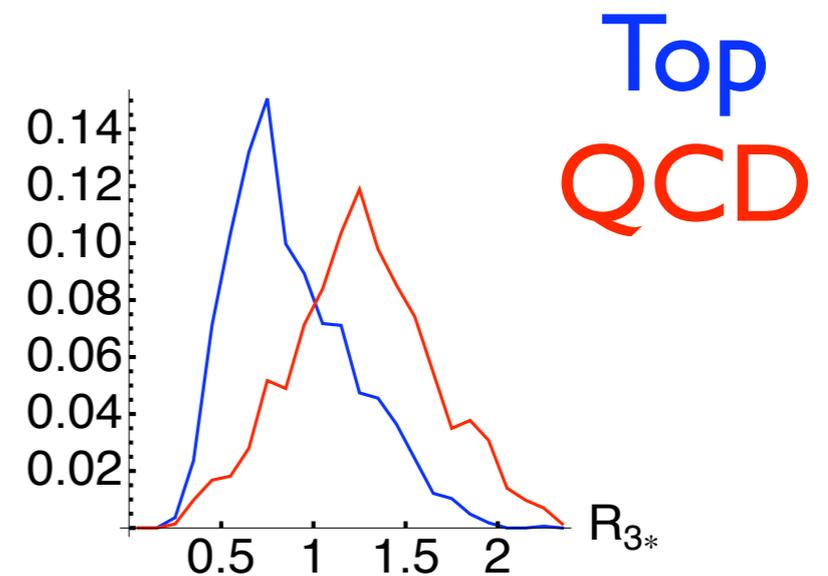
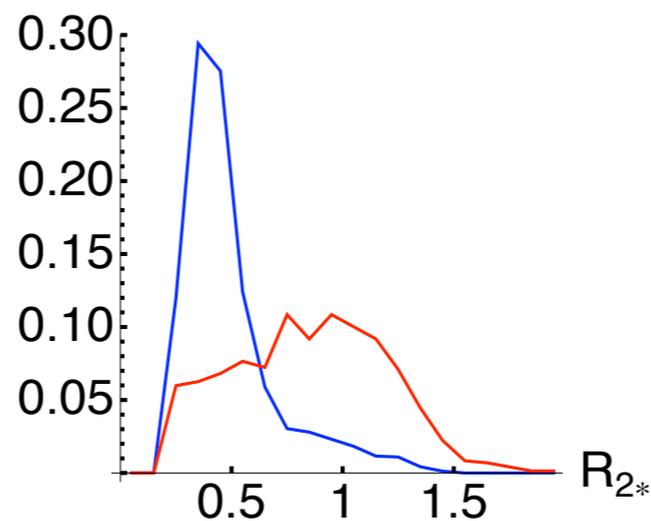
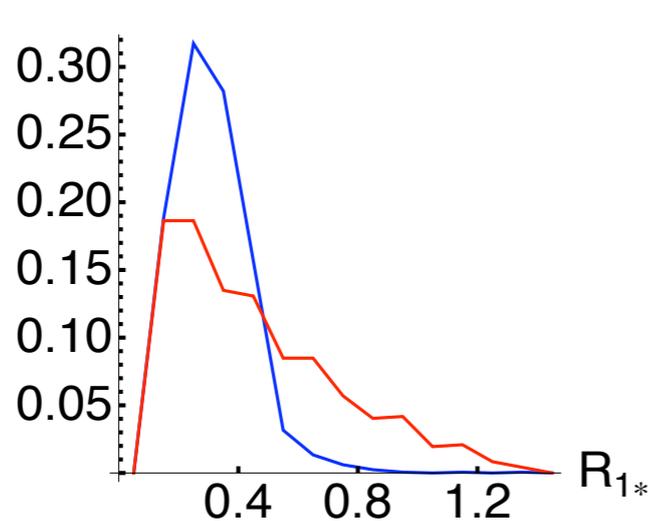
# Application: Top Tagger

- Example: study 500-600 GeV pt bin
- Peak number distribution with minprom = 4.0

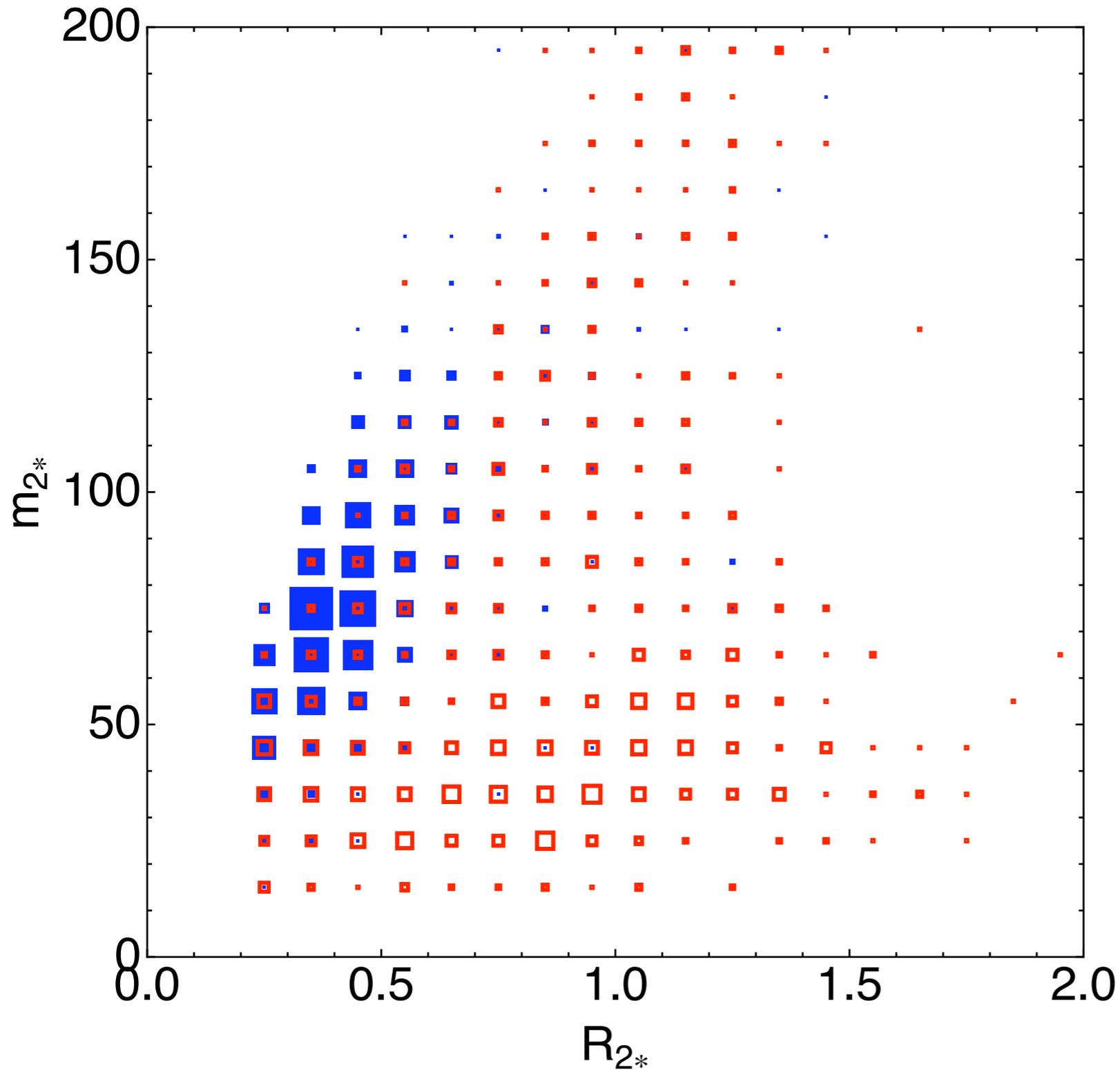


# Application: Top Tagger

- Example: study 500-600 GeV pt bin
- Variables in npeak = 3



# Application: Top Tagger



Top  
QCD

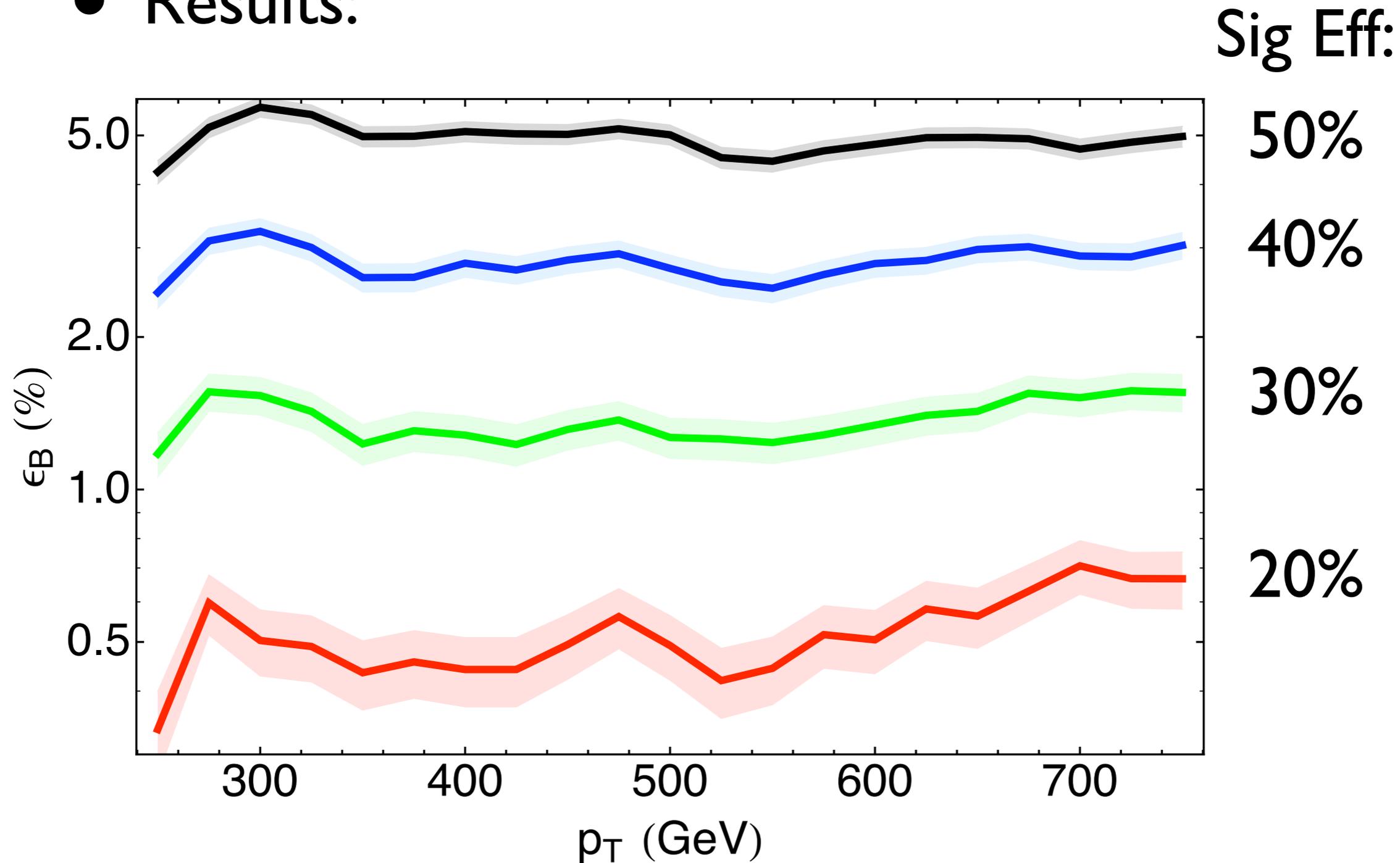
- Correlation of separation of subjects and their invariant mass
- Top:  $m \sim R$
- QCD:  $m, R$  uncorrelated

# Application: Top Tagger

- General procedure:
  - In each pt and peak bin, use all observables for discrimination
  - Use Monte Carlo to sample cut locations and then compute efficiencies
  - Recombine results from  $n_{\text{peak}} = 1, 2, 3$  bins
  - Compute overall efficiencies for signal and background jets

# Application: Top Tagger

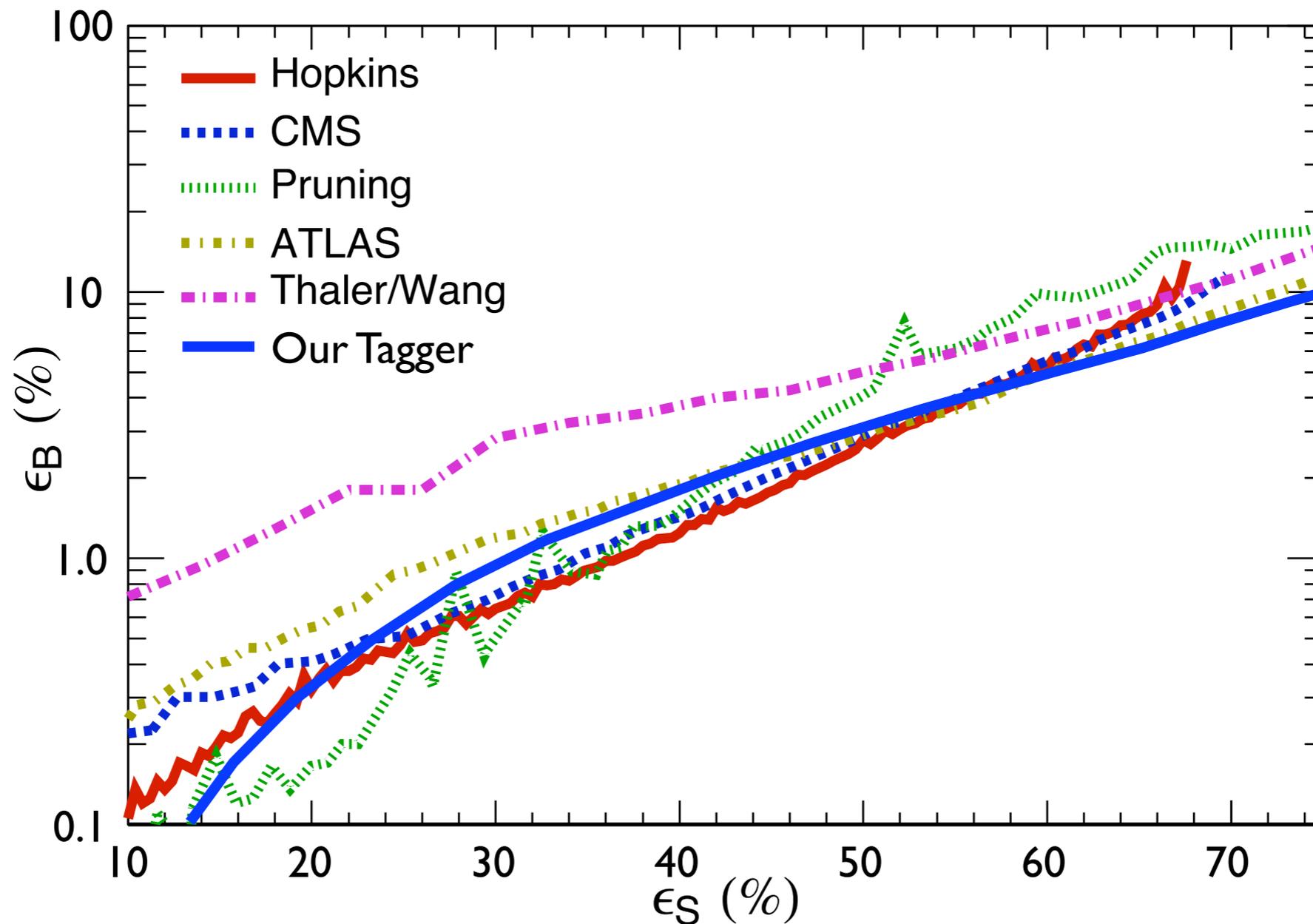
- Results:



# Application: Top Tagger

- Comparing to other top taggers:

Karagoz, Spannowsky, Vos



anti-kT, R=1.0, 500 GeV < pT < 600 GeV

# Application: Top Tagger

- Top tagger competitive with other methods in the literature
- Important: Still substantial optimization that can be done
  - Better choice of variables?
  - Prominence as a function of  $p_t$ ?
  - Use more information about structure of top jet?