

## Lecture 4: A Case Study in Jet Substructure

The last decade<sup>t</sup> has seen a transformation in how we think about jets and jets substructure. Many clever observables have been developed to improve experimental robustness / performance and enable theoretical control. There is a growing catalog of precise jet measurements / calculations, and with new machine learning techniques, no signs of a slow down.

I want to end these lectures with a classic but simple calculation that uses the ingredients you've learned. It is a jet discrimination task that has a history going back almost four decades.

Quark Jets vs. Gluon Jets.

At a cartoon level, this problem is simple.

$$q_f \quad \begin{array}{c} \swarrow \\ \searrow \end{array} \quad C_F = 4/3$$

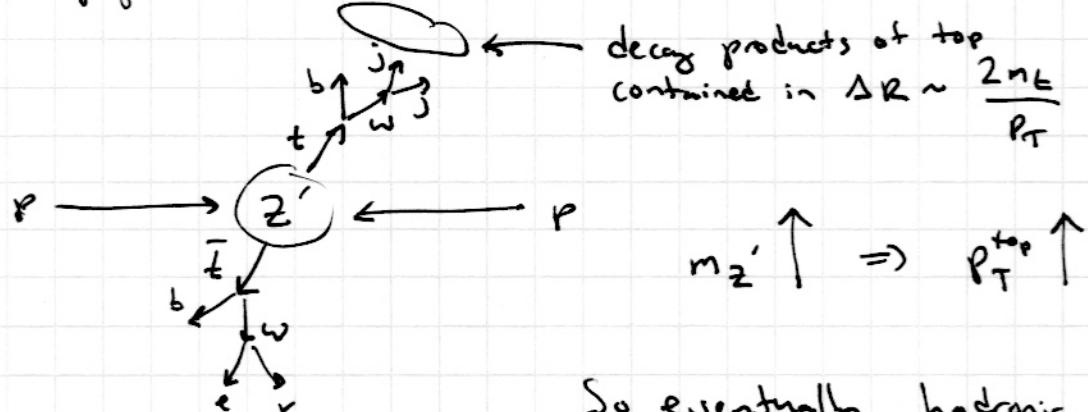
$$g \quad \begin{array}{c} \swarrow \\ \searrow \\ \searrow \end{array} \quad C_A = 3$$

Gluons have  $\approx 1/3$  more radiation than quarks.

Putting aside questions about the intrinsic definition of "quark jet" and "gluon jet", I want to show you a calculation of how well you can discriminate these categories by measuring the jet mass. (Strictly speaking, a 2-point correlator.)

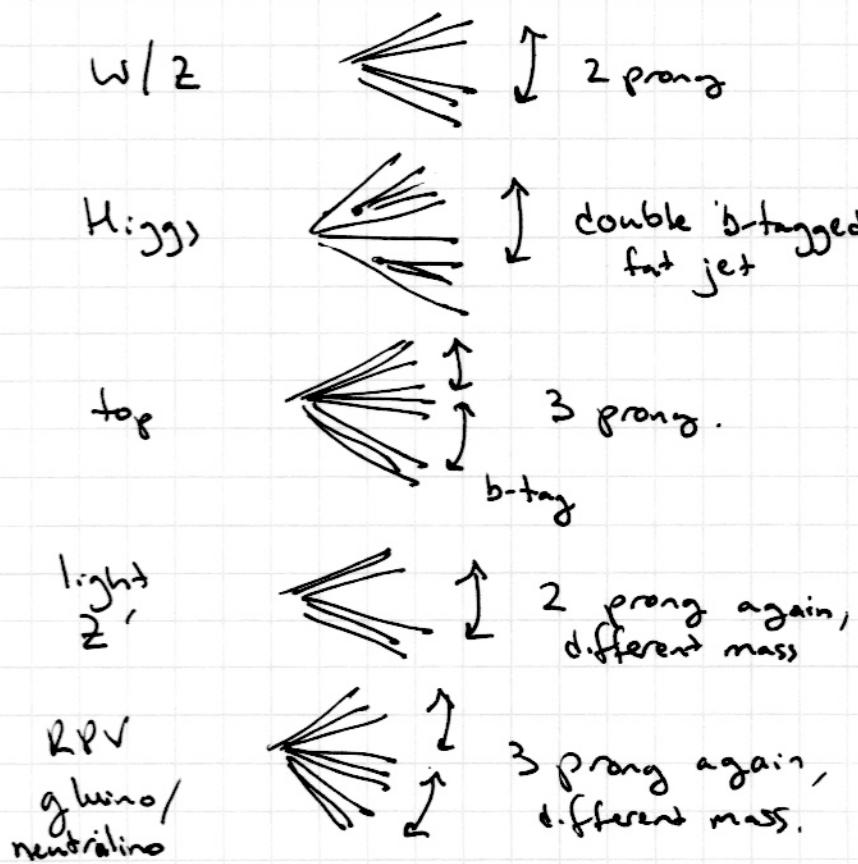
For additional context, jet classification became a hot topic once the new physics we were searching for became much heavier than  $m_{W/Z/H/b}$ .

$$\text{E.g. } p\bar{p} \rightarrow Z' \rightarrow t\bar{t}$$



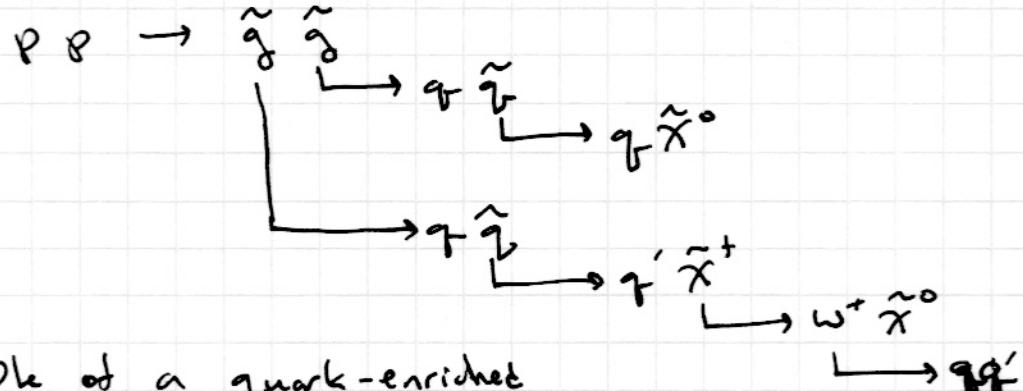
So eventually, hadronic top decay products were reconstructed as single 3-prong "fat jet"

By now, boosted jet tagging is standard.



In this context, quark/gluon discrimination is particularly challenging, since no "topological" distinction. Nevertheless, it is highly relevant for BSM searches.

E.g. gluino cascade decays



Example of a quark-enriched signal, where background can be gluon dominated.

We will focus on soft & collinear limit of QCD where FSR splitting probability is

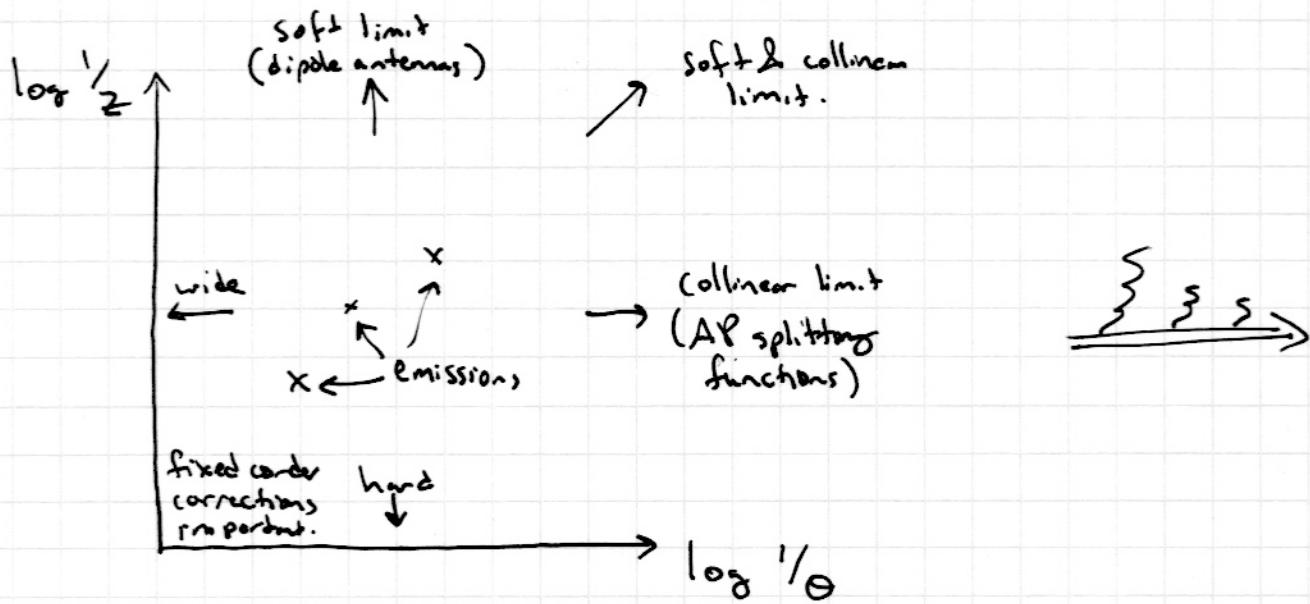
$$dP_{i \rightarrow i'g} = \frac{2\alpha_s}{\pi} C_i \frac{dz}{z} \frac{d\Theta}{\Theta}$$

In this "strongly-ordered" (or "leading log" or "double log") limit, we can do simple but insightful calculations.

Very low accuracy, but gives a flavor for the types of questions you can ask/answer.

See SCET, direct resummation, ... for ways to systematically improve this picture.

Key insight: splitting kernel yields uniform emissions  
in  $(\log \frac{1}{\theta}, \log \frac{1}{z})$  plane (sometimes called Lund plane)



Recursive applications of  $\Delta P_{i \rightarrow jk}$  is how parton shower algorithms work, essentially ~~is~~ taking factorization to logical extreme.

This picture captures some information at all orders in  $\alpha_S$ . Often more realistic qualitatively than fixed-order methods.

Main Insight: Jet is not just a single parton  
(closer to Wilson-line-wrapped eikonal parton)

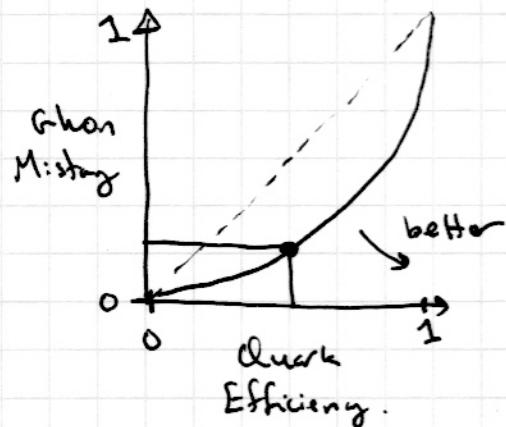
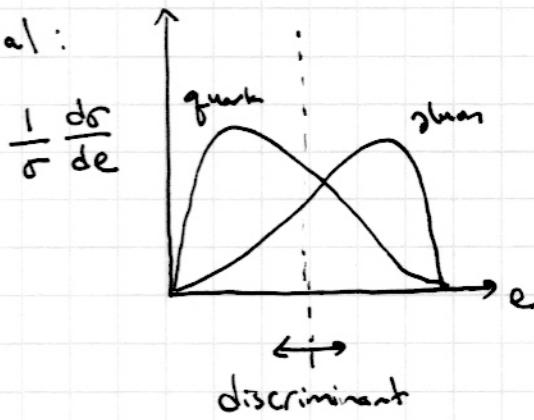
Very instructive to always keep in mind  
the soft gluon haze.

Concrete question: How well can you tag quark jets and reject gluon jets?

$C_f < C_A$ , so gluon jets should be "fatter"

Need to define observables sensitive to this difference.

Goal:



Ideally we would:

- Predict from first-principles QCD
- Validate in Monte Carlo parton showers
- Test in LHC data

Choice of discriminant observable?

→ IRsafe (in order to perform perturbative calculations)

→ Relatively insensitive to hadronization and other nonperturbative effects

$$\Delta \eta \sim \left( \frac{\Delta \eta_{\text{QCD}}}{p_T^{\text{jet}}} \right)^{\#}$$

Here is a simple one-parameter family of quark/gluon discriminants

### Energy-Energy Correlation Function

$$e_2(\beta) = \frac{\sum_{ij} p_{T,i} p_{T,j} R_{ij}^\beta}{\left( \sum_i p_{T,i} \right)^2 R^\beta}$$

↑  
 2-point  
 correlator  
 for 1-prong  
 testing

Angular exponent  $\beta$   
 should satisfy  $\beta > 0$   
 for IRC safety  
 (Also known as  $C_2^{(\beta)}$ )

Convenient to  
 normalize by jet  
 radius

Quick check for IRC safety:

- Soft safe? Yes,  $e_2$  unaffected by  $p_{T,i} \rightarrow 0$
- Collinear safe? Yes,  $e_2$  is additive so  $p_T \rightarrow p_{T,1} + p_{T,2}$  has no effect (for  $\beta > 0$ )

What is quark/gluon discrimination power for  $e_2$ ?

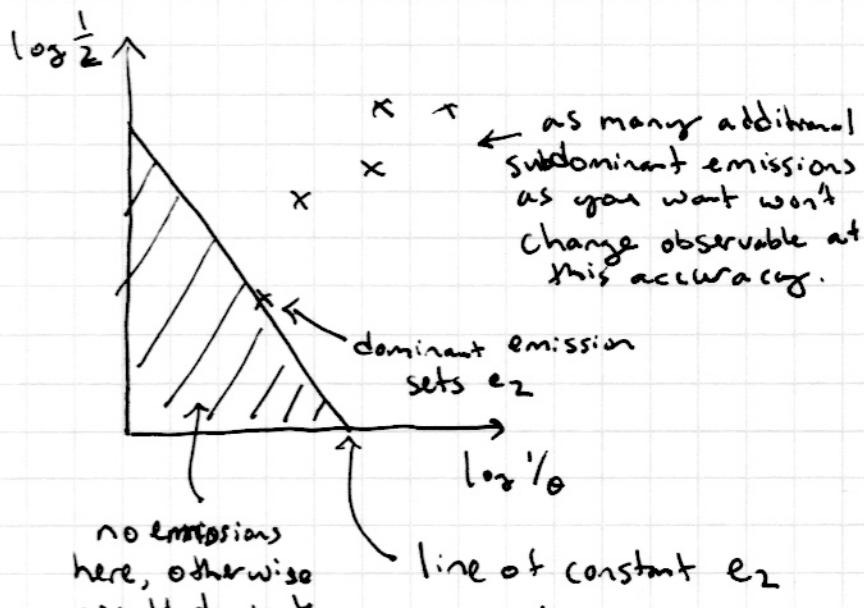
We will work in extreme soft & collinear & strongly-ordered limit of QCD. (This is borderline physical, but good for intuition.)



$$e_2 \approx \frac{p_{T1} p_{T2} R_{12}^\beta}{(p_{T1} + p_{T2})^2 R^\beta} \approx z \Theta^\beta \quad \text{for } p_{T2} \ll p_{T1}$$

$$\text{with } z \equiv \frac{p_{T2}}{p_{T1} + p_{T2}} \quad \Theta \equiv \frac{R_{12}}{R}$$

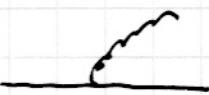
We can plot this observable on the  $(\log \frac{1}{\theta}, \log \frac{1}{z})$  plane.



$$\log \frac{1}{e_2} = \log \frac{1}{z} + \beta \log \frac{1}{\theta}$$

Recall:  $dP_{\text{sing}} = \frac{2\alpha_s}{\pi} C_i \frac{dz}{z} \frac{d\theta}{\theta}$ , so we just have to compute probability to get specific value of  $e_2$ , right?

But wait,  $dP_{\text{sing}}$  is for real emissions, where are virtual diagrams?

Real: 

at finite  $z, \theta$

Virtual: 

effectively at  $z \rightarrow 0, \theta \rightarrow 0$   
 $(\log \frac{1}{z}, \log \frac{1}{\theta}) \rightarrow (\infty, \infty)$

Because our observable is TBC safe, we know divergences have to cancel, but how does this work?

Easiest way to think about this is in terms of probabilities

$$P_{\text{emit}} + P_{\text{no-emit}} = 1$$

At Born order:

$$\mathcal{O}(\alpha_s^0) \quad P_{\text{no-emit}}^{(0)} = 1 \quad \xrightarrow{\text{just}}$$

At next order:

$$\mathcal{O}(\alpha_s^1) \quad P_{\text{emit}}^{(1)} + P_{\text{no-emit}}^{(1)} = 0$$



Now we just have an exercise in probability!

Chance to get any value of  $e_2$  less than  $e_2^{\max}$  is

$$\sum_q (e_2^{\max}) = 1 + \begin{matrix} \text{no emission} \\ \uparrow \\ \text{at } \mathcal{O}(\alpha_s^0) \end{matrix} + \frac{1}{2} \cdot \begin{matrix} \text{all emissions} \\ \uparrow \\ \text{below } e_2^{\max} \\ \text{at } \mathcal{O}(\alpha_s^1) \end{matrix} + \dots$$

+ ...

$$\begin{matrix} \text{Symmetry} \\ \uparrow \\ \text{factor} \end{matrix} \quad \begin{matrix} \text{both emissions} \\ \uparrow \\ \text{below } e_2^{\max} \\ \text{at } \mathcal{O}(\alpha_s^2) \end{matrix}$$

Then, using fact that  $\begin{matrix} \text{real plus} \\ \uparrow \\ \text{virtual} \end{matrix} = \begin{matrix} \text{just} \\ \uparrow \\ \text{real} \end{matrix}$ , we have:

$$\sum_q (e_2^{\max}) = \int_0^{e_2^{\max}} p(e_2) de_2 = \exp \left[ -\frac{2\alpha_s}{\pi} C_F (\text{area of } \triangle) \right]$$

Probably most of you have never done a field theory calculation like that before!

Final result:  $\sum_q (e_2^{\text{max}}) = \exp \left[ -\frac{\alpha_s}{\pi} \frac{C_F}{\beta} \log^2 \frac{1}{e_2^{\text{max}}} \right]$

↑  
called Sudakov form factor

↑  
double logarithmic because of soft & collinear singularities.

For gluons, just swap  $C_F \rightarrow C_A$ .

This is a (baby) example of a resummed calculation where you capture some information to all orders in  $\alpha_s$ . (Can be systematically improved using approaches like SCET.)

To go from cumulative distribution  $\sum$  to probability distribution, just take a derivative.

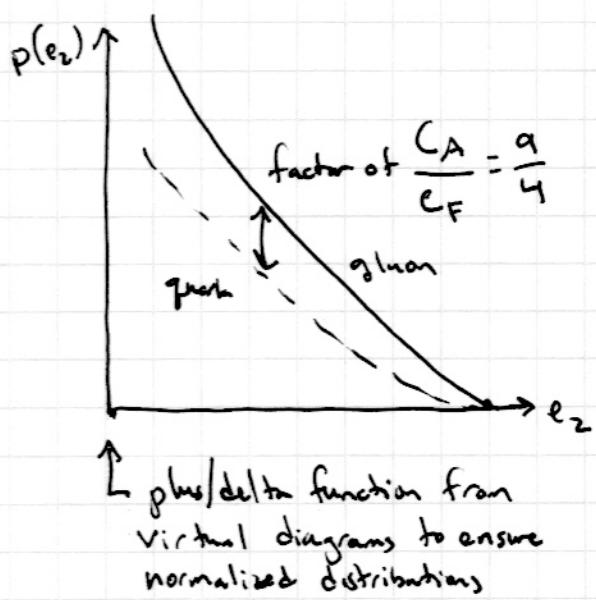
$$p(e_2) = \frac{1}{\sigma} \frac{d\sigma}{de_2} = \frac{\partial}{\partial e_2} \sum(e_2)$$

$$p_q(e_2) = \underbrace{\frac{2\alpha_s}{\pi} \frac{C_F}{\beta} \frac{1}{e_2} \log \frac{1}{e_2}}_{\text{at fixed order in } \alpha_s, \text{ this goes singular as } e_2 \rightarrow 0} \exp \left[ -\frac{\alpha_s}{\pi} \frac{C_F}{\beta} \log^2 \frac{1}{e_2} \right]$$

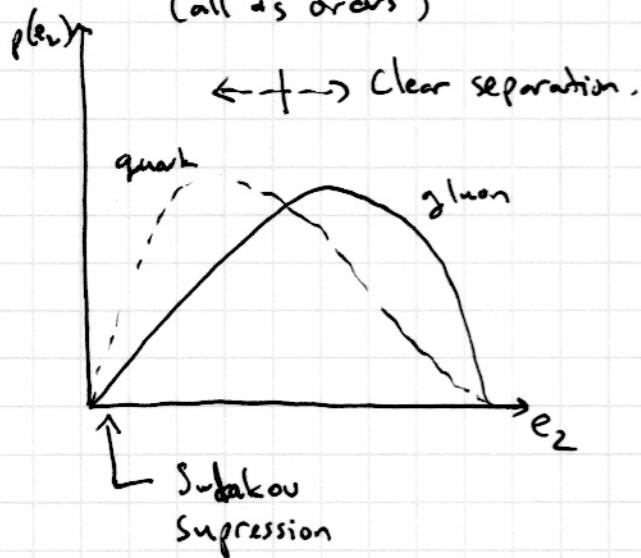
at fixed order in  $\alpha_s$ ,  
this goes singular as  
 $e_2 \rightarrow 0$

at all orders in  $\alpha_s$ , you  
get Sudakov form factor  
that regulates singularity,  
giving much more physical result.

At fixed  $\alpha_s$  order



In strongly ordered limit  
(all  $\alpha_s$  orders)



Finally, we can compute discrimination power.

Place a cut  
at  $e_2^{\text{cut}}$

$e_2 < e_2^{\text{cut}} \Rightarrow$  "quark"

$e_2 > e_2^{\text{cut}} \Rightarrow$  "gluon"

We want to know  $\frac{\text{gluon}}{\text{quark}}$  mistag rate  $\left( \sum_g (e_2^{\text{cut}}) \right)$   
as a function of quark efficiency  $\left( \sum_q (e_2^{\text{cut}}) \right)$ .

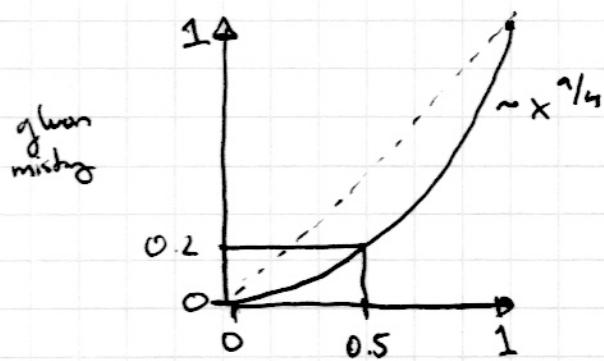
At this  $\alpha_s$  order, we have simple ~~"Casimir Scaling"~~ "Casimir Scaling"

$$\sum_g = \left( \sum_q \right)^{C_A/C_F} \xrightarrow{g/4}$$

$\uparrow$  gluon       $\uparrow$  quark

(This simple relation is violated at higher orders. Note that at this order, it is independent of  $\beta$ .)

Final "mistag" vs. efficiency curve:



Huge range of observables exhibit Casimir scaling, which is why quark/gluon discrimination is challenging.

But there are methods to achieve improved performance, which you can ask me about off-line.

This calculation neglected many important higher-order effects.

- Multiple Emissions
- Color Coherence
- Subleading terms in AP splitting function
- Fixed-order corrections
- Running  $\alpha_s$
- Non-global logarithms
- Hadronization Effects
- Underlying event contamination
- ...

Mostly, I hope you've gained some appreciation of why we need to define observables and why it is beneficial to work to all orders in  $\alpha_s$ .

## Concluding Thoughts

Here are three things I want you to remember about QCD and collider physics.

- ① Have to think about observables. Just knowing scattering amplitudes is not enough to make predictions.

Right now, there is no "theory of observables", so you ~~can~~ have to assess things case by case.

- ② Factorization is crucial for making predictions.

You can't predict where every pion goes. Need to choose observables that respect, e.g., PDFs, otherwise you can't (yet) make first-principles predictions.

- ③ You see (quasi-)stable particles in your detector, not Standard Model ~~states~~.

Good observables on hadrons yield good proxies for QCD partons. Jet algorithms are one way to construct such proxies.

If you want to use perturbative proxies, need to use observables that are infrared and collinear safe.

Finally, I started these lectures with the master formula:

$$\sigma_{\text{obs}} = \frac{1}{2E_{\text{cm}}} \sum_{n=2}^{\infty} \left\{ d\ln \left| M_{A\bar{B} \rightarrow 12\dots n} \right|^2 f_{\text{obs}}(\ln) \right\}$$

Are there things you can do with collider data that don't fall into this framework?

Yes! There are data analysis techniques (e.g. from machine learning) that aren't based on histograms.

In many ways, frontiers of collider physics will involve thinking about the whole "space of measurements" and striking right balance between experimental robustness and theoretical calculability.

I hope I've given you some sense of the richness of QCD and collider physics in these lectures!