

# General Exam: Two Higgs to 4b (and beyond)

Sean Gasiorowski  
University of Washington

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# Outline

- **General introduction:**
  - ATLAS, coordinates, jets, and b-tagging
- **ATLAS qualification task:**
  - Description and results
- **The  $HH \rightarrow 4b$  analysis:**
  - Motivation and benchmarks
  - The analysis: selection, background, and results
  - Looking forward
- **Thesis Timeline**



# General Introduction

# Introduction: LHC and Timeline



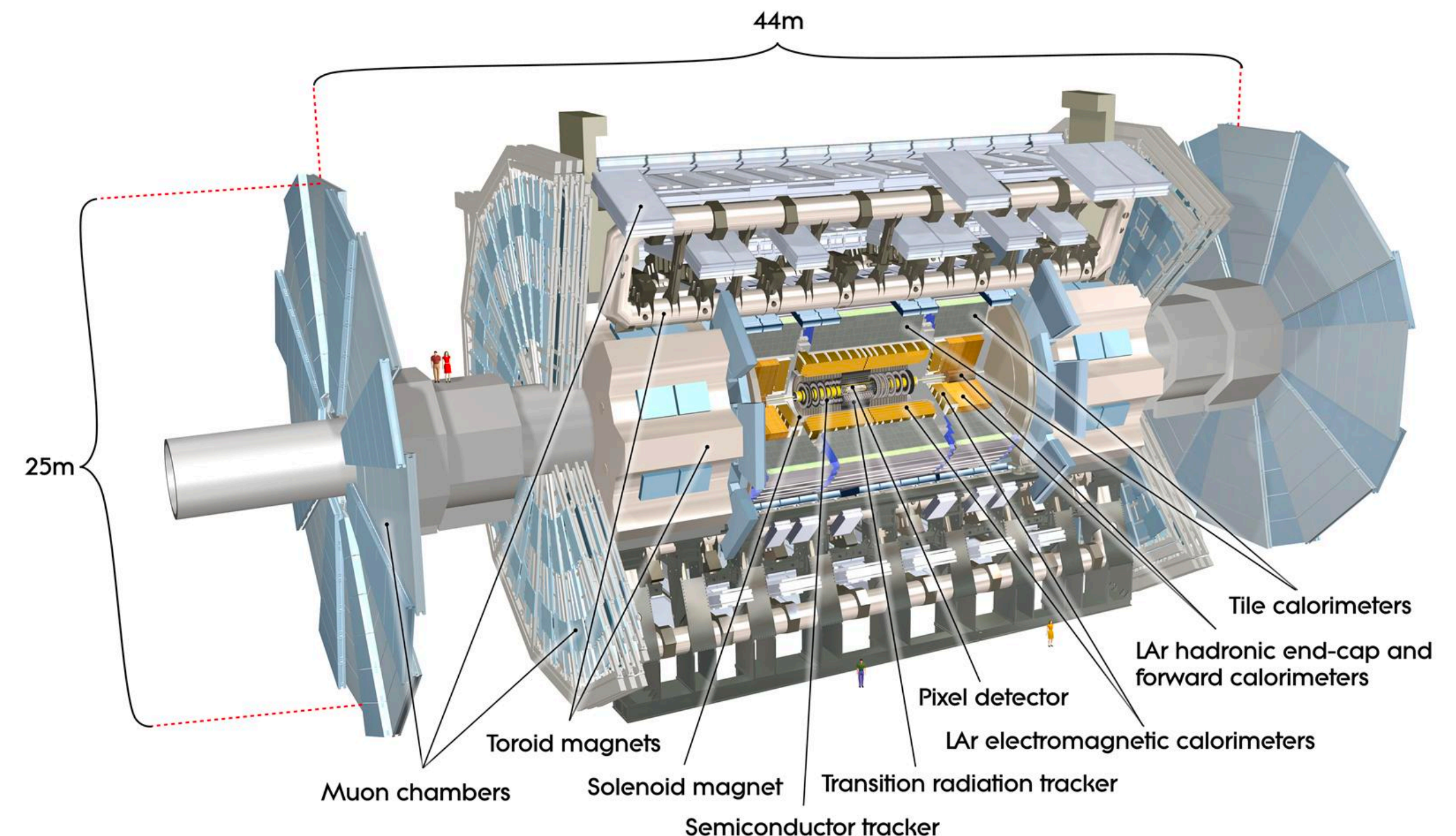
HL-LHC: High Luminosity LHC  
LS: Long Shutdown  
TeV: Tera electron Volt



- The Large Hadron Collider (LHC) is a proton-proton collider near Geneva, Switzerland, operating at center of mass energy  $\sqrt{s} = 13$  TeV
- We are currently in Long Shutdown 2 (LS2), during which we will analyze data from Run 2 (2015-2018) and make plans for Run 3 (2021-2023).

# Introduction: ATLAS

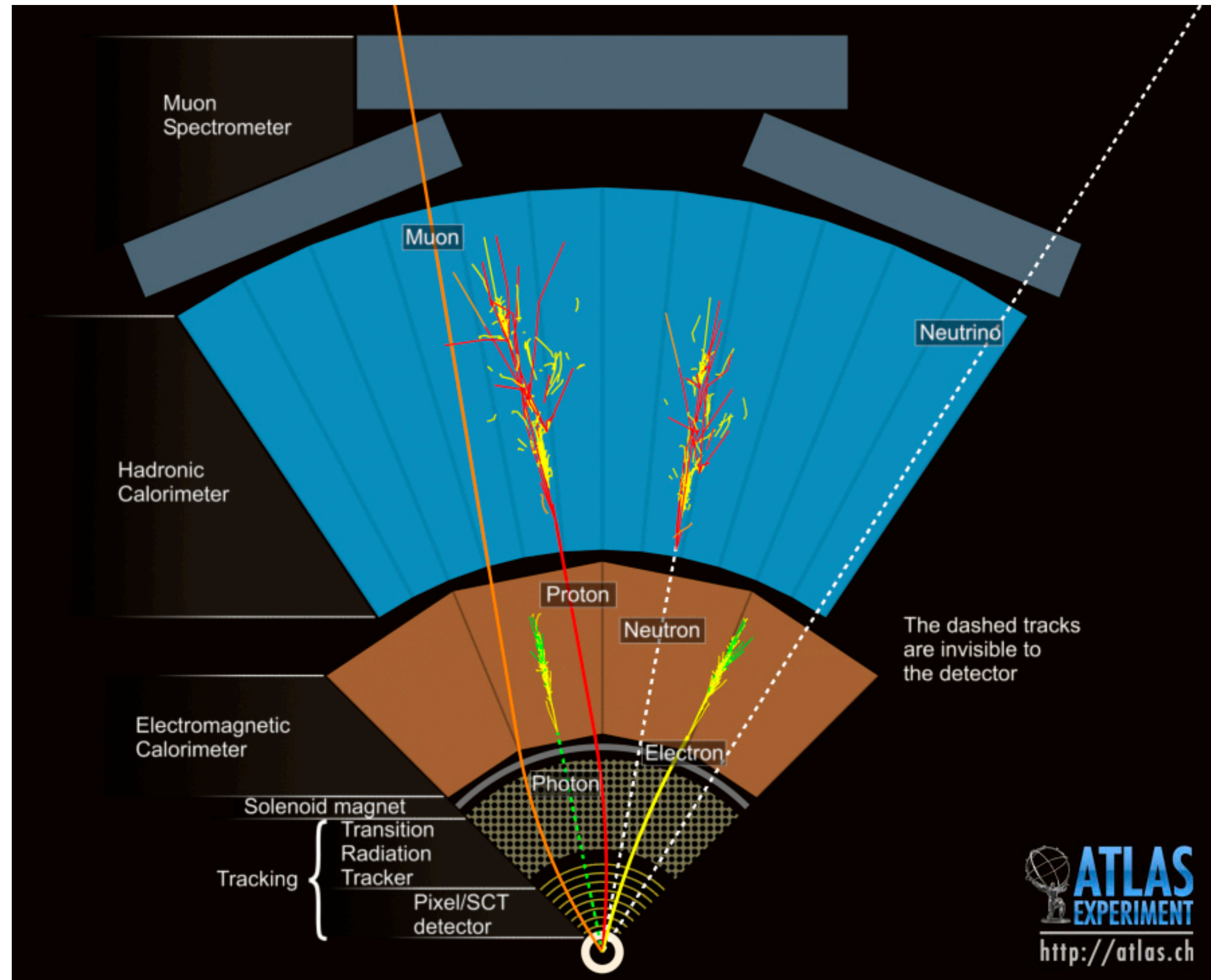
- The high energy reach of the LHC gives access to many physics processes not available in other contexts
- The ATLAS experiment is one of two “general purpose” experiments at the LHC, designed to observe these processes
- “General purpose” here means a rich and wide program of searches for new physics, precision measurements, and confirmations/ tests of the Standard Model





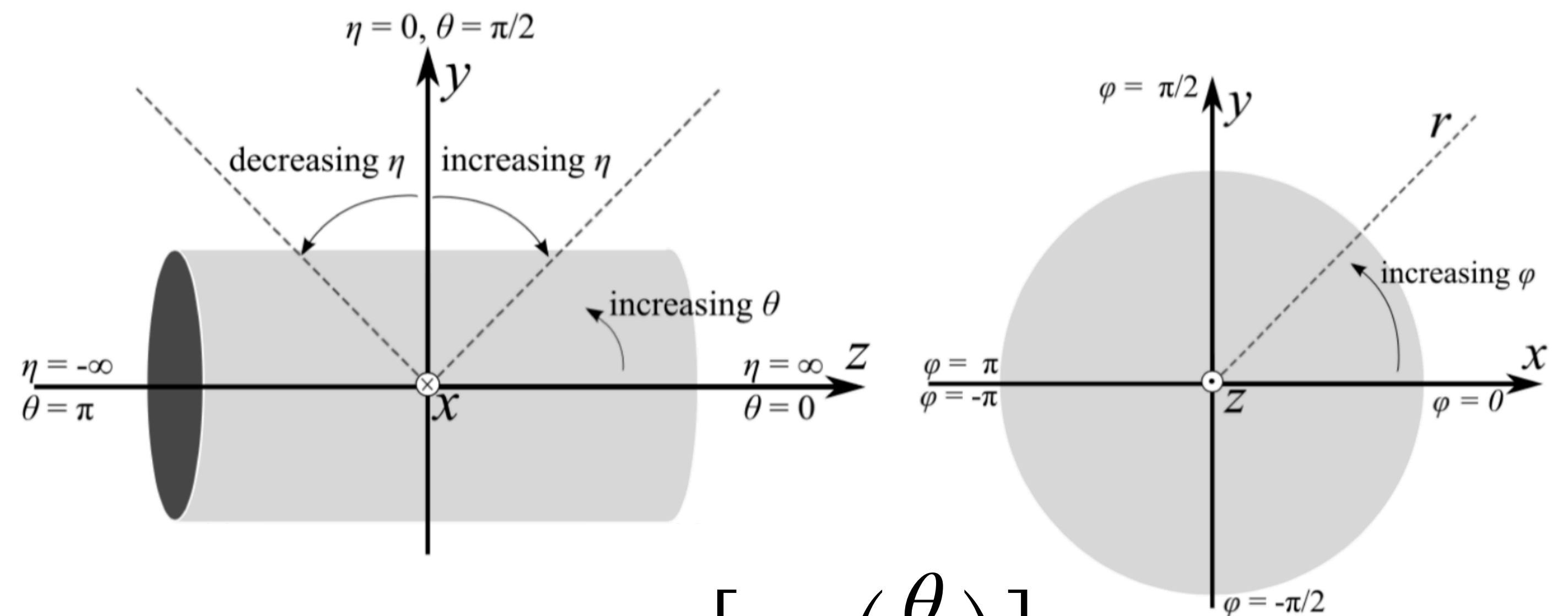
# The ATLAS Detector

- The ATLAS detector is composed of several sub-detectors
  - A **tracking** detector, which, through ionization of closely spaced layers, is able to measure the path of a charged particle
    - In a magnetic field => information about the particle momentum and charge
  - A **calorimeter** which measures particle energy
    - Granularity of the calorimeter allows a fine grained look at how particles behave on interaction with the material => physics information!
  - A **muon spectrometer** which measures muon momentum/trajectory, since the muons usually pass through the calorimeter layers



# A Note on Coordinates

- ATLAS has a cylindrical geometry
- Coordinates used are  $\eta$  (parameterizes position along beam line) and  $\phi$  (location around the cylinder)
- Transverse momentum ( $p_T$ ) is the component of momentum perpendicular to the beam line
  - Used, e.g., to remove contribution to momentum from the beam itself



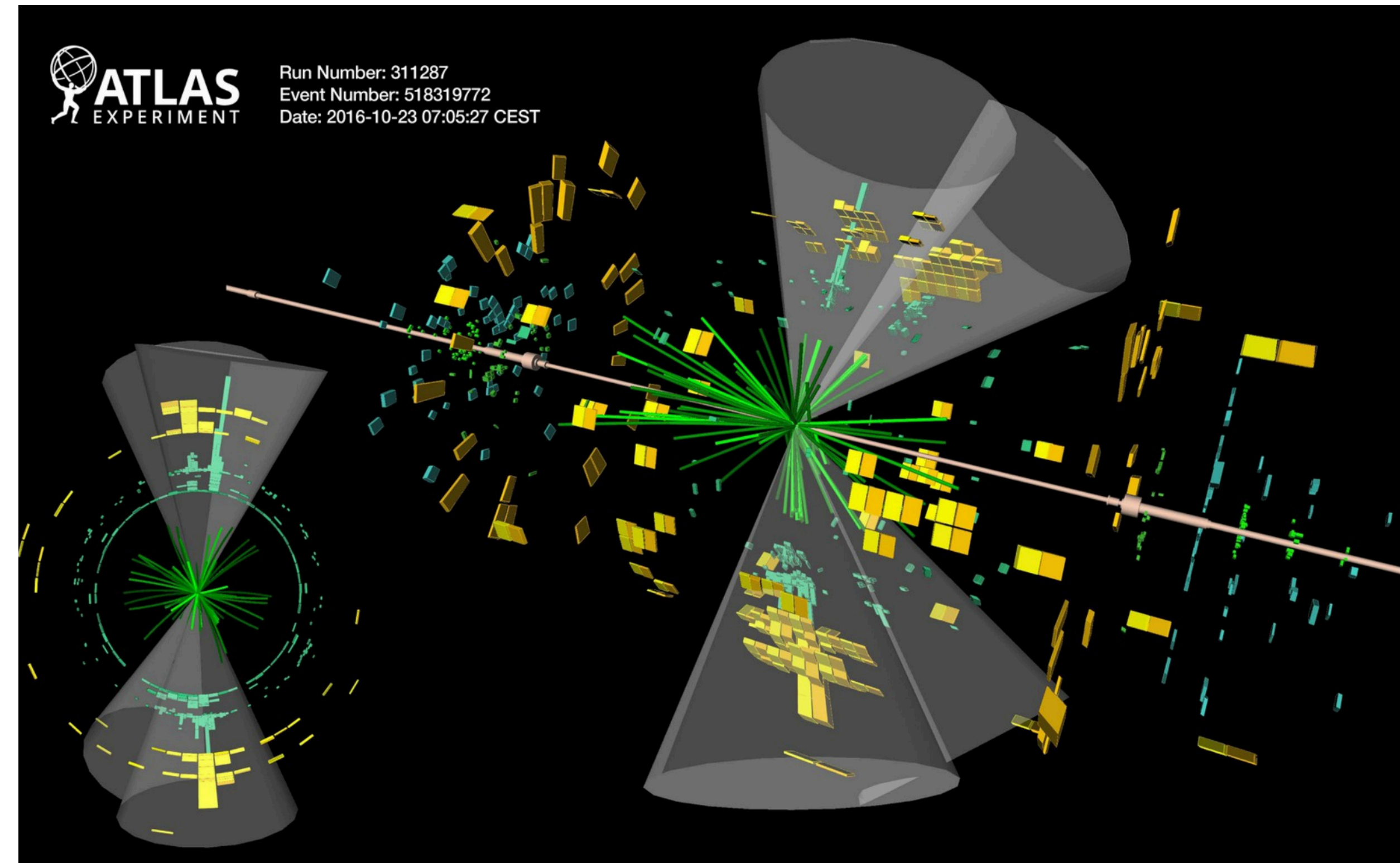
$$\eta \equiv -\ln\left[\tan\left(\frac{\theta}{2}\right)\right]$$

$$\Delta R \equiv \sqrt{(\Delta\eta)^2 + (\Delta\phi)^2}$$



# A Note on Jets

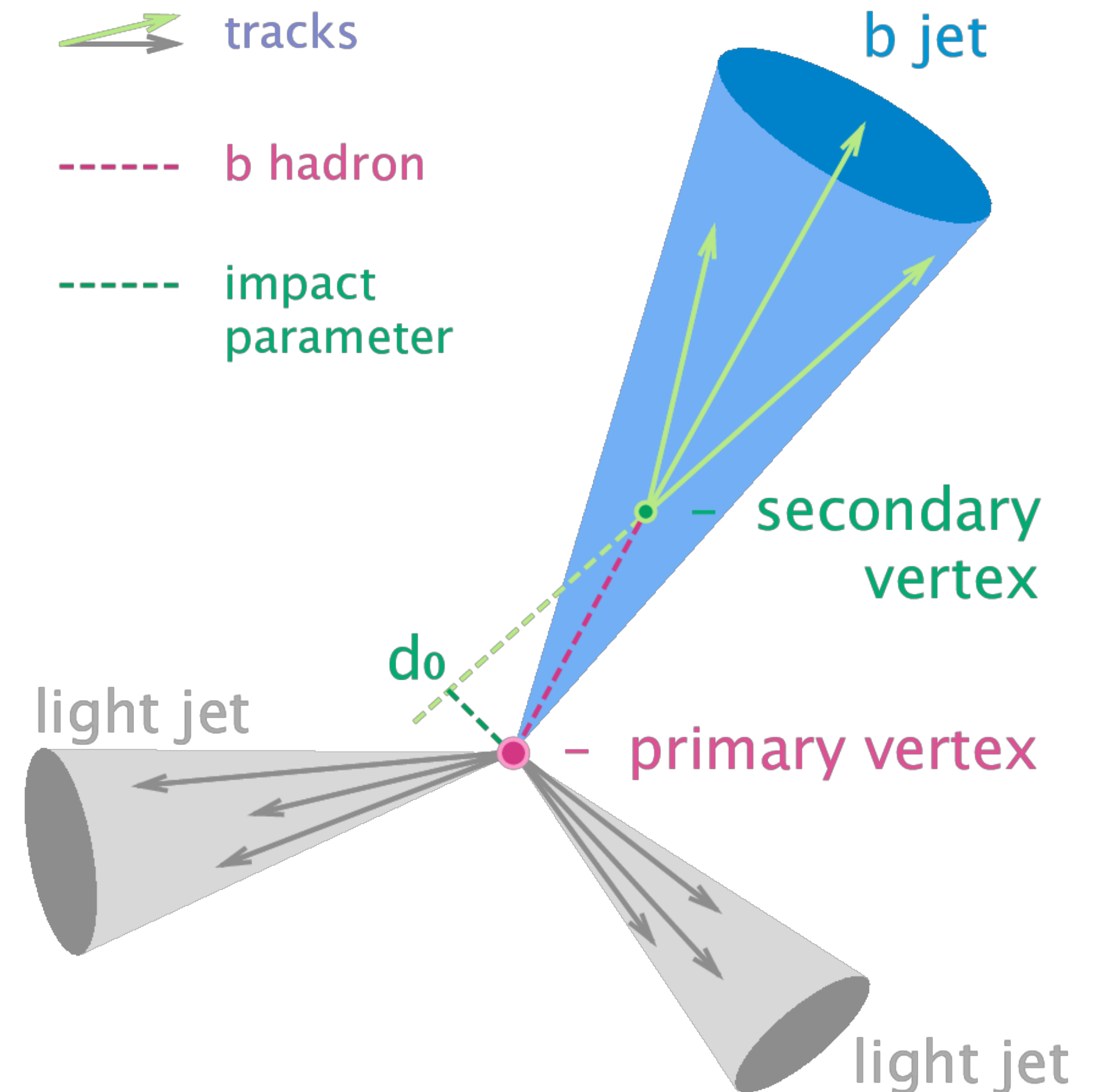
- Proton-proton collisions at the LHC produce a variety of different particles
- Free quarks and gluons cannot exist on their own (QCD confinement), but rather form into hadrons, which then decay
  - This is what we see in our detector
- Group these decay products into objects called **jets**, which serve as a reasonable proxy for the original partons
  - There are a variety of algorithms to group energy deposits into jets
  - Commonly used is the anti- $k_t$  algorithm [ref], which constructs (roughly) a cone of a certain radius in the detector



**Candidate  $HH \rightarrow 4b$  event from  
Jana Schaarschmidt, HH  
Workshop, Fermilab**

# A brief word on b-tagging

- b quarks are important in the  $HH \rightarrow 4b$  analysis. They are identified by looking at jets containing b-hadrons (“b-jets”).
- b-hadrons have some important distinguishing features:
  - Long lifetimes  $\Rightarrow$  travel a measurable amount away from collision point before decaying (“displaced vertex”)
  - Large masses  $\Rightarrow$  high decay multiplicities
- These features make it possible to identify b-jets in ATLAS
  - This is called **b-tagging** and is a very active area of research
  - Current standard uses machine learning tools for b jet identification. These output a **b-tagging score**, which is then used for selection



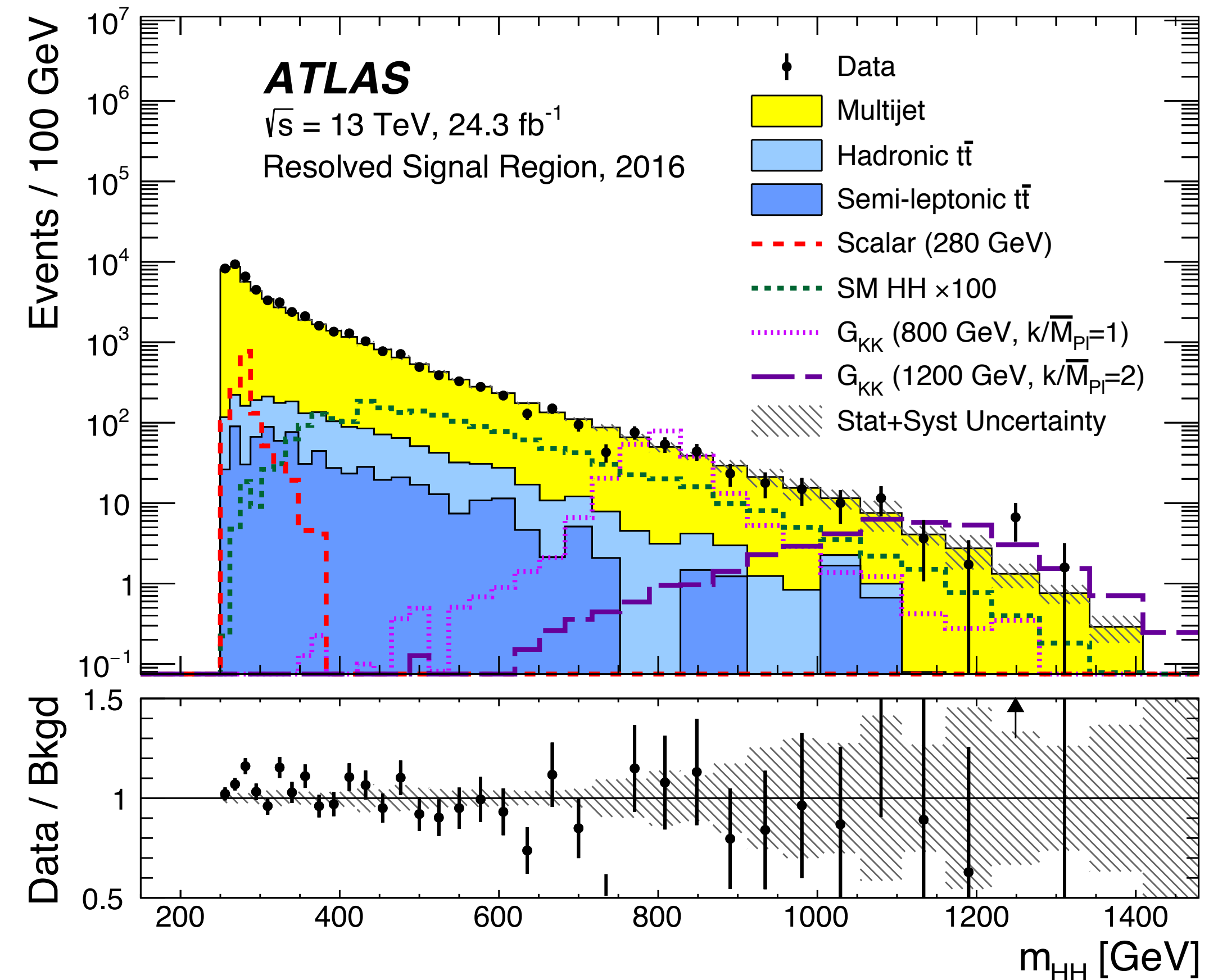
By Nazar Bartosik, CC BY 4.0

# ATLAS Qualification



# ATLAS Qualification Task: FastCaloSim

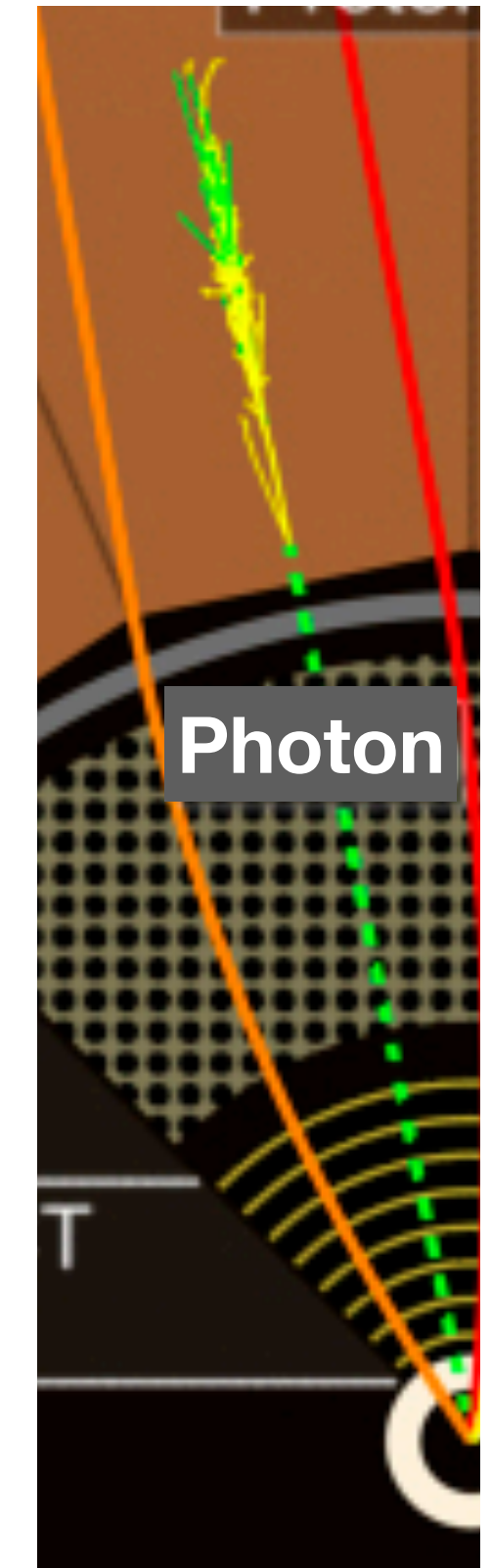
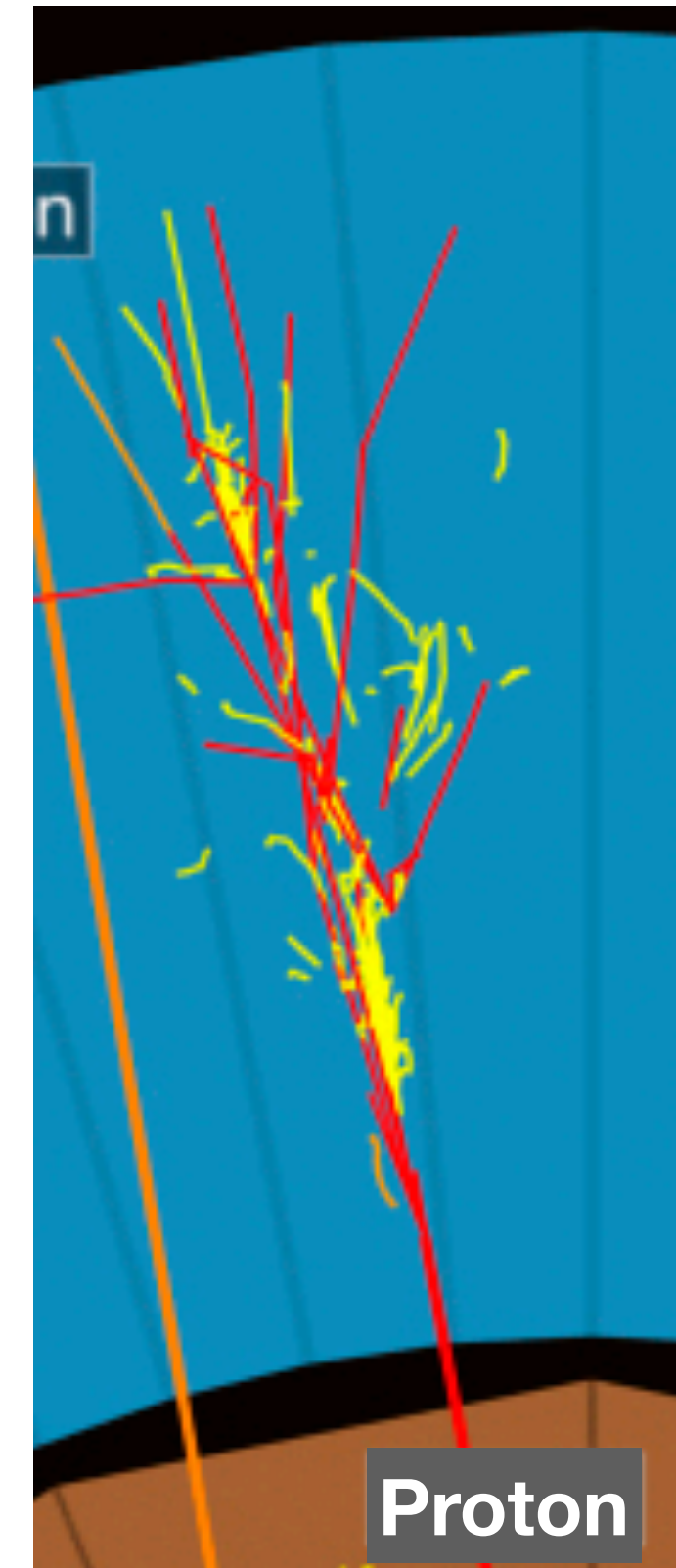
- Physics simulation is an important part of the research program in ATLAS
  - What do our signal models look like? How do we model our known (irreducible) backgrounds?
- However, it is computationally expensive! The largest chunk of CPU time is spent on the calorimeter [ref]
- **FastCaloSim** is an effort to reduce the load by parameterizing the calorimeter response in various ways
  - Goal is to have a lightweight simulation tool that still provides a high quality simulation
- NB: FastCaloSim will likely be the default for simulated samples in run 3



**Example plot from the 2016  $HH \rightarrow 4b$  analysis.  $t\bar{t}$  (blue) and all signal models (colored lines) taken from Monte Carlo simulation.**

# FastCaloSim: The Problem

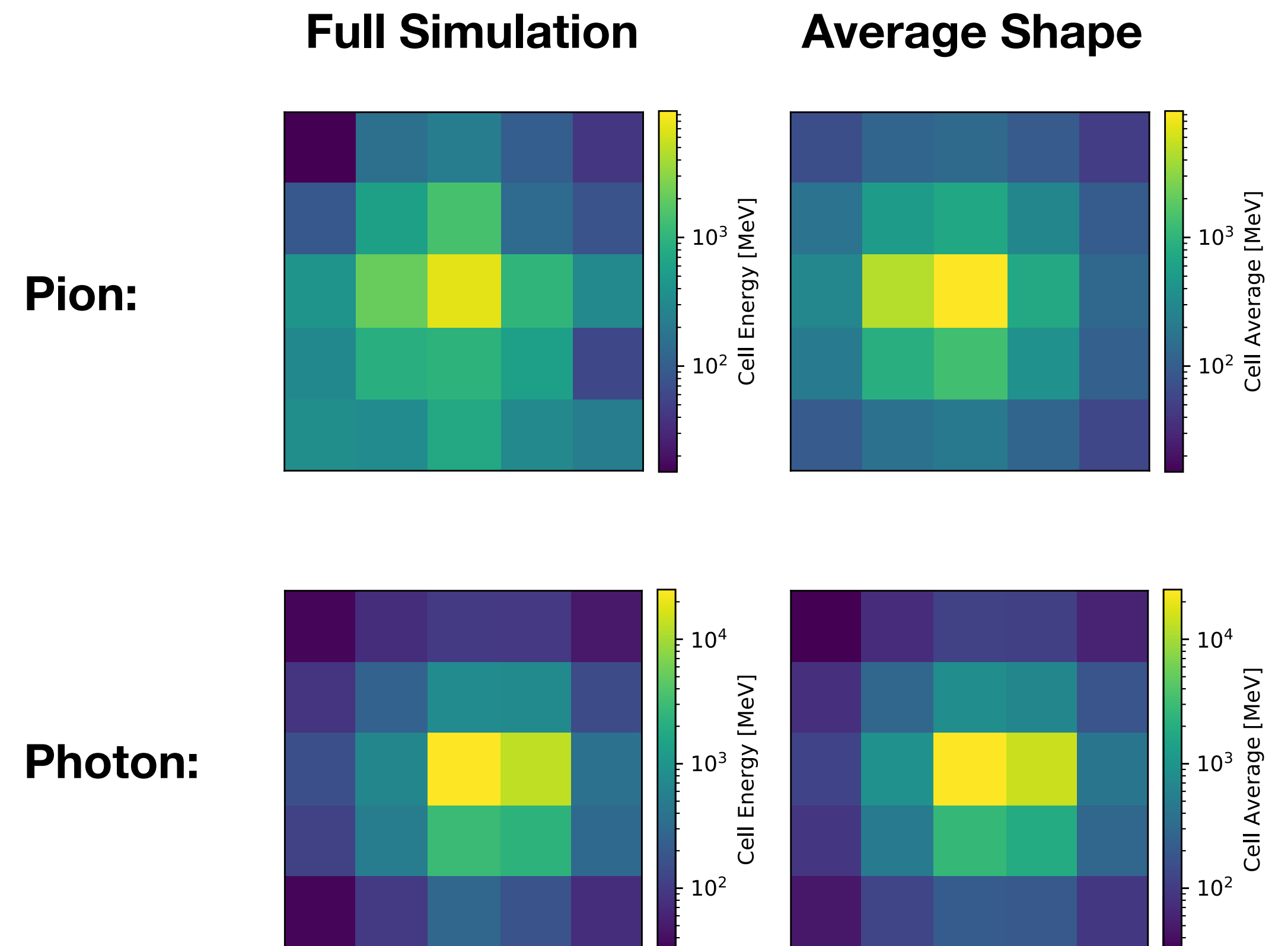
- Showering of particles in the ATLAS detector is very different for different types of particles
- Electromagnetic showers (photons, electrons, e.g.) are in general simpler, easy to model
- Hadronic showers (pions, e.g.) are much more complicated in general => very non-trivial detector response
- Modeling shower shape well is an important part of a good detector simulation
  - Allows for the use of **substructure** – how is energy distributed (e.g., within a jet), and what does this mean for physics?
  - This modeling is one of the final major issues to be resolved before broader adoption of FastCaloSim



Example hadronic (proton) and EM (photon) showers

# FastCaloSim: Current Status

- FastCaloSim is based on parameterization of the full simulation
- Idea is to parameterize the shower shape in some way
- Current approach:
  - Construct an average shape (for, e.g. a pion/ photon)
  - Randomly fluctuate about that shape (Poisson noise)
  - Neglects correlations between “fluctuations” away from the average - for hadronic showers, these can be quite non-trivial!

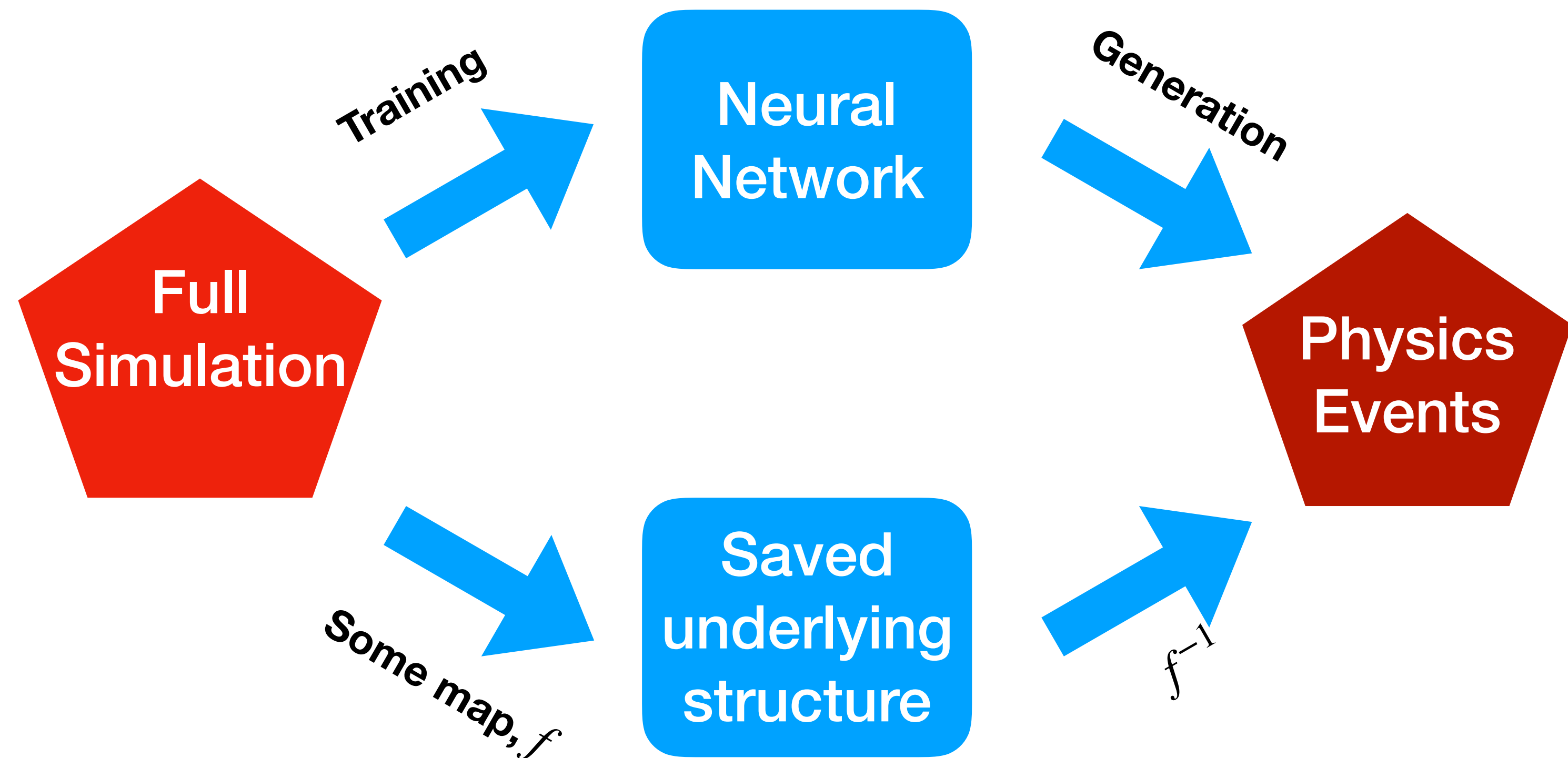


**Example of a pion and a photon event in one of the calorimeter layers. Photon is much more similar to the average**

# FastCaloSim: New Approaches

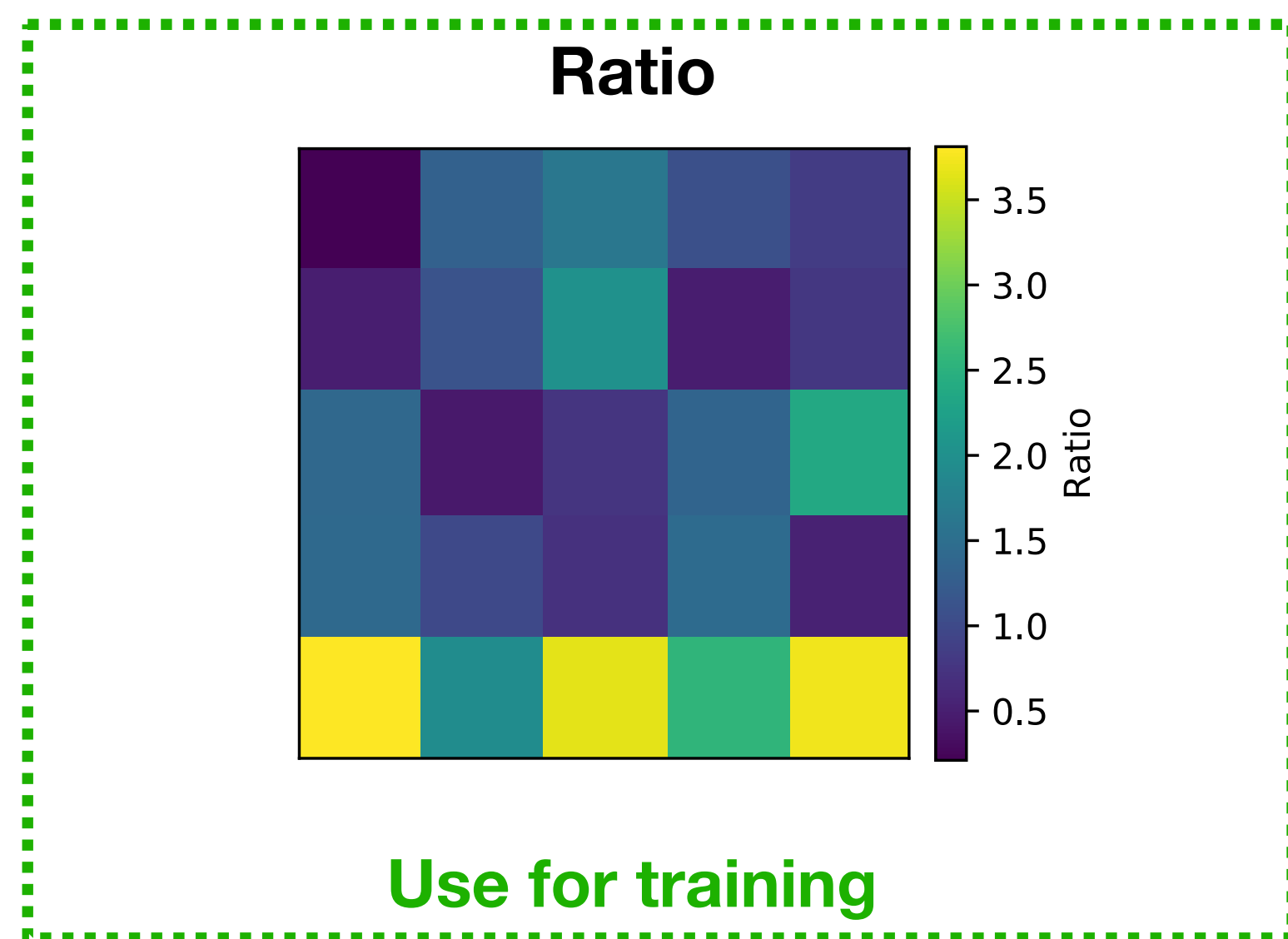
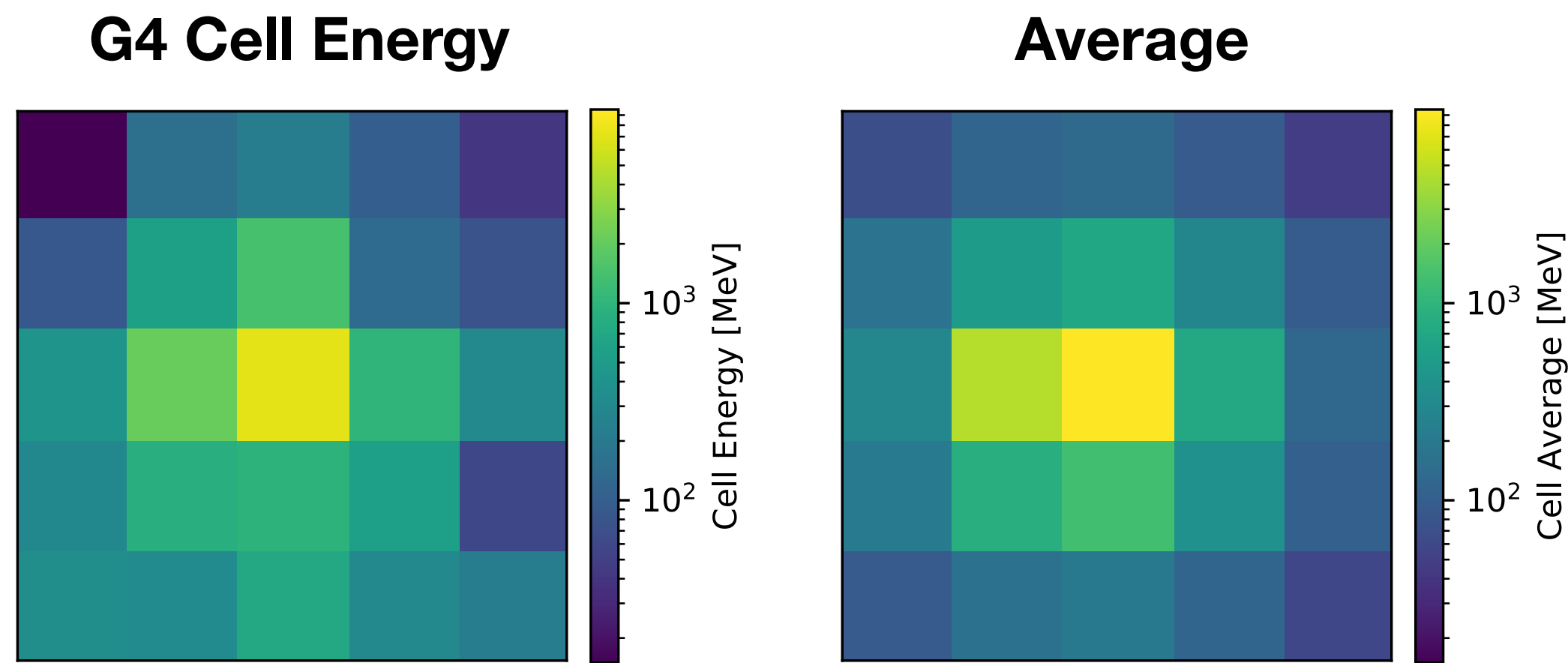
- Two approaches:

1. Machine learning! Train a neural network to reproduce realistic structure
2. Non ML-based! Find a convenient representation of the input data for generating new events



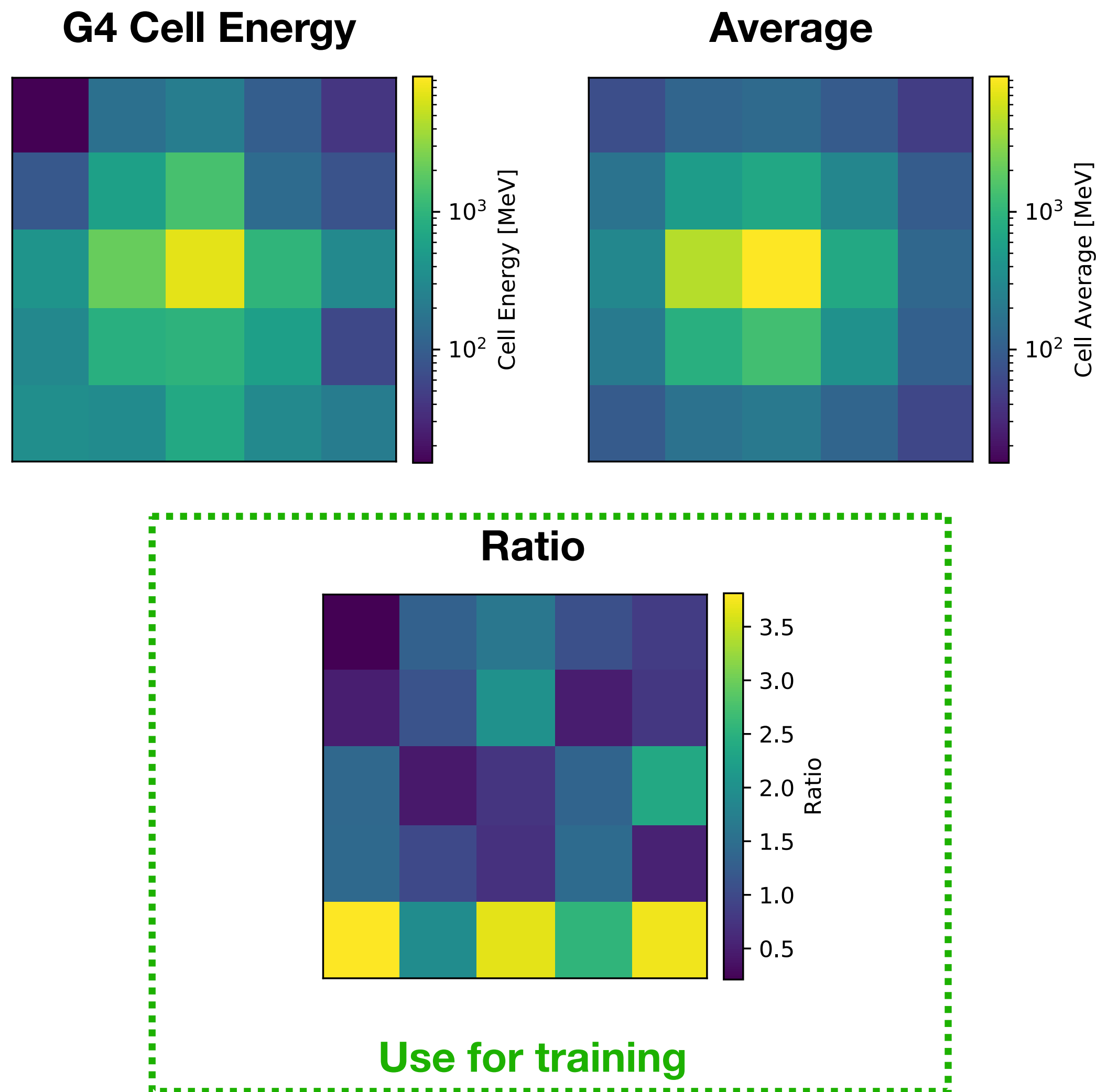


# FastCaloSim: Inputs and Goal



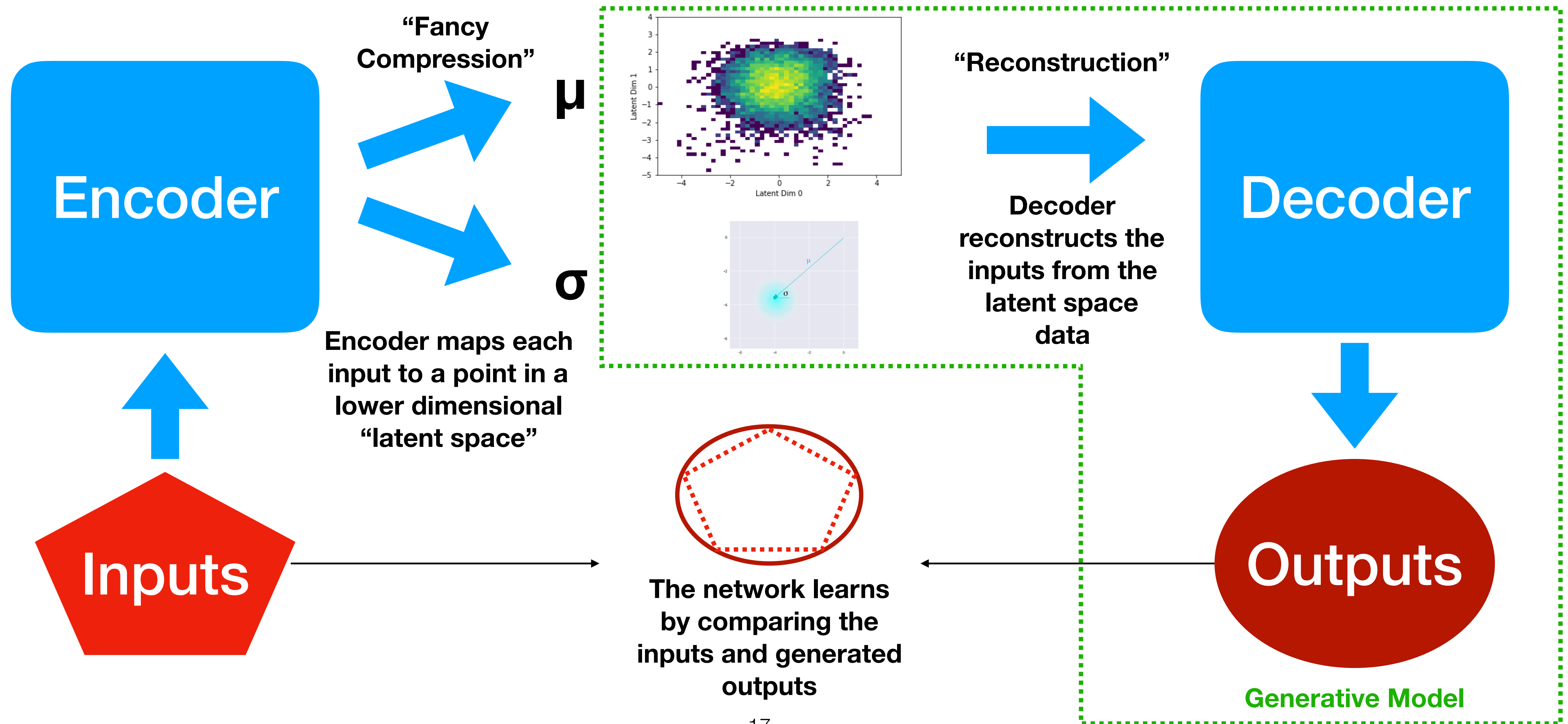
- For both methods, we use the full physics simulation as an input
  - This full simulation is from a tool called Geant4
  - Roughly: Follows each particle in steps through the detector, simulating interactions with the material
- We then look at ratios of full simulation events to the corresponding average shape (what we call “fluctuations”)
- These ratios are the inputs to our methods

# FastCaloSim: Inputs and Goal



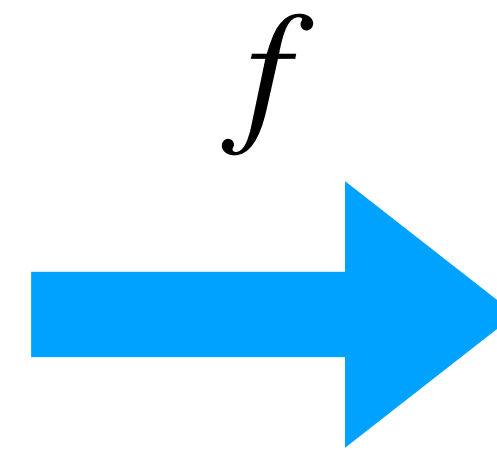
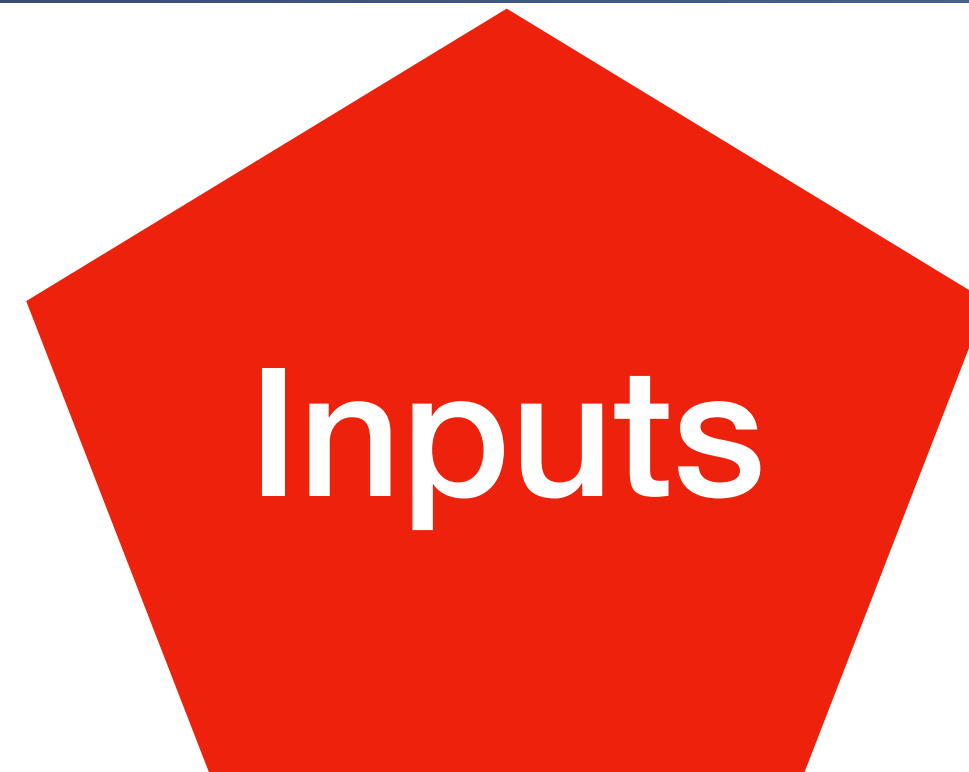
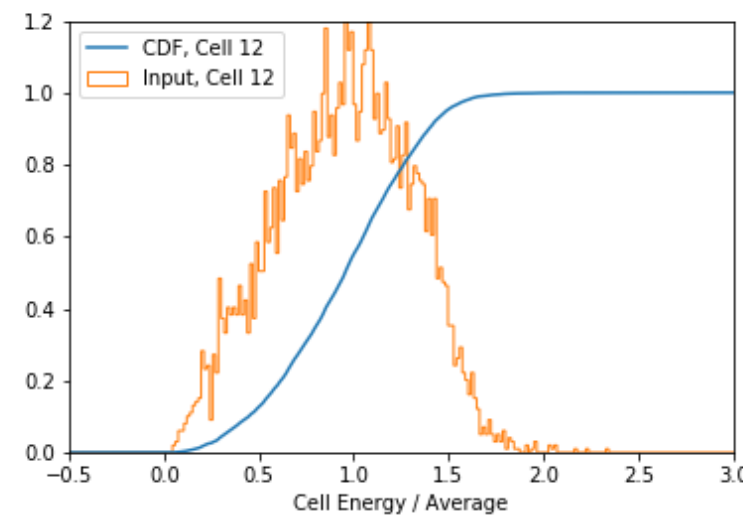
- Each event is a grid of  $n_x \times n_y$  calorimeter cells
- A calorimeter cell corresponds to the finite granularity of our physical detector
- We currently examine layers of the calorimeter individually

# FastCaloSim: Variational Autoencoder (VAE)

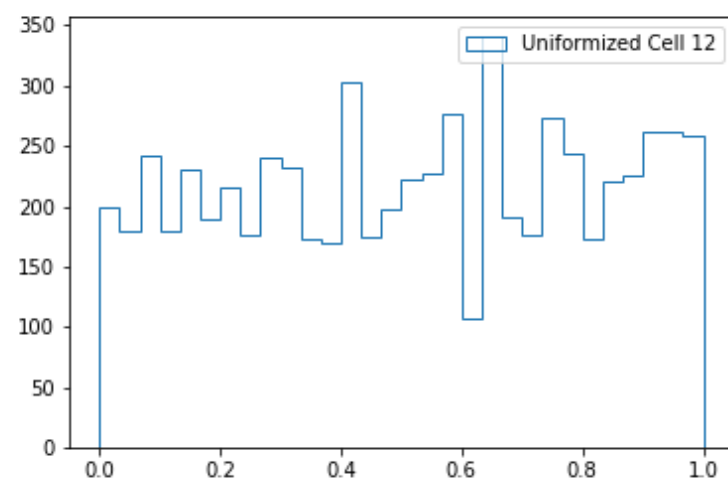


# FastCaloSim: Gaussian Method

1. Construct CDF from input distribution

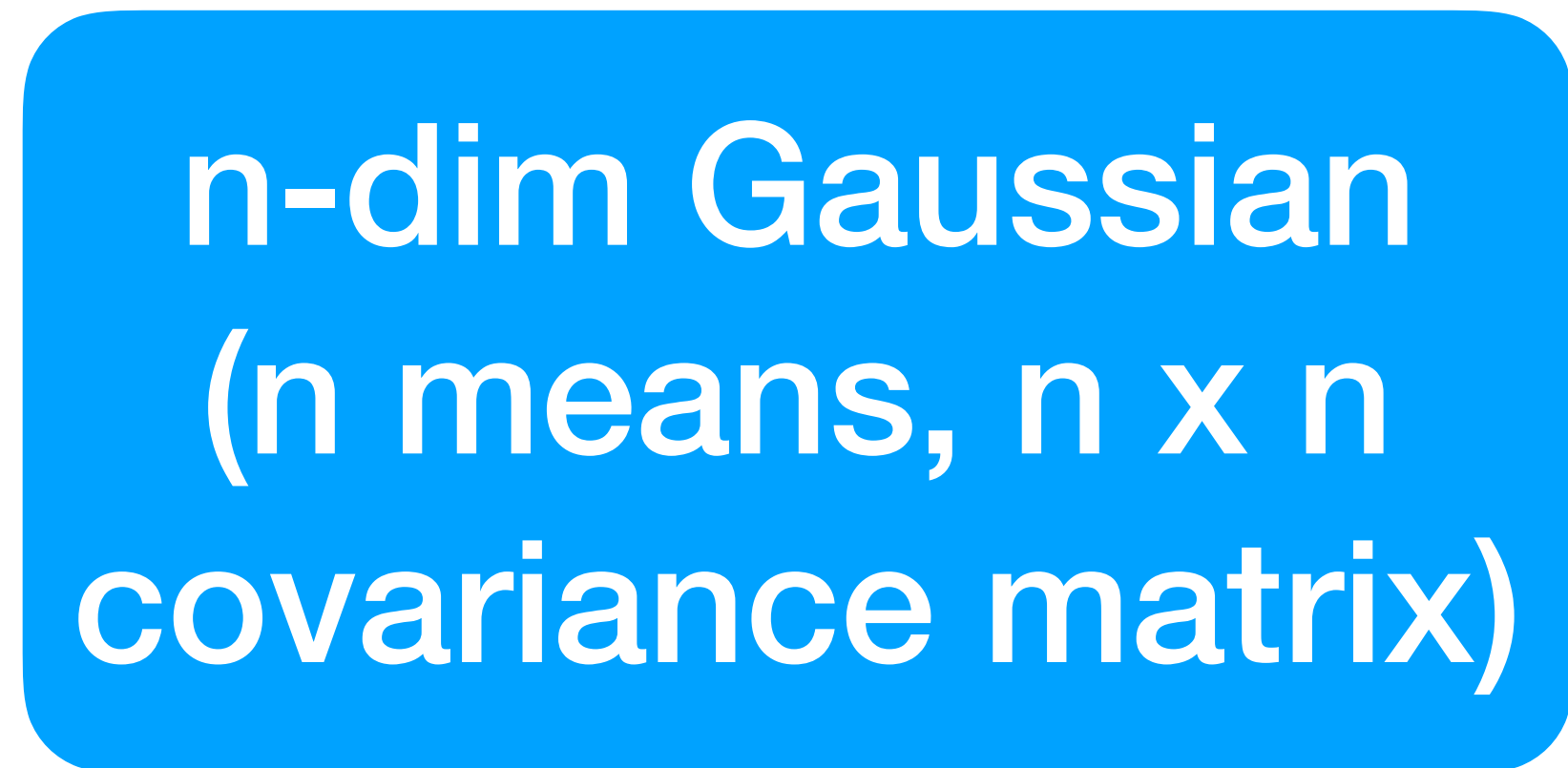
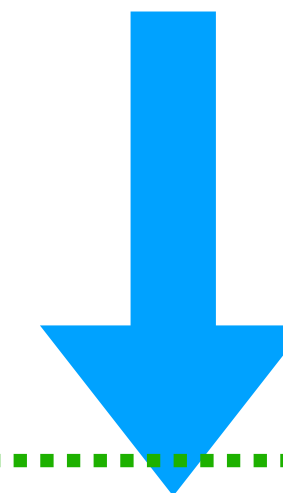


2. Uniformize by sampling from CDF (CDF(x) for each x value in input)

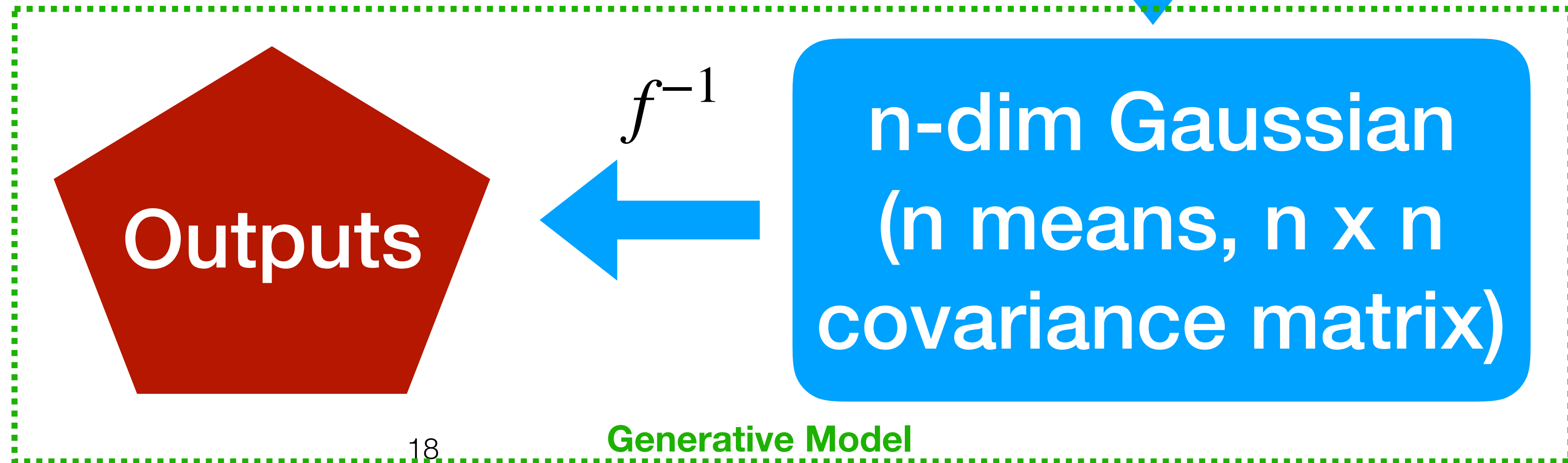
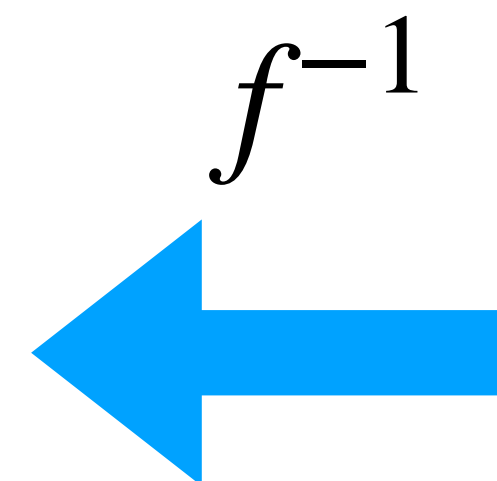
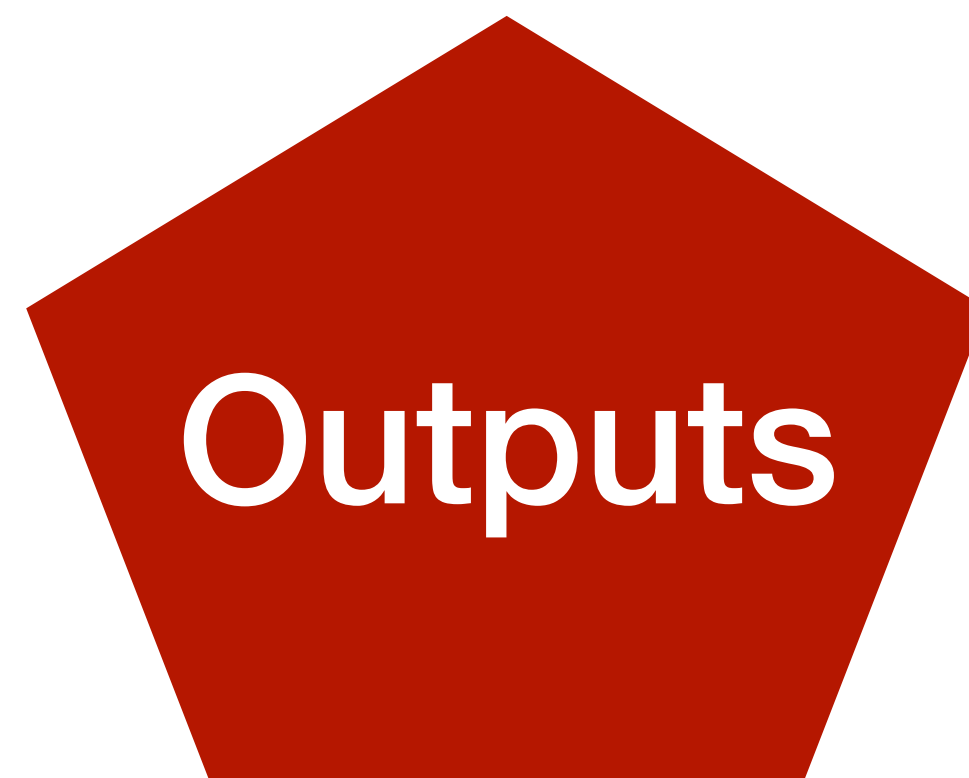
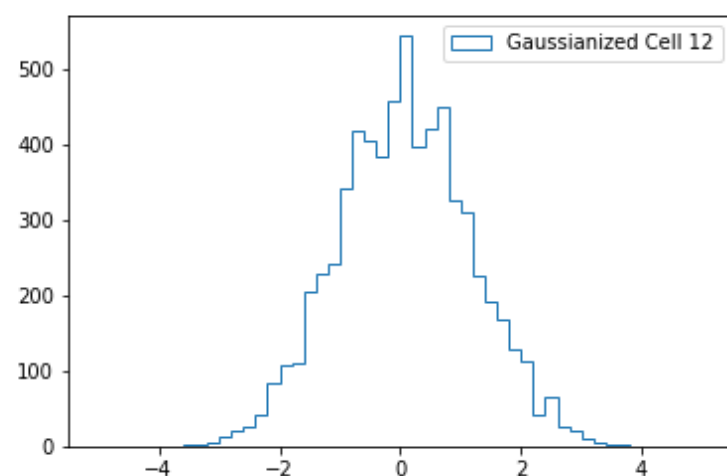


$$f_i(x) = \frac{\pi}{2} \cdot \text{erf}^{-1}(2 \cdot \text{CDF}_i(x) - 1)$$

$$f_i^{-1}(x) = \text{CDF}_i^{-1}\left(\frac{\text{erf}\left(\frac{2}{\pi}x\right) + 1}{2}\right)$$



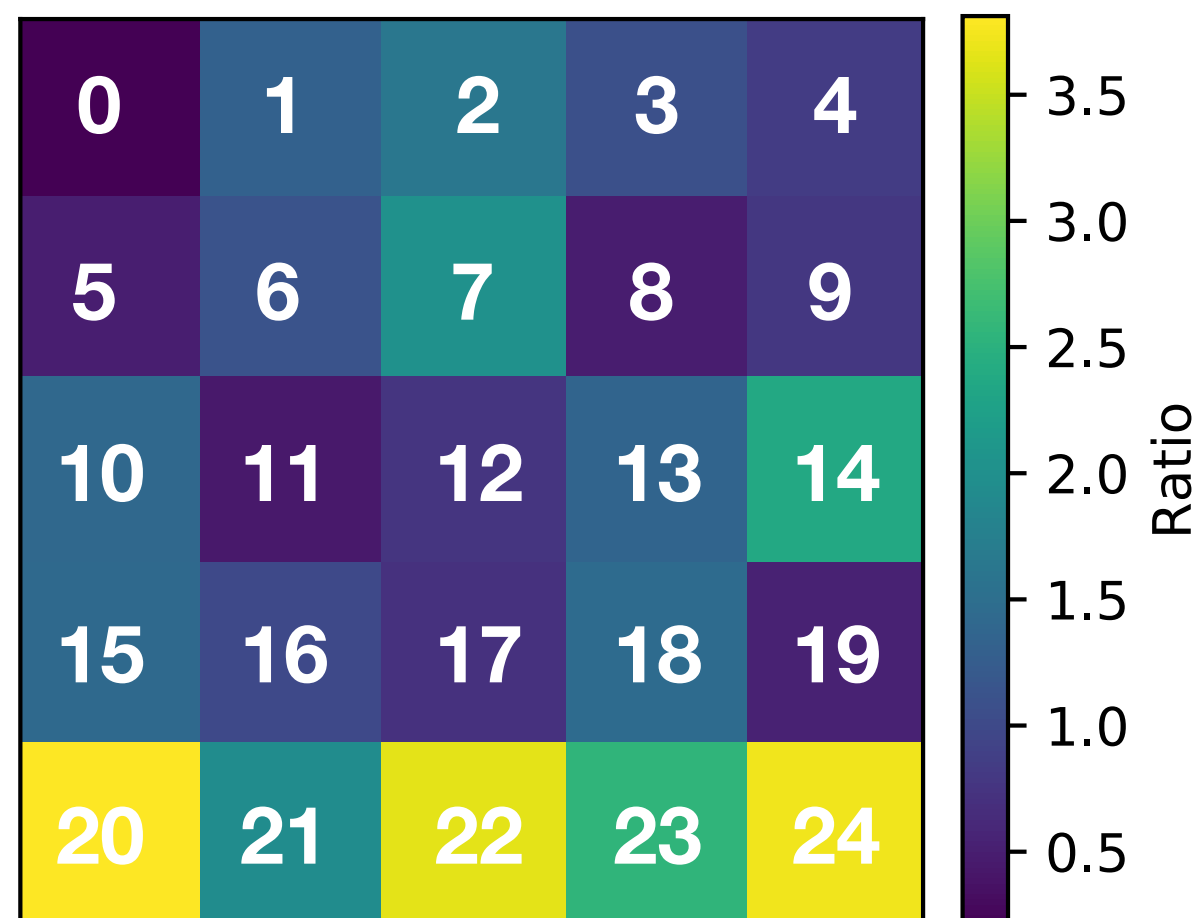
3.  $\text{erfinv}(\text{uniform}) = \text{Gaussian}$



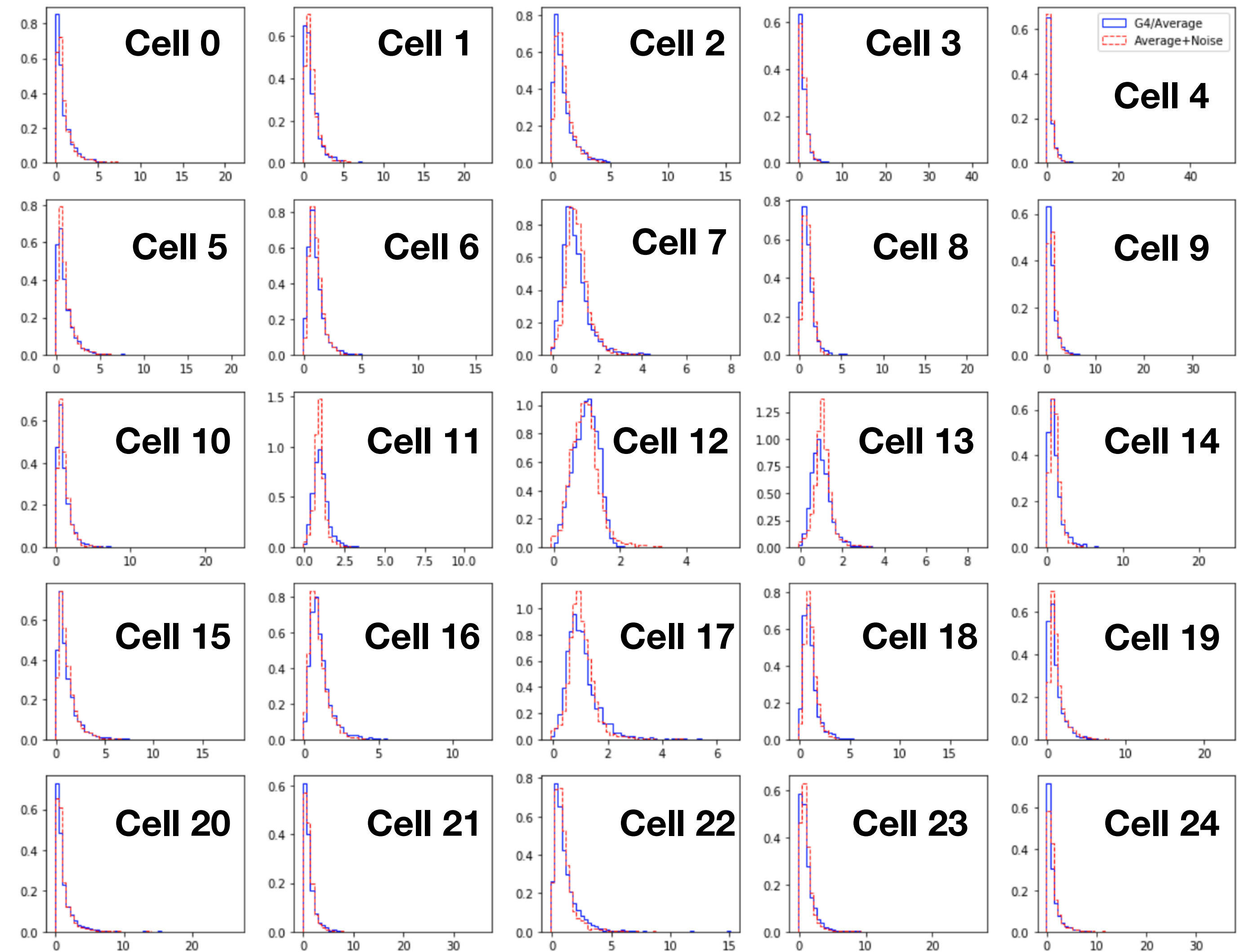


# VAE Results

Ratio (Full Sim Cell Energy / Average Sim Cell Energy, 1 event)

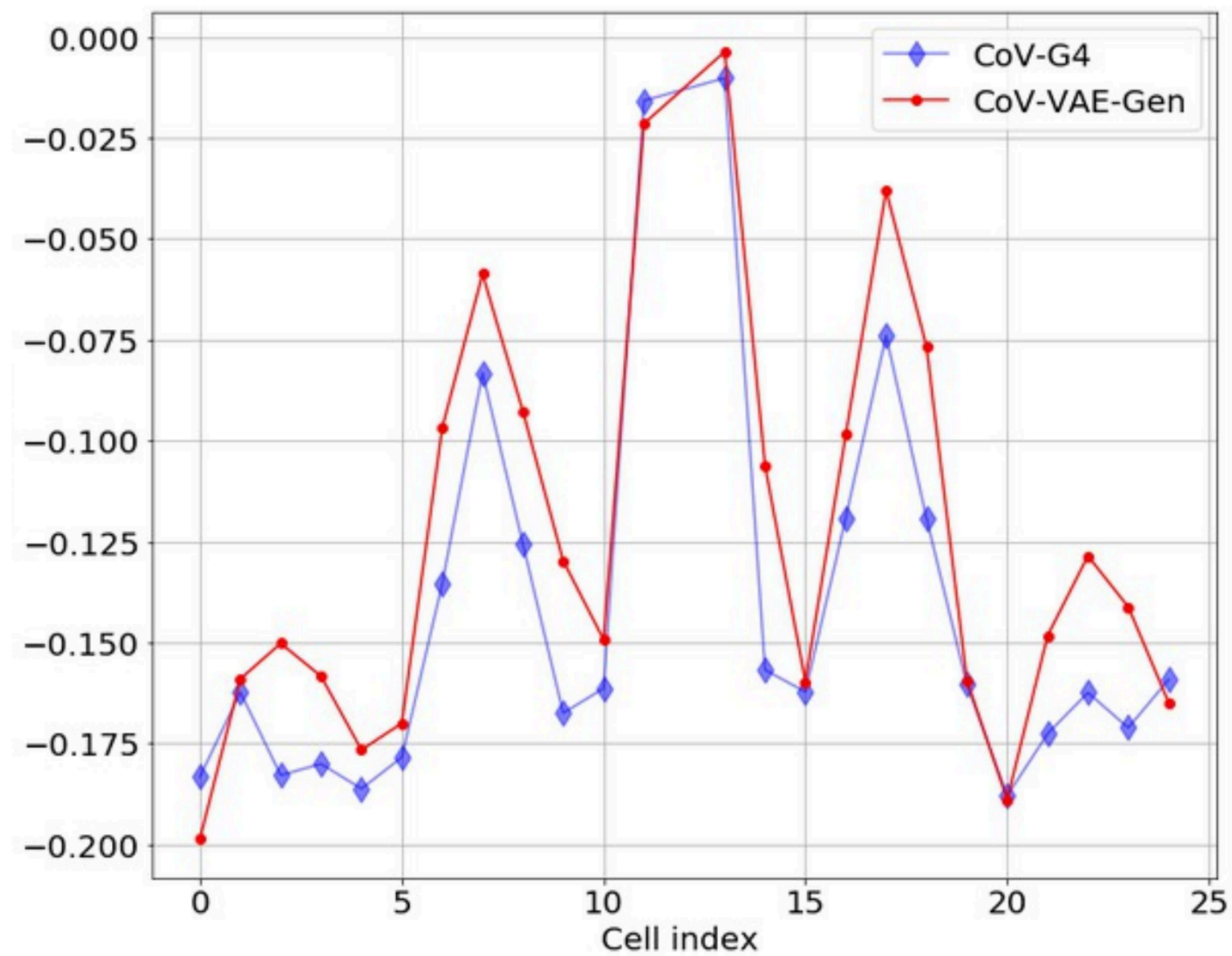


Histogram over set of events

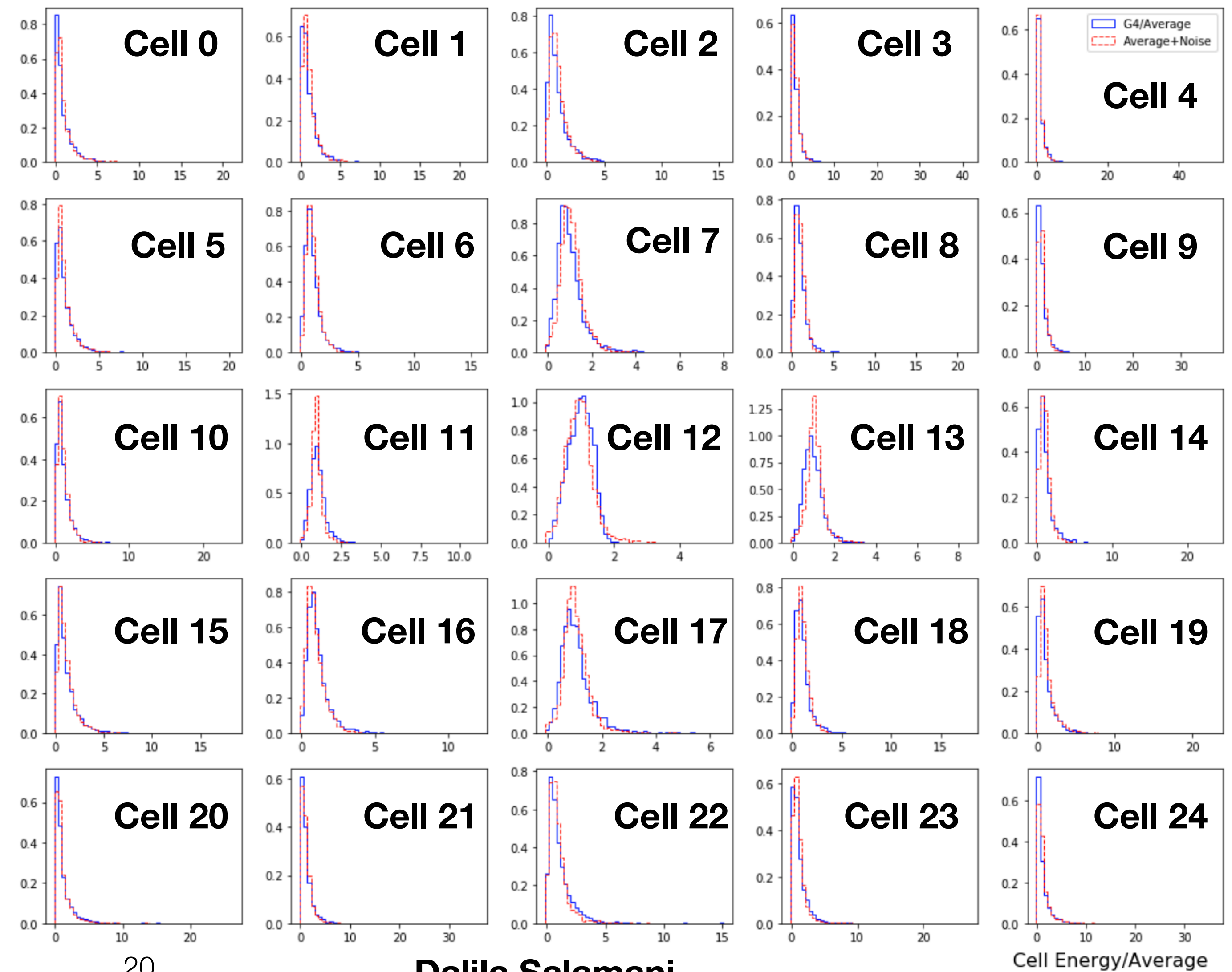


- 65 GeV pions, EMB2, 5x5 cell grid
- Distributions shown are the ratios (in each cell) to the average shape

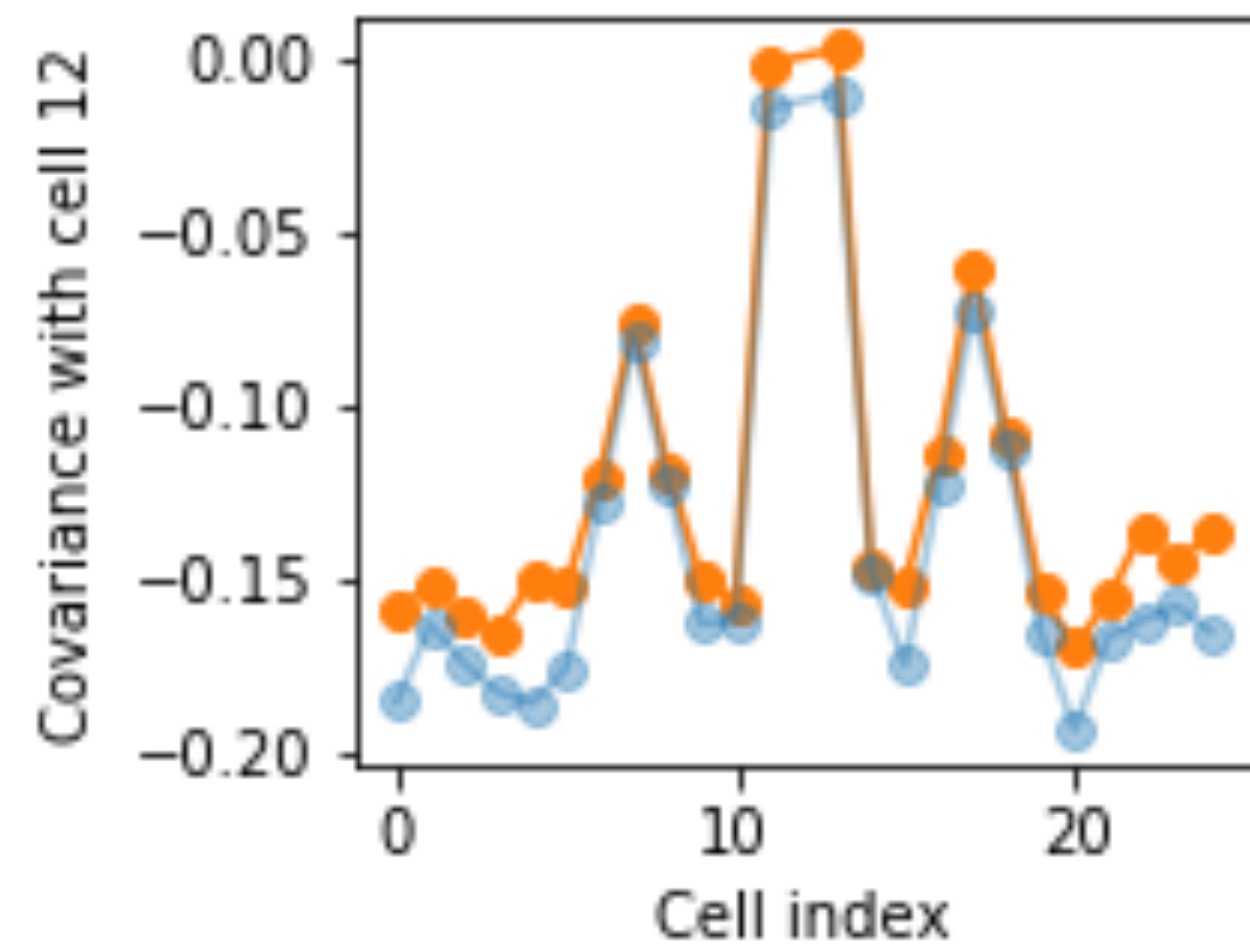
# VAE Results



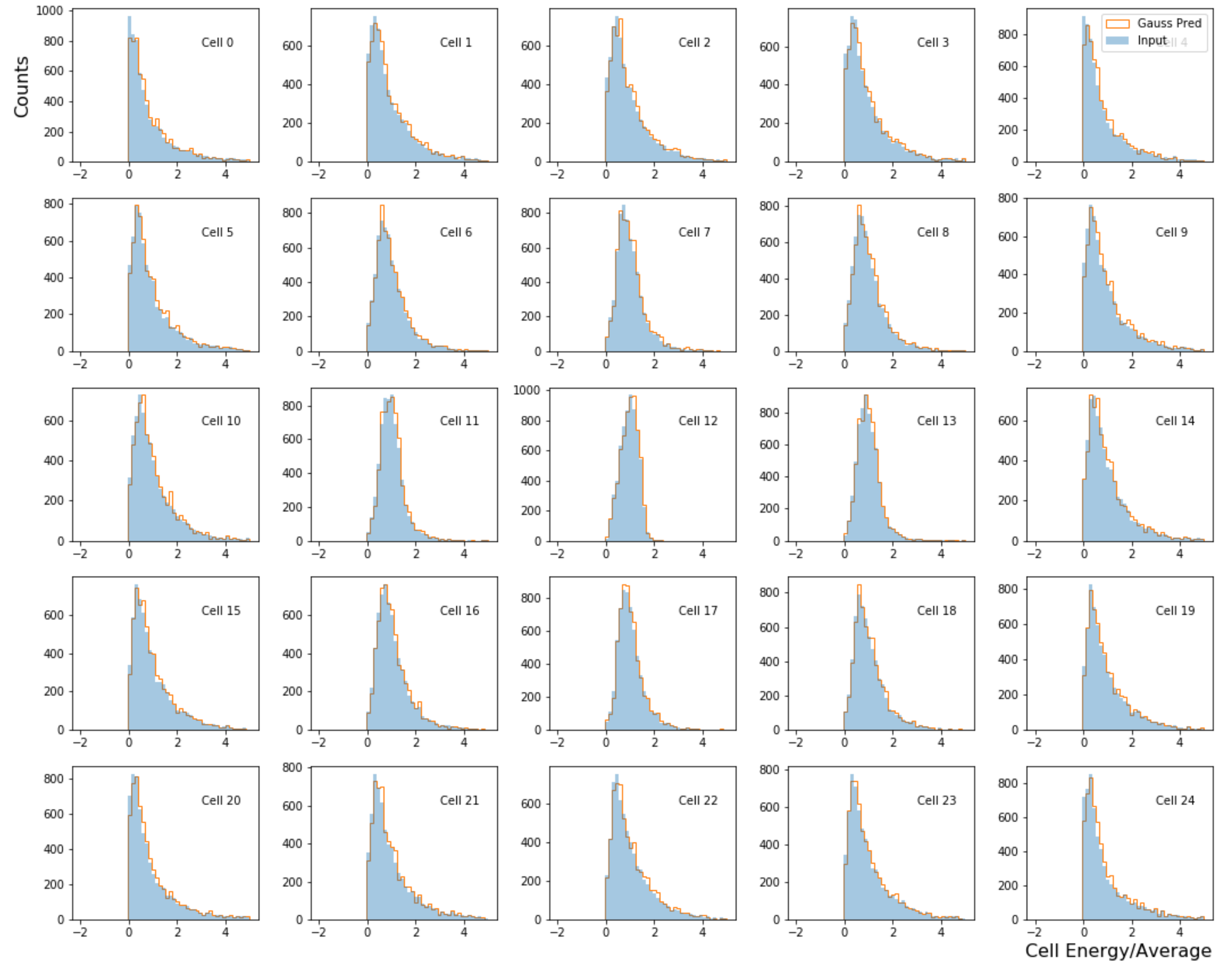
- Performs well! Covariance and distributions are well modeled



# Gaussian Method Results



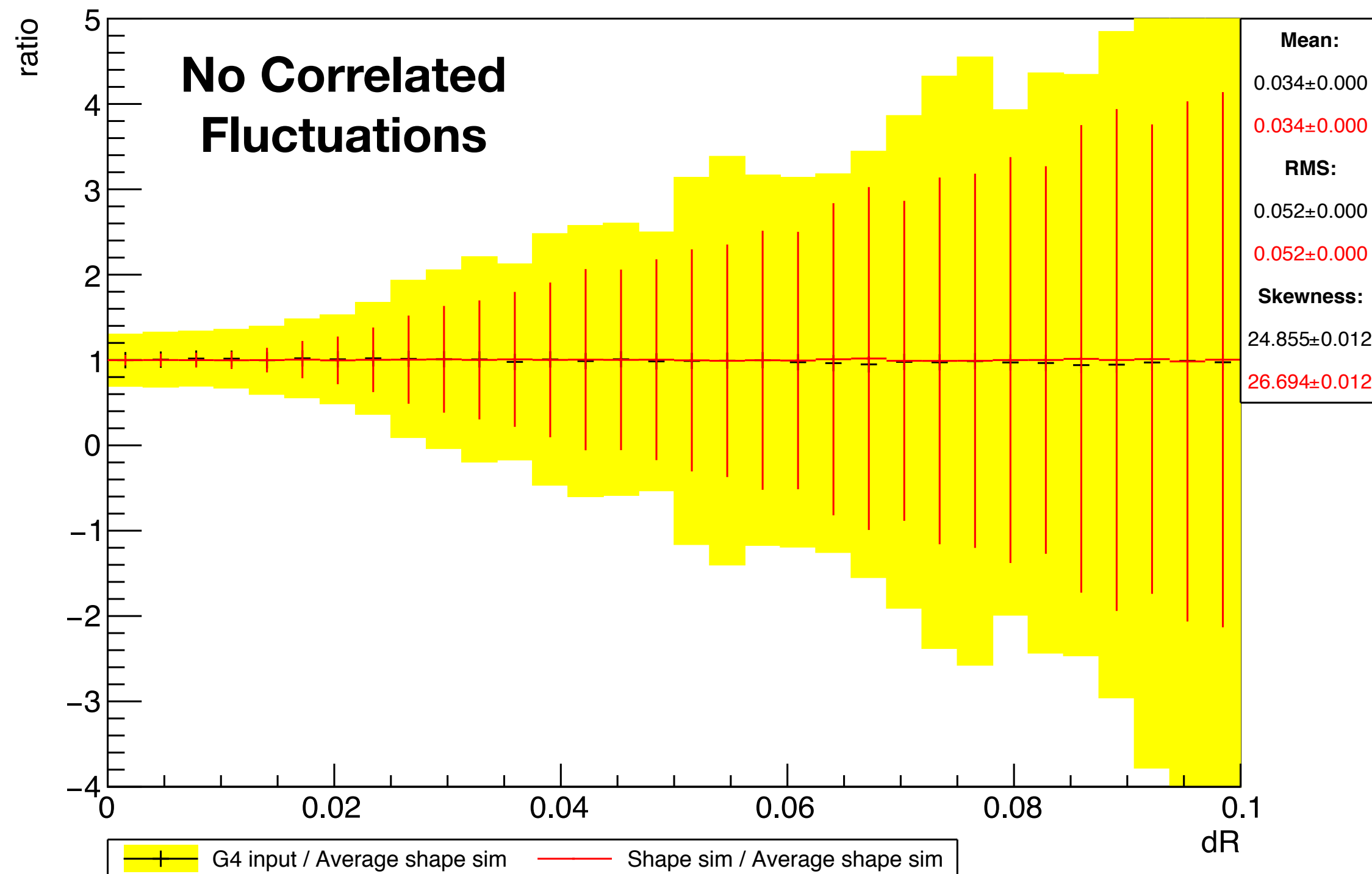
- Again 65 GeV pions, EMB2, 5x5 cell grid
- Performance is also very good!



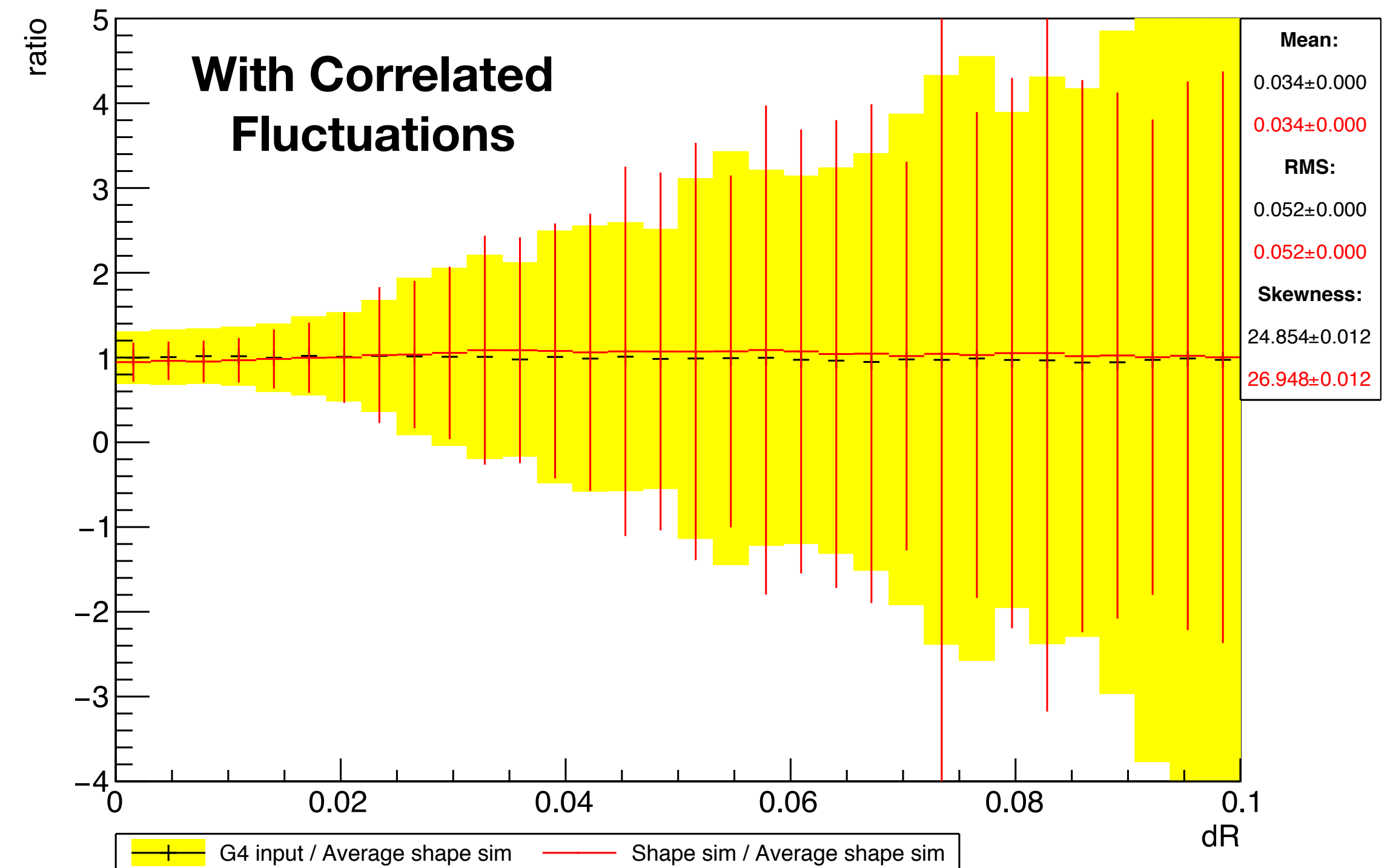


# Layer 2 (EMB2): Ratios

(G4 input / Average shape sim) / (Shape sim / Average shape sim) : pion, E=65536 MeV, 0.20 <math>k</math> <math>< 0.25</math>, sample=2, all pca



(G4 input / Average shape sim) / (Shape sim / Average shape sim) : pion, E=65536 MeV, 0.20 <math>k</math> <math>< 0.25</math>, sample=2, all pca



- Plots from the central FastCaloSim shape validation
- Nice improvement in the core

# ATLAS Qualification: Status

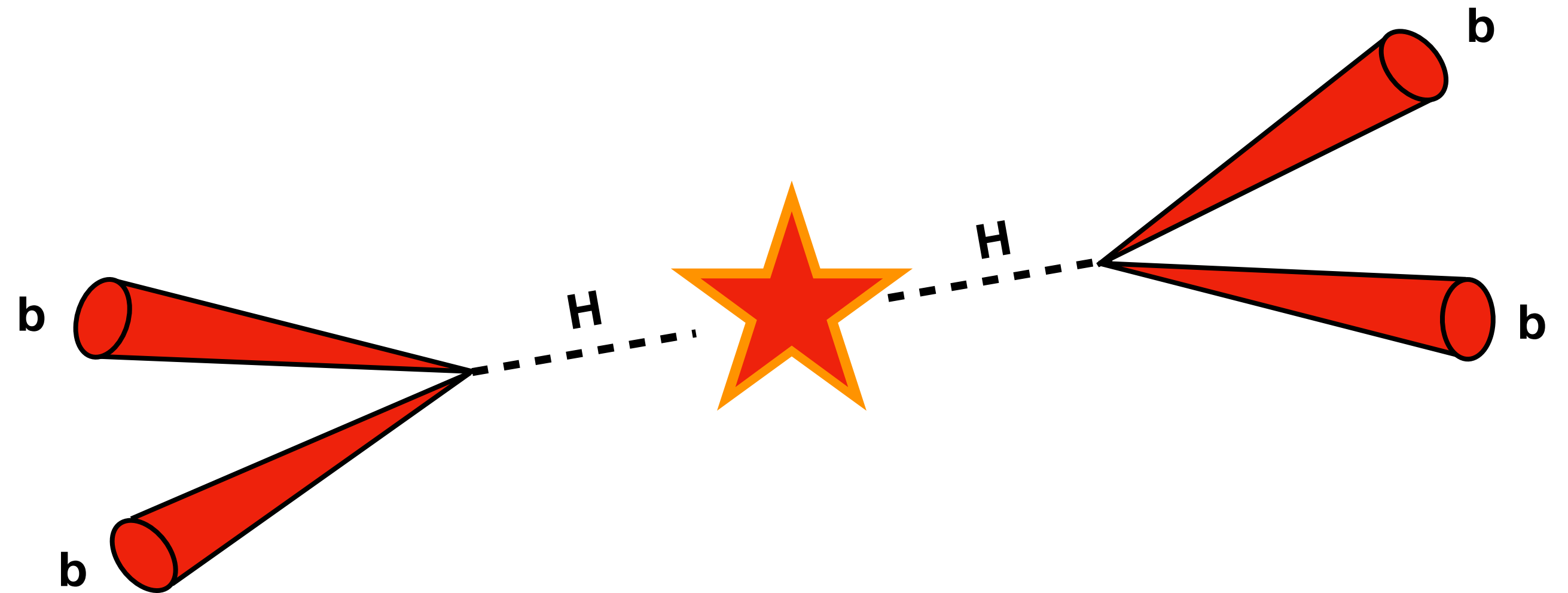
- My Contributions:
  - **VAE method:** Initial studies on VAE vs other methods. Developed much of final network structure.
  - **Gaussian Method:** Current focus, developed and studied almost entirely by me.
- I'm qualified!
  - Gaussian method is implemented in standalone FastCaloSim code and has been studied for pions across various calorimeter layers
    - VAE studies ongoing
- Future work:
  - Need to examine effect at different energies/eta points
  - Need to examine the physics impact - what does a simulated sample look like with/without this modeling?

Physics Analysis:  $HH \rightarrow b\bar{b}b\bar{b}$

# HH→4b: Motivation and Benchmarks

# HH→4b: Introduction

- General concept:
  - Two Higgs bosons are produced from a proton-proton collision
  - Each of these decay into two b quarks
- Important questions:
  - How is the HH produced?
    - Production modes, benchmarks
  - Why 4b?





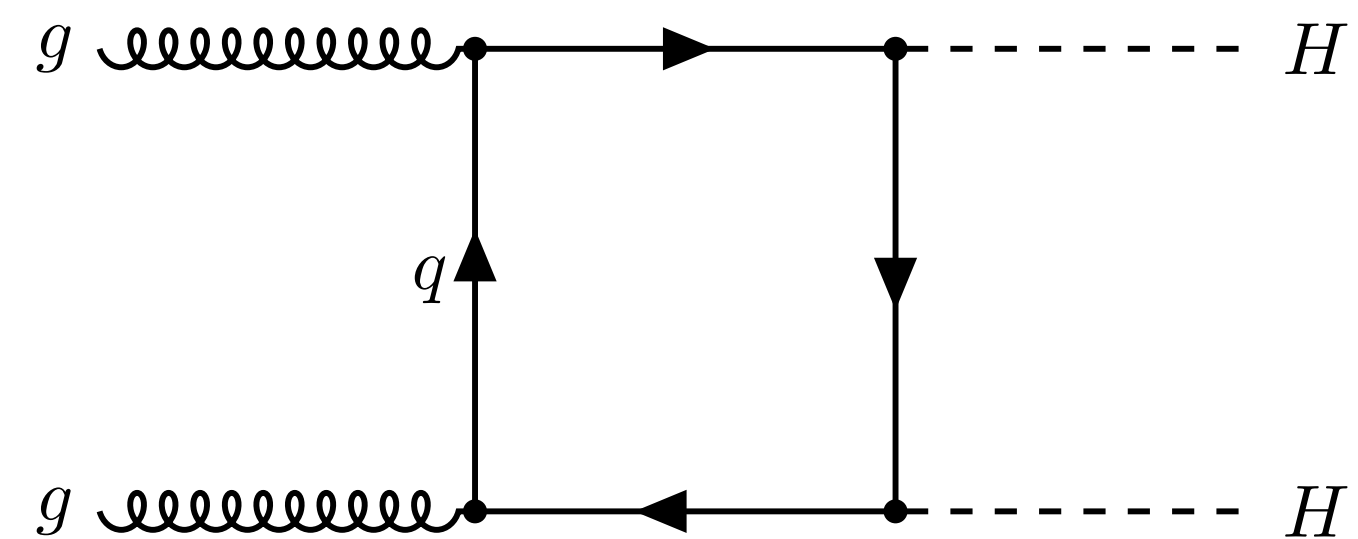
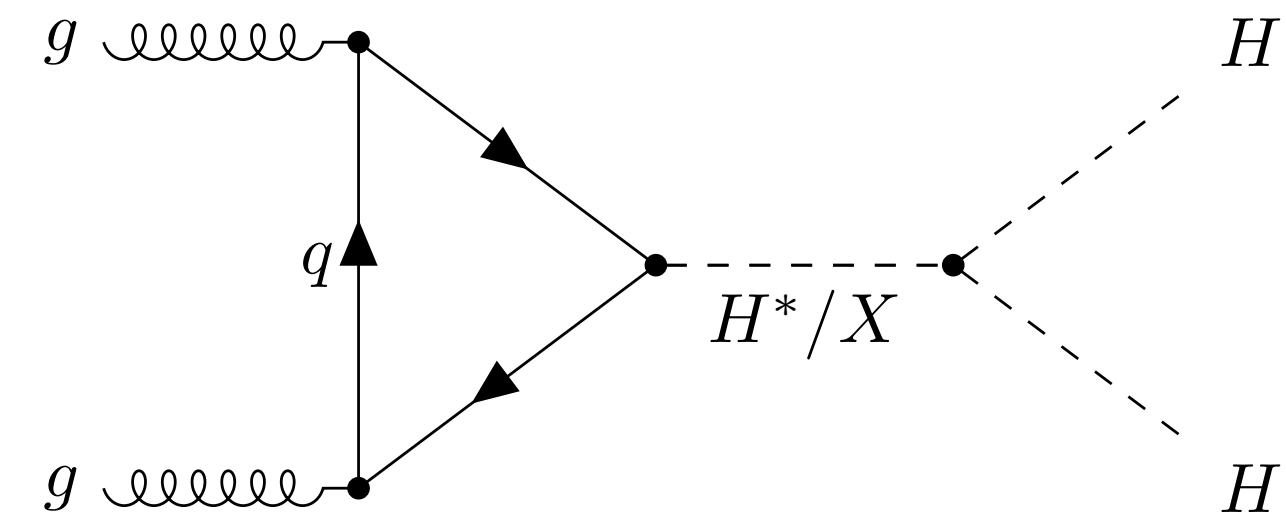
# Standard Model HH Production

- Gluon-gluon fusion (ggF) accounts for more than 90% of Standard Model HH production at the LHC
- We consequently focus on ggF production for this analysis
- For reference, the single Higgs ggF production cross section is  $\sim 46.86 \text{ pb}$  [ref] = 46860 fb
  - $\sim 1500 \times$  the HH cross section!

HH Production Mode	$\sqrt{s} = 13 \text{ TeV}$ Cross Sections [fb]
ggF HH	31.05
VBF HH	1.73
ZHH	0.363
W <sup>+</sup> HH	0.329
W <sup>-</sup> HH	0.173
ttHH	0.775
tjHH	0.0289

# HH Physics Interest

- Show here the relevant Feynman diagrams for ggF production
- Triangle diagram => signal models:
  - HH production via decay of a heavy resonance (X)
  - Non-resonant (off-shell) HH production
- Box diagram => interference
  - Extra fermion line => relative minus sign between the two diagrams
  - Summing diagrams to get the cross section then leads to a cancellation due to this negative contribution



# HH Signal Models and Benchmarks

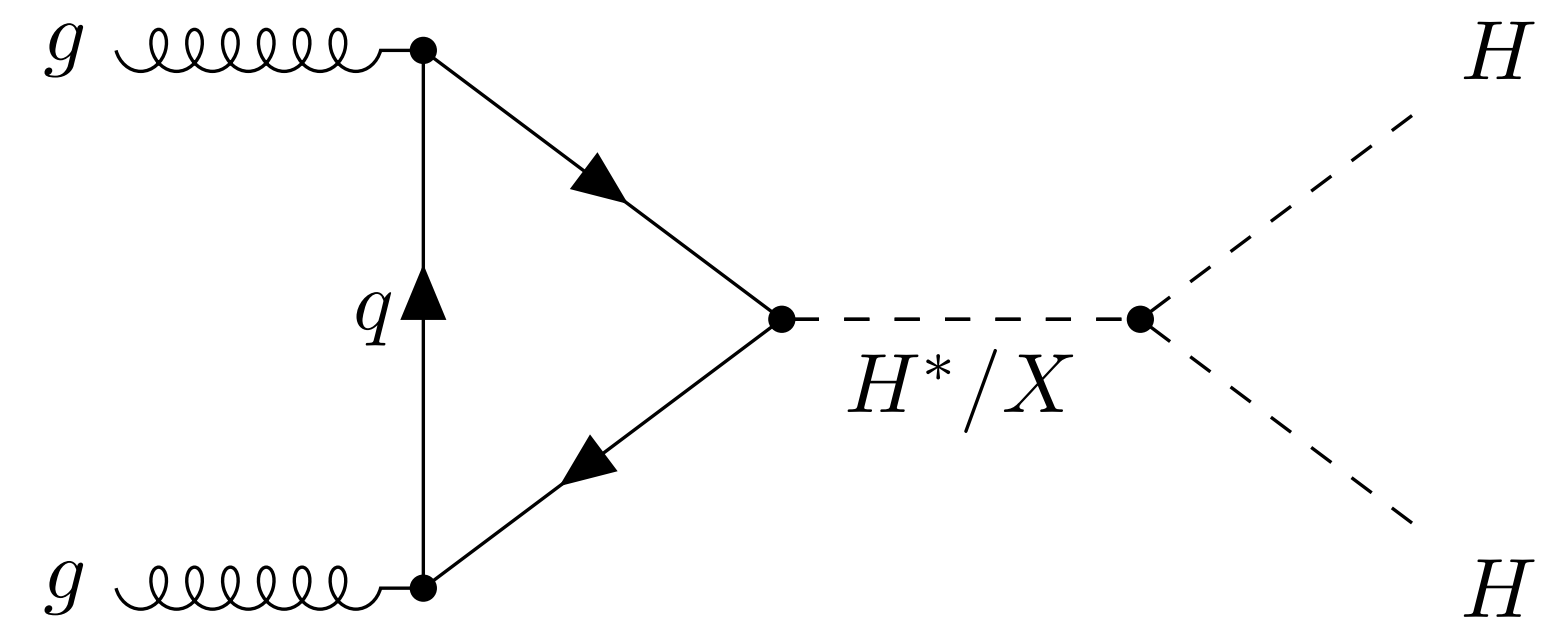
- Searches are split into two modes:

- **Non-resonant searches:**

- Standard model HH production

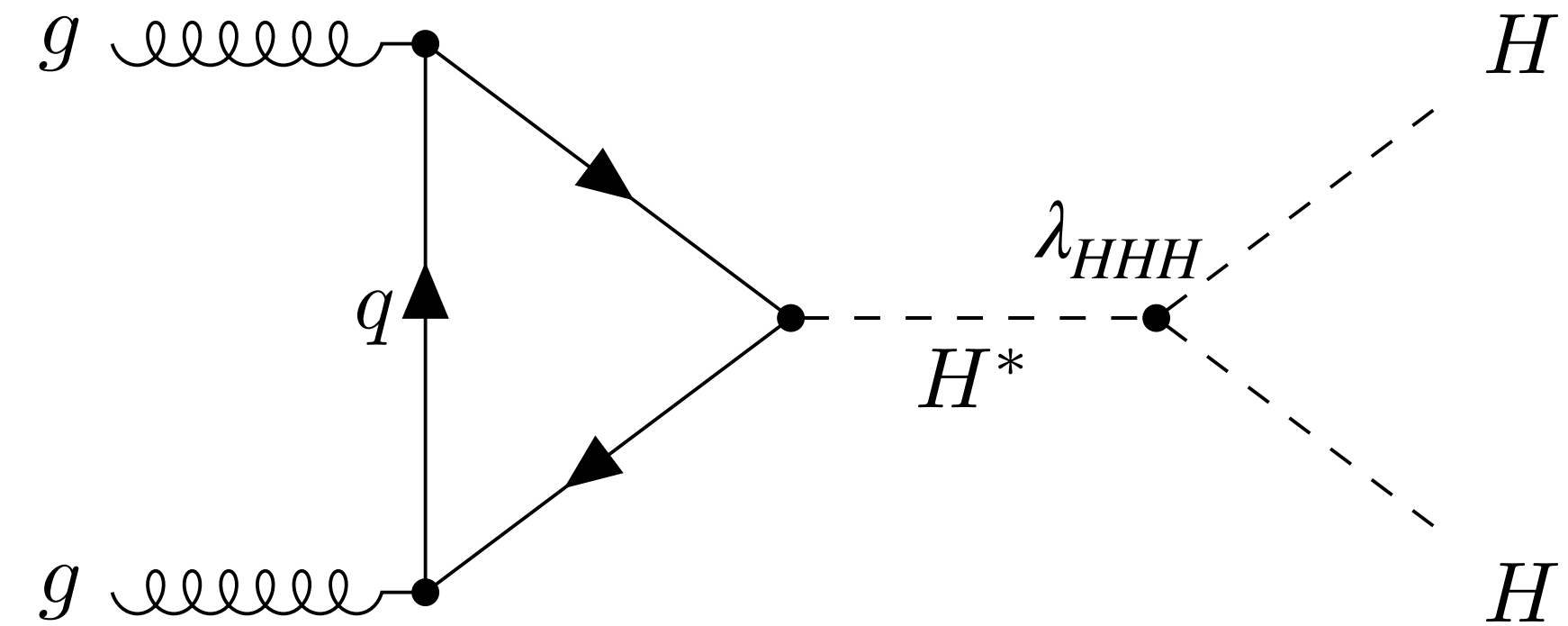
- **Resonant searches:**

- $X = \text{Heavy scalar (S)}$
- $X = \text{Spin 2 graviton (G}_{\text{KK}}^*)$



# Non-resonant HH

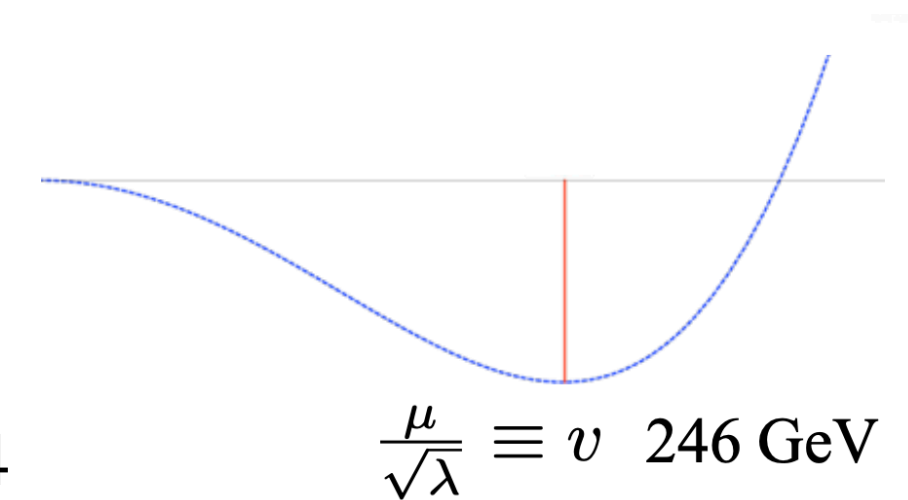
- Contribution from exchange of a virtual (off-shell) Standard Model Higgs boson
- Why do we care?
  - Standard Model process! Allows a probe of the three Higgs coupling,  $\lambda_{HHH}$
  - The relationship (on right) between  $\lambda_{HHH}$  and  $m_H$ ,  $v$ , comes directly from the shape of the Higgs potential
  - Measurement of  $\lambda_{HHH}$  is the only experimental way to reconstruct the Higgs potential



**Higgs Potential:**  $V(\phi) = -\mu^2\phi^2 + \lambda\phi^4$

**Expand about minimum:**  $V(\phi) \rightarrow V(v + h)$

$$V = V_0 + \frac{1}{2}m_H^2 h^2 + \frac{m_H^2}{2v} h^3 + \frac{m_H^2}{8v^2} h^4$$



$$\lambda_{HHH}^{SM} = \frac{m_H^2}{2v}$$

$$m_H^2 = 2\lambda v^2 \approx 125 \text{ GeV}^2$$

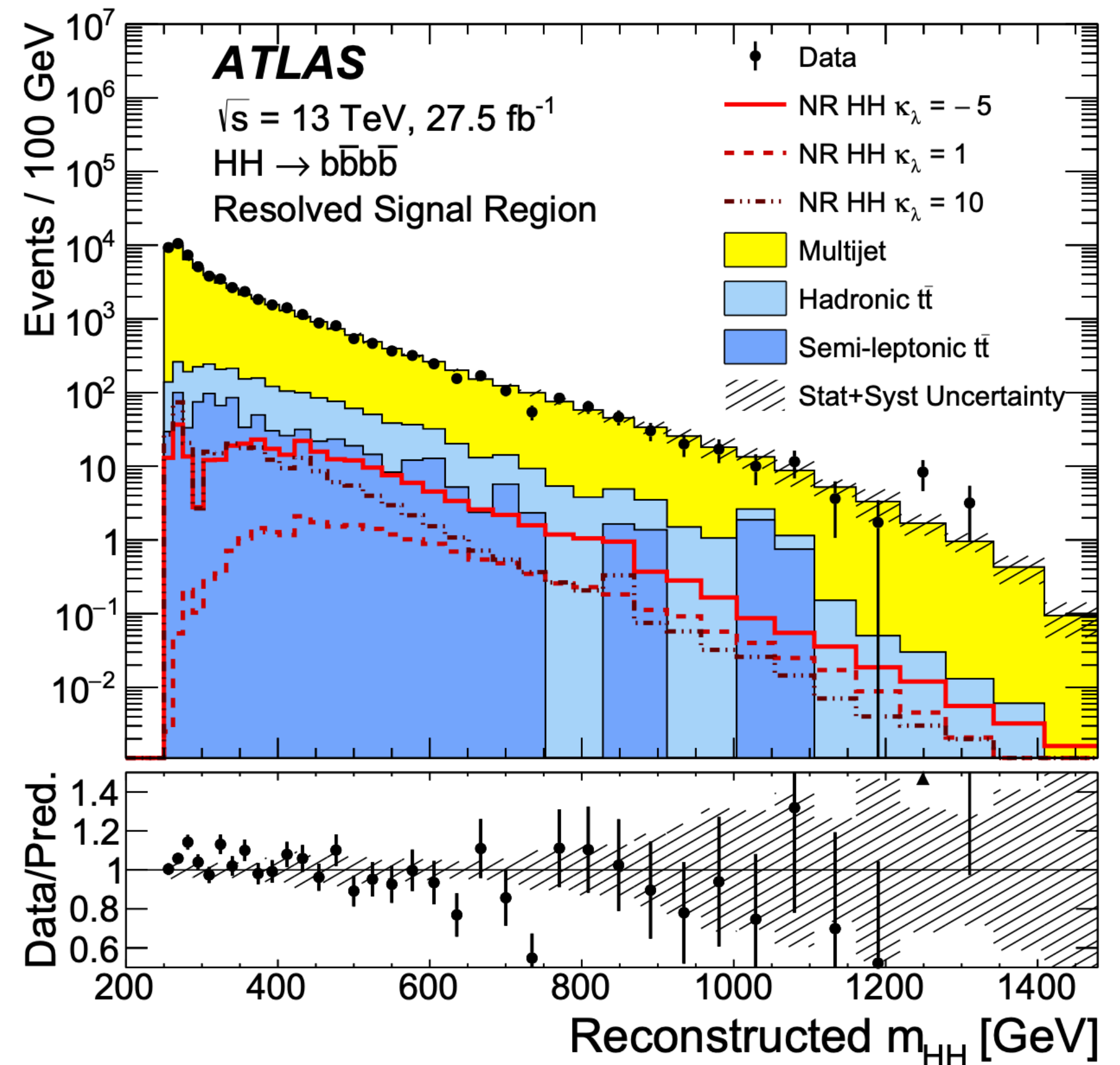
$$v = \frac{\mu}{\sqrt{\lambda}} \approx 246 \text{ GeV}$$

# Non-resonant HH: Beyond the Standard Model

- Observing Standard Model HH production and measuring  $\lambda_{HHH}$  are crucial to verifying that electroweak symmetry breaking is due to a Standard Model-like Higgs sector
- However, there are a variety of models that predict modifications to  $\lambda_{HHH}$ 
  - New degrees of freedom => mixing with other Higgs doublets, loop modifications, etc
- To probe this, we perform searches as a function of  $\lambda_{HHH}$ , usually parameterized as a function of

$$\kappa_\lambda = \frac{\lambda_{HHH}}{\lambda_{HHH}^{SM}}$$

- Varying  $\kappa_\lambda$  impacts not only the cross section, but also the kinematic distributions! Both effects contribute to our final constraints on  $\kappa_\lambda$

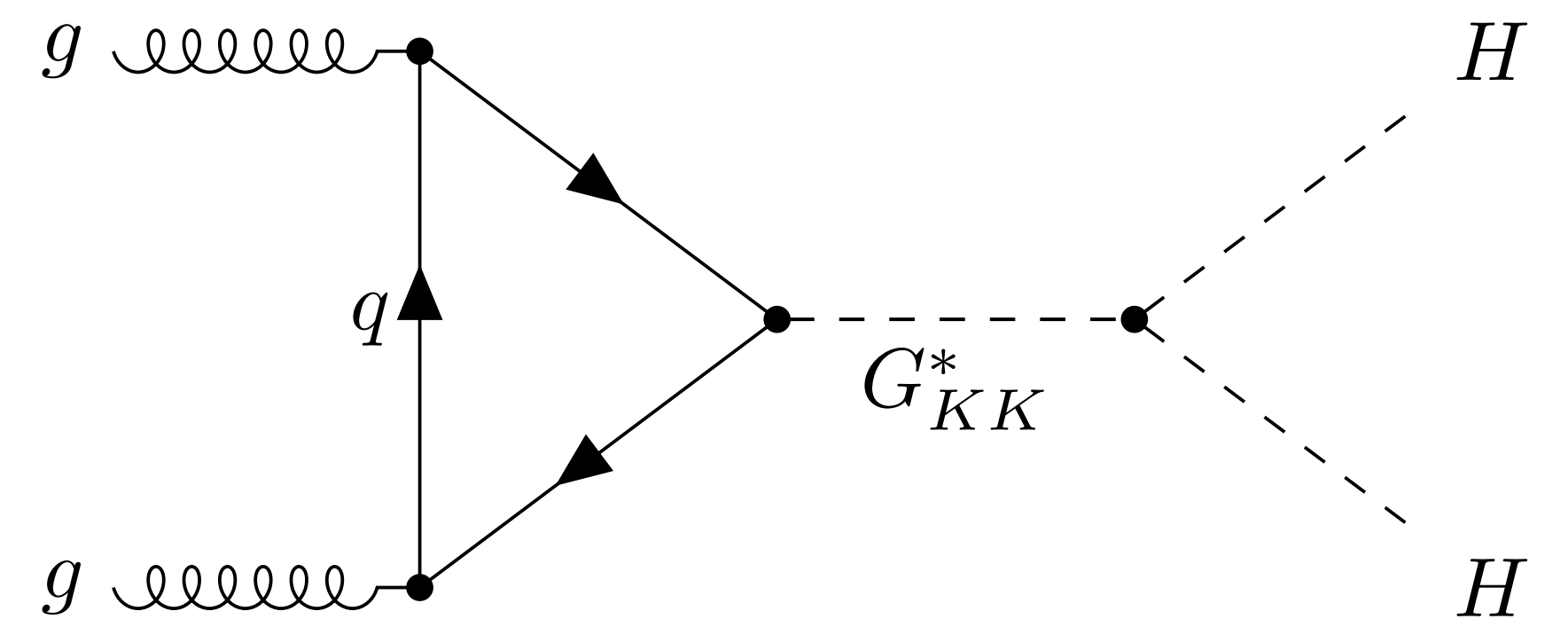
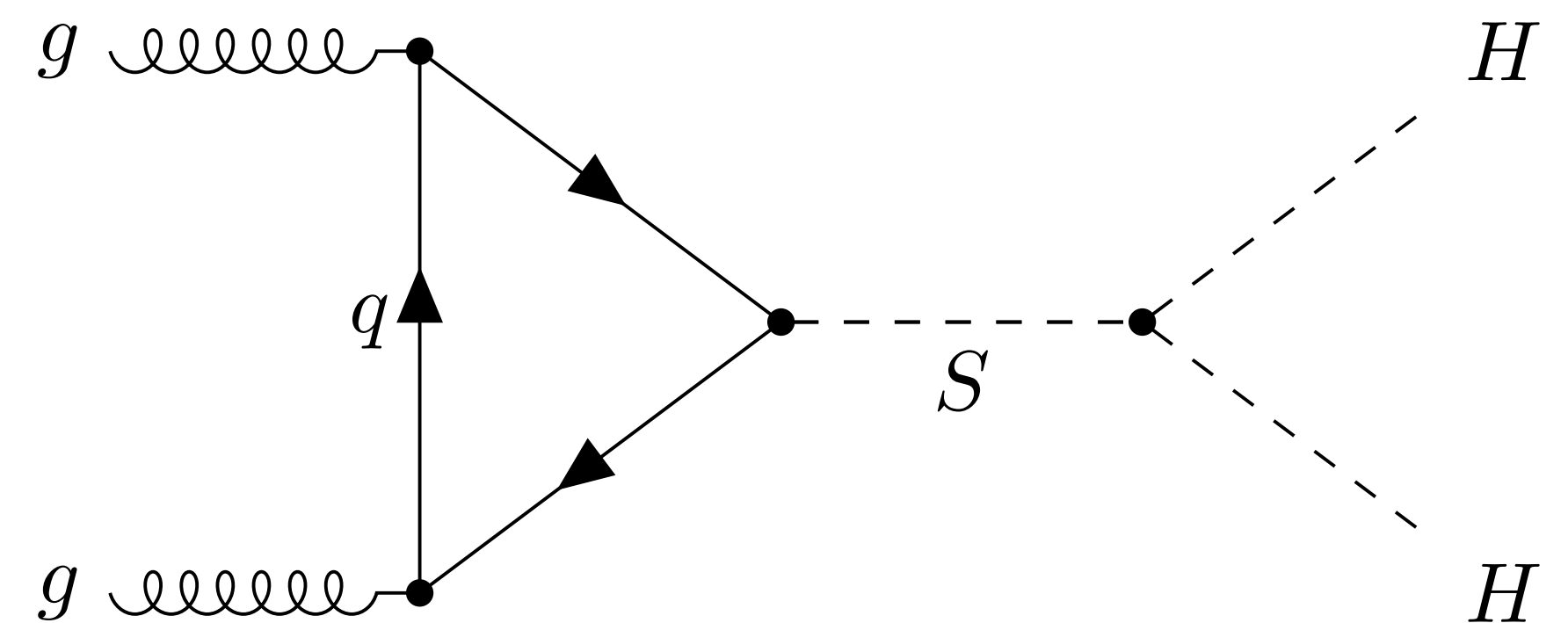


**HH→4b Signal Region  $m_{HH}$ . The colored lines show the shapes of the non-resonant HH signal for  $\kappa_\lambda = -5, 1$  (SM value), and 10 [ref]**



# Resonant Searches

- **Spin 0:** Generic search for a heavy scalar resonance (no specific model assumed)
  - Applicable to, e.g., 2 Higgs doublet models, where the scalar is a heavy Higgs
- **Spin 2:** Kaluza-Klein Graviton in the Randall Sundrum model
  - Graviton arising from a warped extra dimension
  - Model parameter  $c = k/\overline{M}_{Pl}$ , where  $k$  is the curvature of the extra dimension,  $\overline{M}_{Pl}$  is the Planck mass



# 4b or not 4b?

- The Higgs boson decays to a variety of different particles
- The most common decay mode is to  $b\bar{b}$  (58%)
- Thus, it is natural to look for HH decays involving  $b\bar{b}$

H Decay Mode	Fraction
bb	58.24%
WW	21.37%
gg	8.187%
$\tau\tau$	6.272%
cc	2.891%
ZZ	2.619%
$\gamma\gamma$	0.227%
Total	99.806%

**Branching Ratios for  $m_H = 125$  GeV**

# 4b or not 4b?

- Show on the right HH branching fractions (derived from the previous slide)
- As expected 4b has the largest branching fraction (~34% of HH decays) – great place to look!
- There are also a variety of other channels with significant contributions

HH Branching Fractions	bb	WW	$\tau\tau$	ZZ	$\gamma\gamma$
bb	34%				
WW	25%	4.6%			
$\tau\tau$	7.3%	2.7%	0.39%		
ZZ	3.1%	1.2%	0.33%	0.069%	
$\gamma\gamma$	0.26%	0.10%	0.028%	0.012%	0.0005%

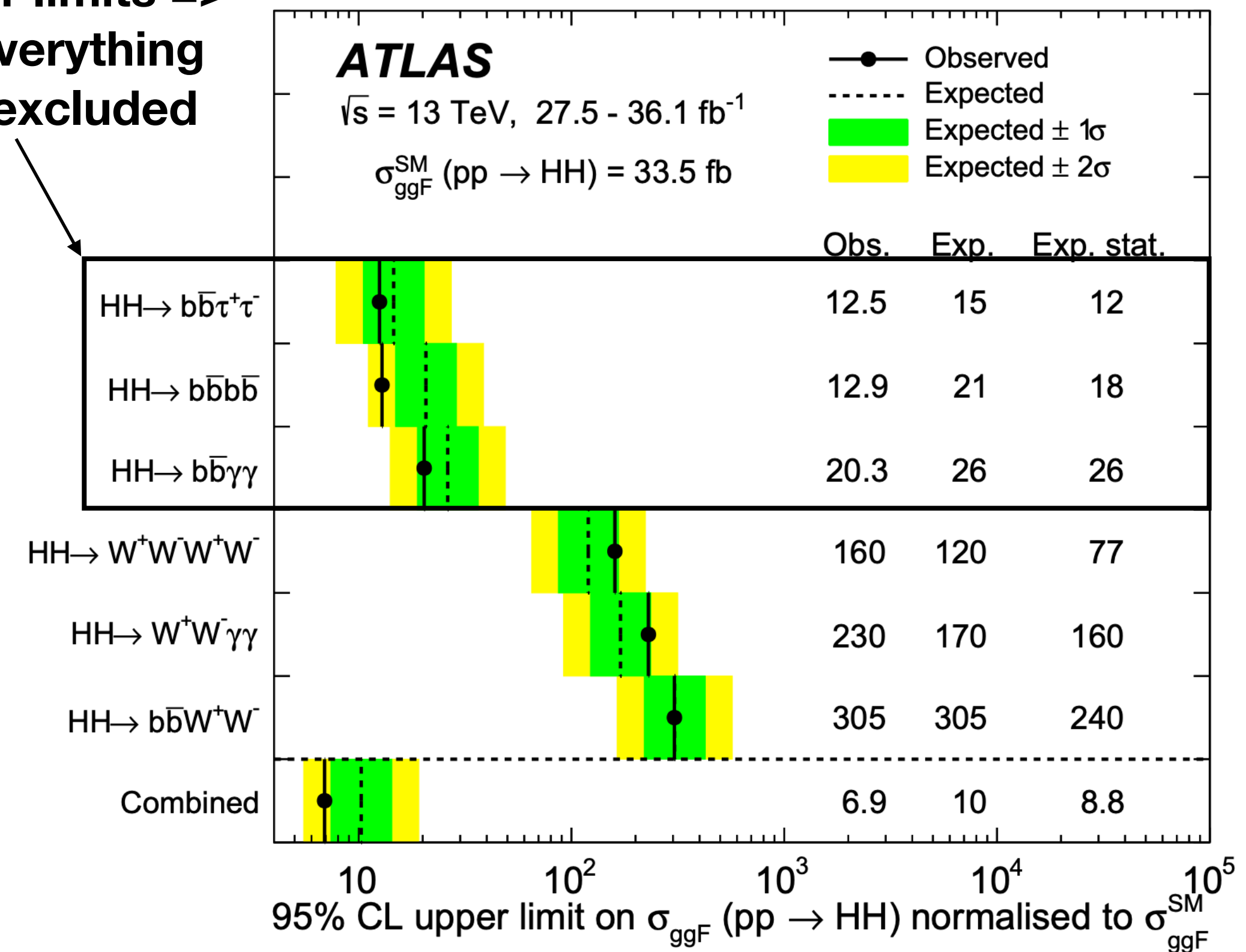
Branching Ratios



# Beaten by Background

- Can often gain in other channels from lower amounts of (irreducible) background
- LHC is a hadronic collider => lots of events from generic QCD processes
- Hadronic HH processes are difficult to distinguish from these generic QCD processes
- Other objects ( $\tau$ ,  $\gamma$ ) help to distinguish signal from these generic events => smaller overall background

3 most sensitive channels. Upper limits => left is better, everything to the right is excluded



Limits on Standard Model HH production from some of the most sensitive channels [ref]

# HH→4b: Analysis and Selection

# Some Context

- A paper was published with the ATLAS data from 2015/2016 ( $36.1 \text{ fb}^{-1}$ )
- Our target is to publish on inclusive Run II data ( $15/16/17/18 = 139 \text{ fb}^{-1}$ )
- Important baseline steps for this:
  - Understanding/reproducing the previous analysis
  - Understanding the effect of changes to physics objects (e.g. in b-tagging)

ACCEPTED: December 19, 2018  
PUBLISHED: January 3, 2019

**Search for pair production of Higgs bosons in the  $b\bar{b}b\bar{b}$  final state using proton-proton collisions at  $\sqrt{s} = 13 \text{ TeV}$  with the ATLAS detector**



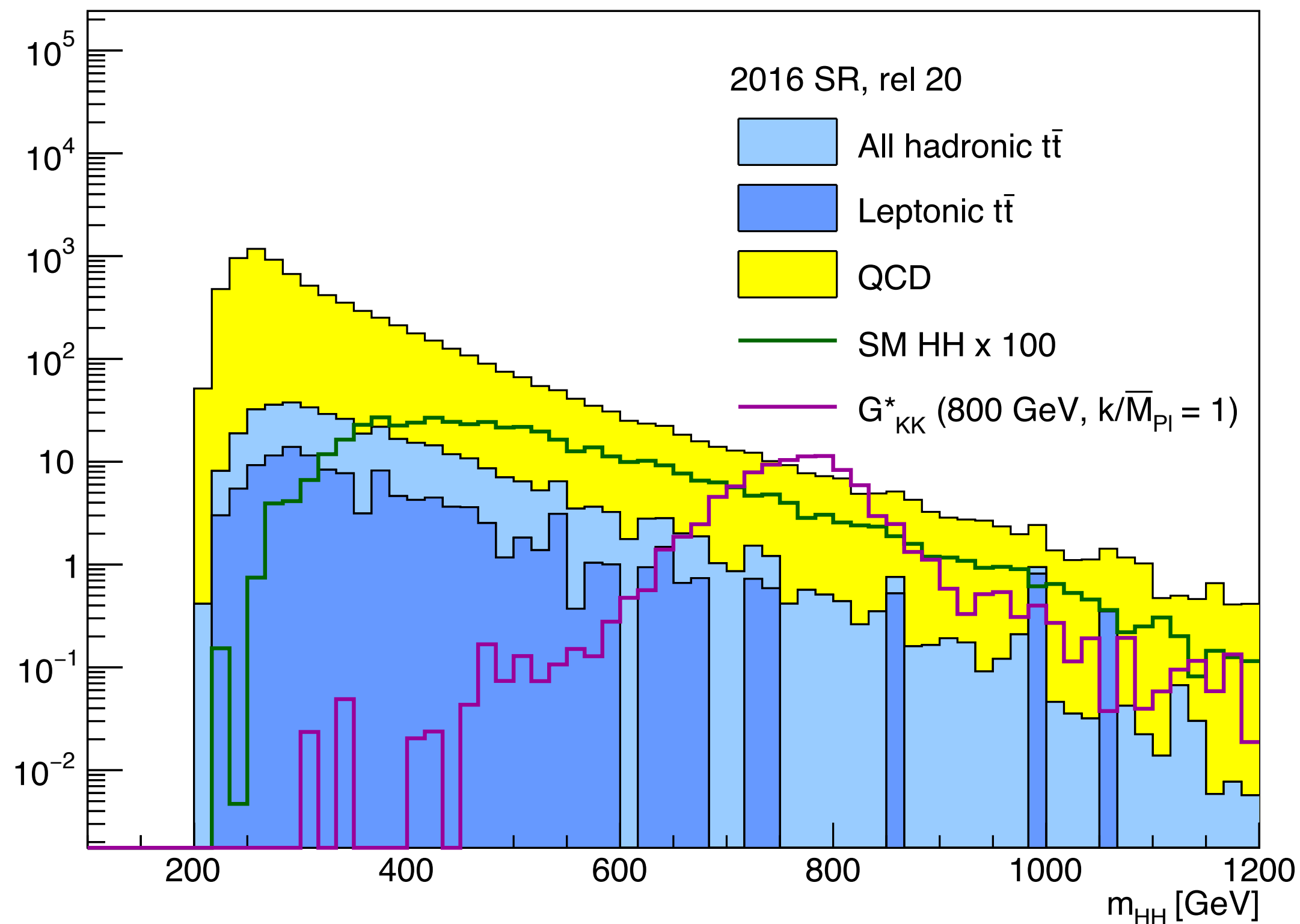
**The ATLAS collaboration**

*E-mail:* [atlas.publications@cern.ch](mailto:atlas.publications@cern.ch)

ABSTRACT: A search for Higgs boson pair production in the  $b\bar{b}b\bar{b}$  final state is carried out with up to  $36.1 \text{ fb}^{-1}$  of LHC proton-proton collision data collected at  $\sqrt{s} = 13 \text{ TeV}$  with the ATLAS detector in 2015 and 2016. Three benchmark signals are studied: a spin-2 graviton decaying into a Higgs boson pair, a scalar resonance decaying into a Higgs boson pair, and Standard Model non-resonant Higgs boson pair production. Two analyses are carried out, each implementing a particular technique for the event reconstruction that

JHEP01(2019)030

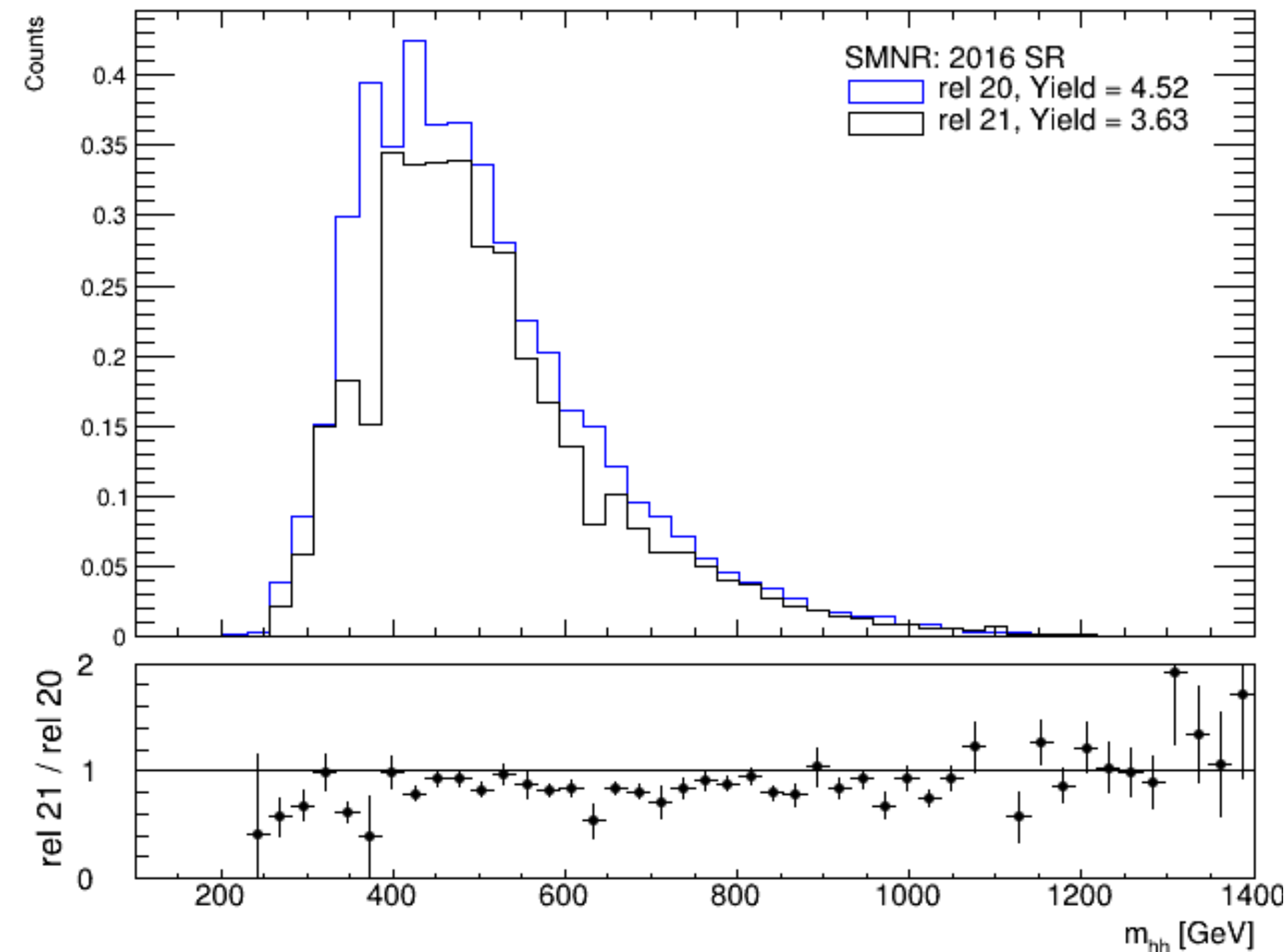
# Remembering the Past



- I have reproduced (almost) entirely the baseline 15/16 analysis in my own code framework
  - Includes object selection, background estimation, statistical limit setting
  - In particular focused on the background estimation, writing a much more flexible and understandable code base
- In progress: reproducing and re-evaluating systematic uncertainties
  - Will complete this soon

# Preparing for the Future

- I have also performed an extensive set of cross-checks
  - Between the new framework and the published analysis
  - Between old (rel 20) and new (rel 21) ATLAS software releases
    - Includes, e.g., changes due to b-tagging modeling improvements
      - Results in up to 25% difference in some MC yields!

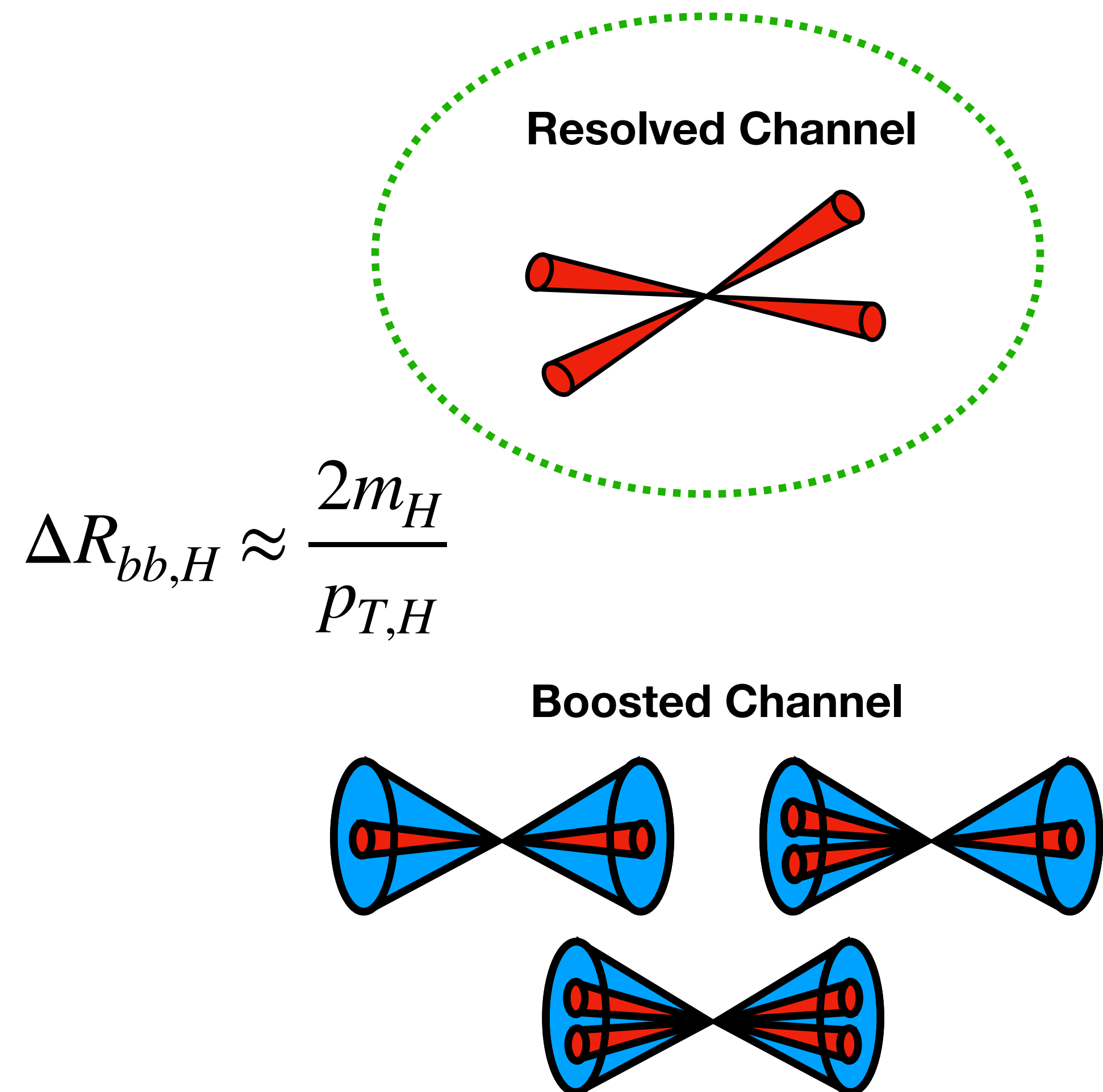


	Expected Signal Events
rel 20	4.52
rel 21	3.63
% Difference	21.84



# The Analysis: Overview

- $HH \rightarrow 4b$  is split into two regimes:
  - **Resolved:** All four b-quarks can be distinguished in the detector (lower mass regime)
  - **Boosted:** b-quarks are too close to distinguish - group into larger radius jets and rely on b-tagged track jets
- I am focusing on the resolved analysis
  - Greater sensitivity to Standard Model  $HH$  production



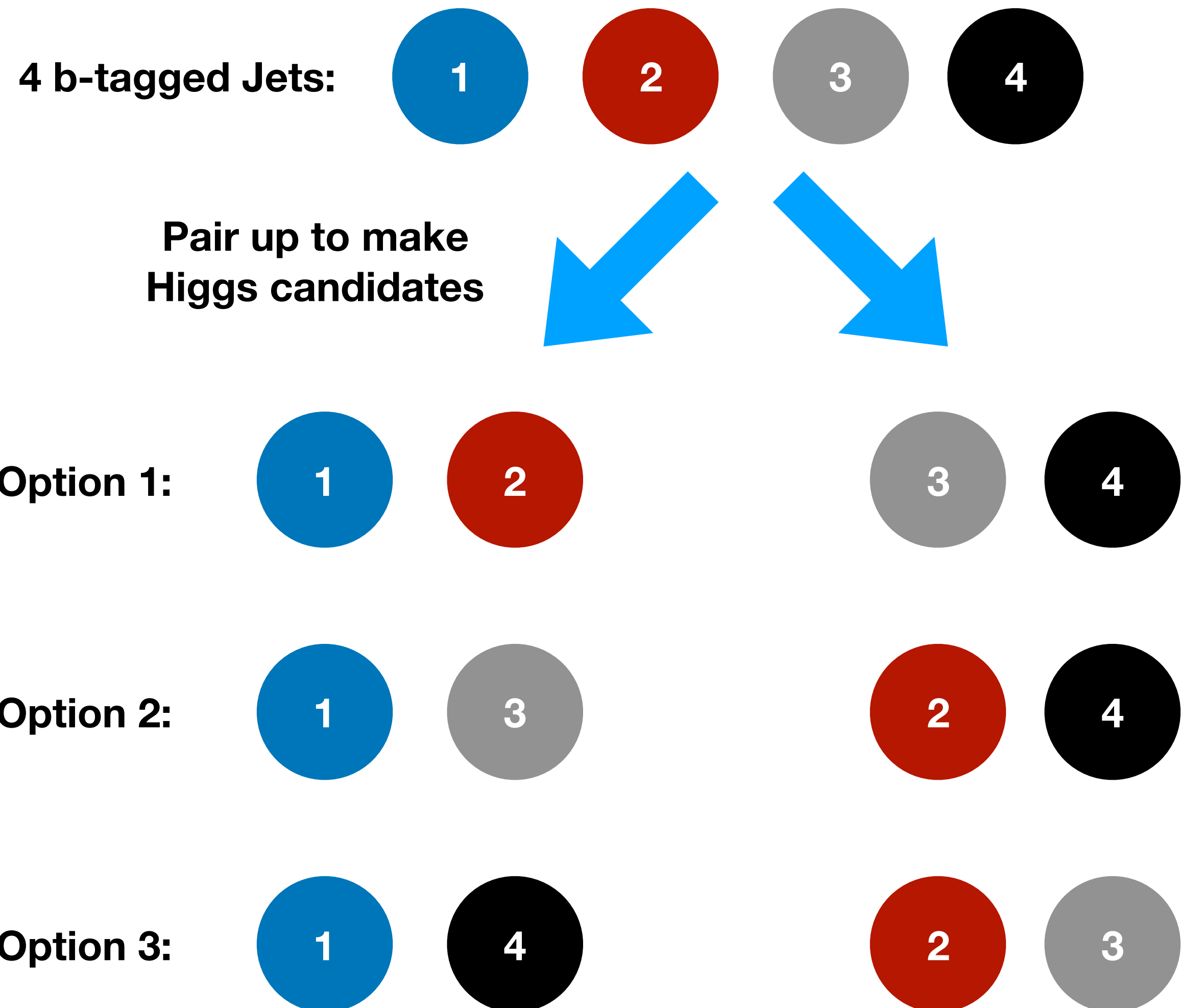


# Triggers for Resolved $HH \rightarrow 4b$

- **Triggers** in ATLAS are used to decide which events to keep and which to throw away (before analysis)
  - This is a combination of online (during data taking) processing and offline (after data taking) selection
- For resolved  $HH \rightarrow 4b$ , we used a combination of b-jet triggers, requiring
  - 1 b-tagged jet with  $p_T > 225$  GeV
  - OR 2 b-tagged jets, both with  $p_T > 35$  GeV or  $p_T > 55$  GeV
  - Some additional jets may be required

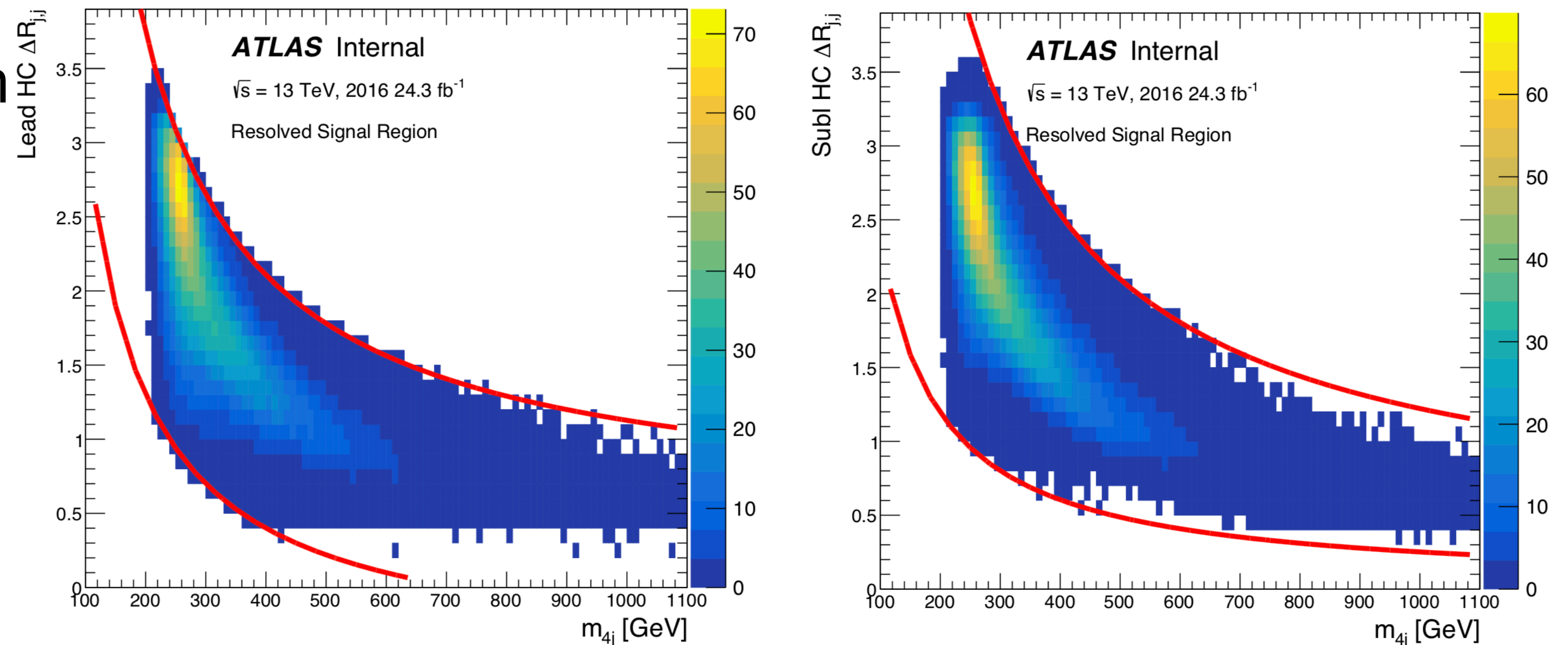
# Resolved Analysis: Selection and Pairing

- Require 4 b-tagged jets ( $R=0.4$  Anti- $k_t$ ) with  $p_T > 40$  GeV,  $|\eta| < 2.5$
- b-tagging uses MV2c10 (a BDT based tagger) at the 70% working point
  - This means that there is a 70% chance that a b-jet will be tagged
- Need to then pair them up into Higgs candidates. 3 possibilities for this.
- However, not all pairs are consistent with expected kinematics for  $HH \rightarrow 4b$



# Resolved Analysis: Pairing Kinematics

- We expect the b-jets from each Higgs to get closer together at high Lorentz boosts
- Idea: make selections on the  $\Delta R$  between our b-jets as a function of the 4 jet mass, requiring consistency with  $HH \rightarrow 4b$
- Corresponding selection shown on right - pairings which pass this selection are considered “valid”



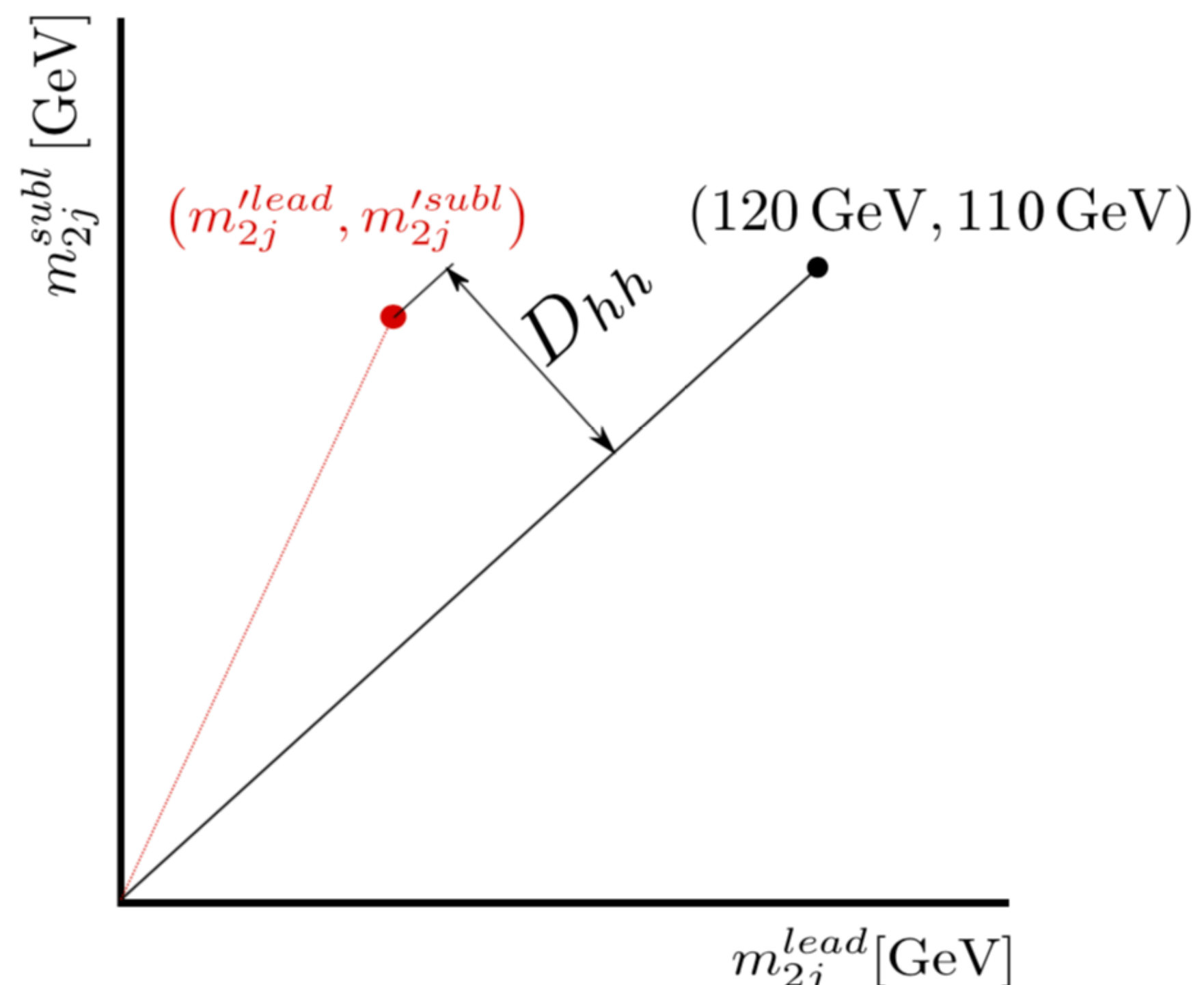
2016 Multijet after full selection (15/16 analysis). Red lines show bounds on  $\Delta R_{jj}$

$$\begin{aligned}
 & m_{4j} < 1250 \text{ GeV} \\
 & \frac{360 \text{ GeV}}{m_{4j}} - 0.5 < \Delta R_{jj, \text{lead}} < \frac{653 \text{ GeV}}{m_{4j}} + 0.475 \\
 & \frac{235 \text{ GeV}}{m_{4j}} < \Delta R_{jj, \text{subl}} < \frac{875 \text{ GeV}}{m_{4j}} + 0.35
 \end{aligned}$$

$$\begin{aligned}
 & m_{4j} > 1250 \text{ GeV} \\
 & 0 < \Delta R_{jj, \text{lead}} < 1 \\
 & 0 < \Delta R_{jj, \text{subl}} < 1
 \end{aligned}$$

# Resolved Analysis: Pairing Ambiguity

$$D_{HH} = \frac{\left| m_{2j}^{\text{lead}} - \frac{120}{110} m_{2j}^{\text{subl}} \right|}{\sqrt{1 + \left( \frac{120}{110} \right)^2}}$$



- If we only have one valid pairing, we're good!
- If more than one, still need to choose!
- Current method:  $D_{HH}$  minimization
  - Pick pairing with smallest distance from the line shown on left
- Works well! Often  $> 90\%$  correct



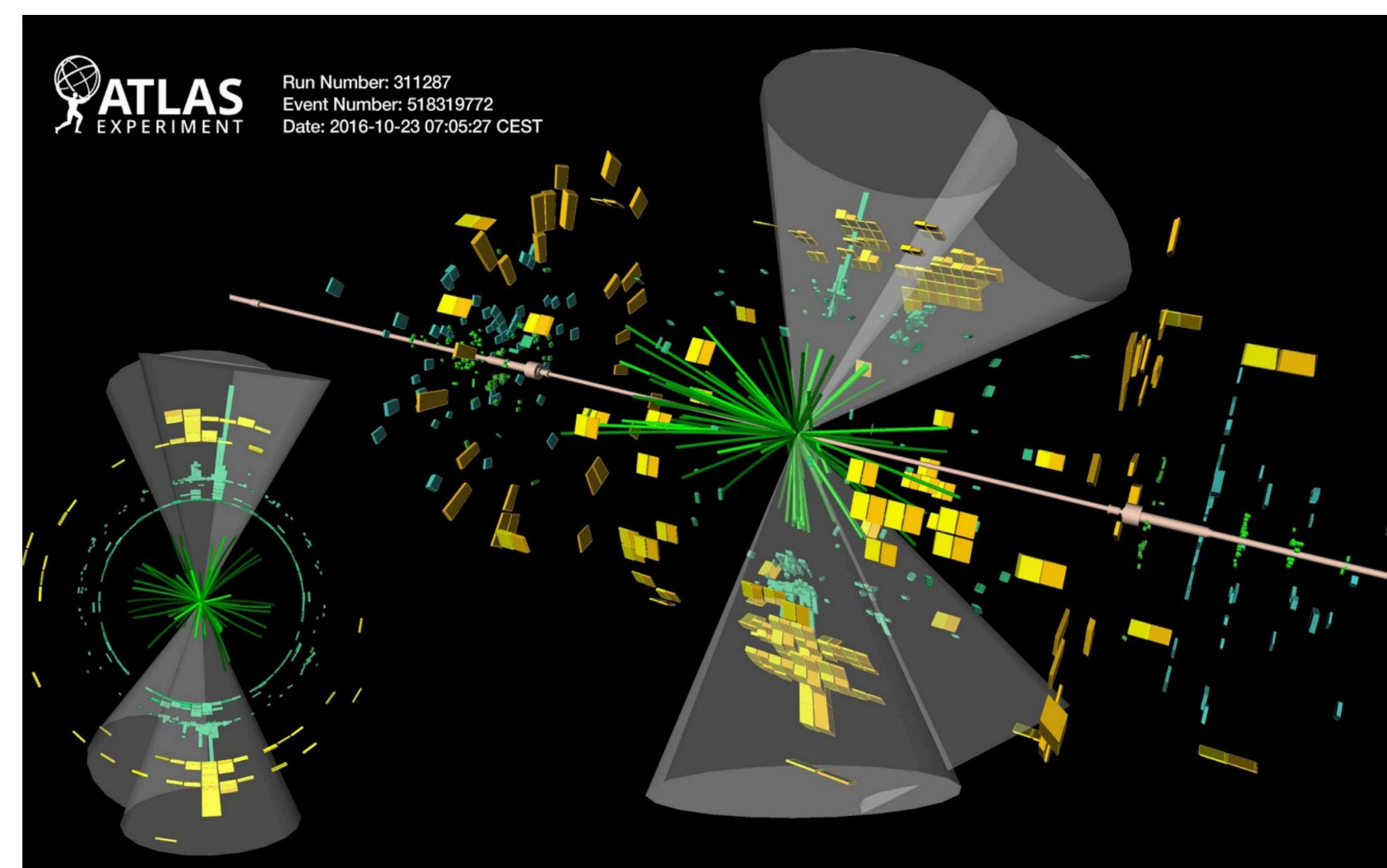
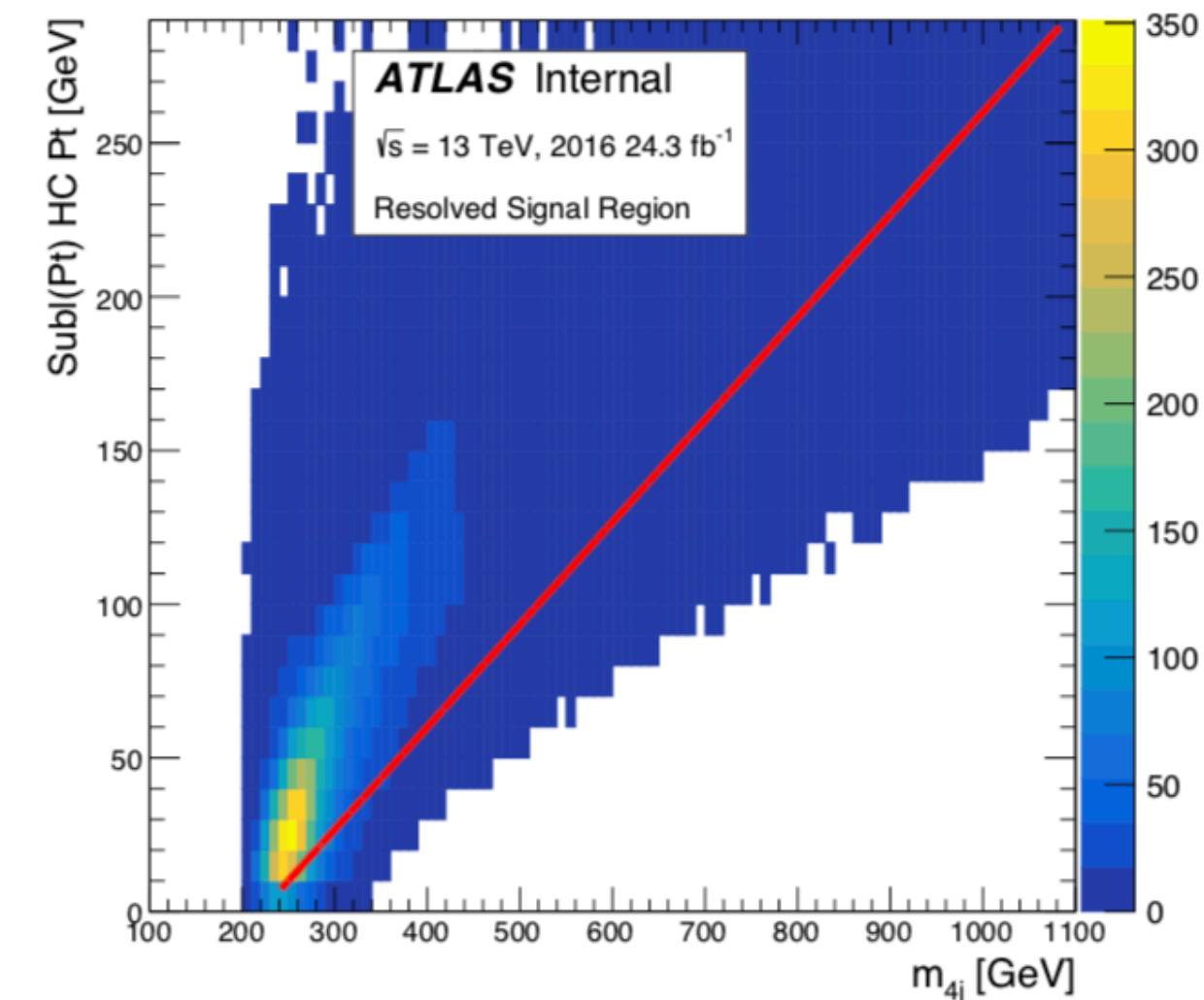
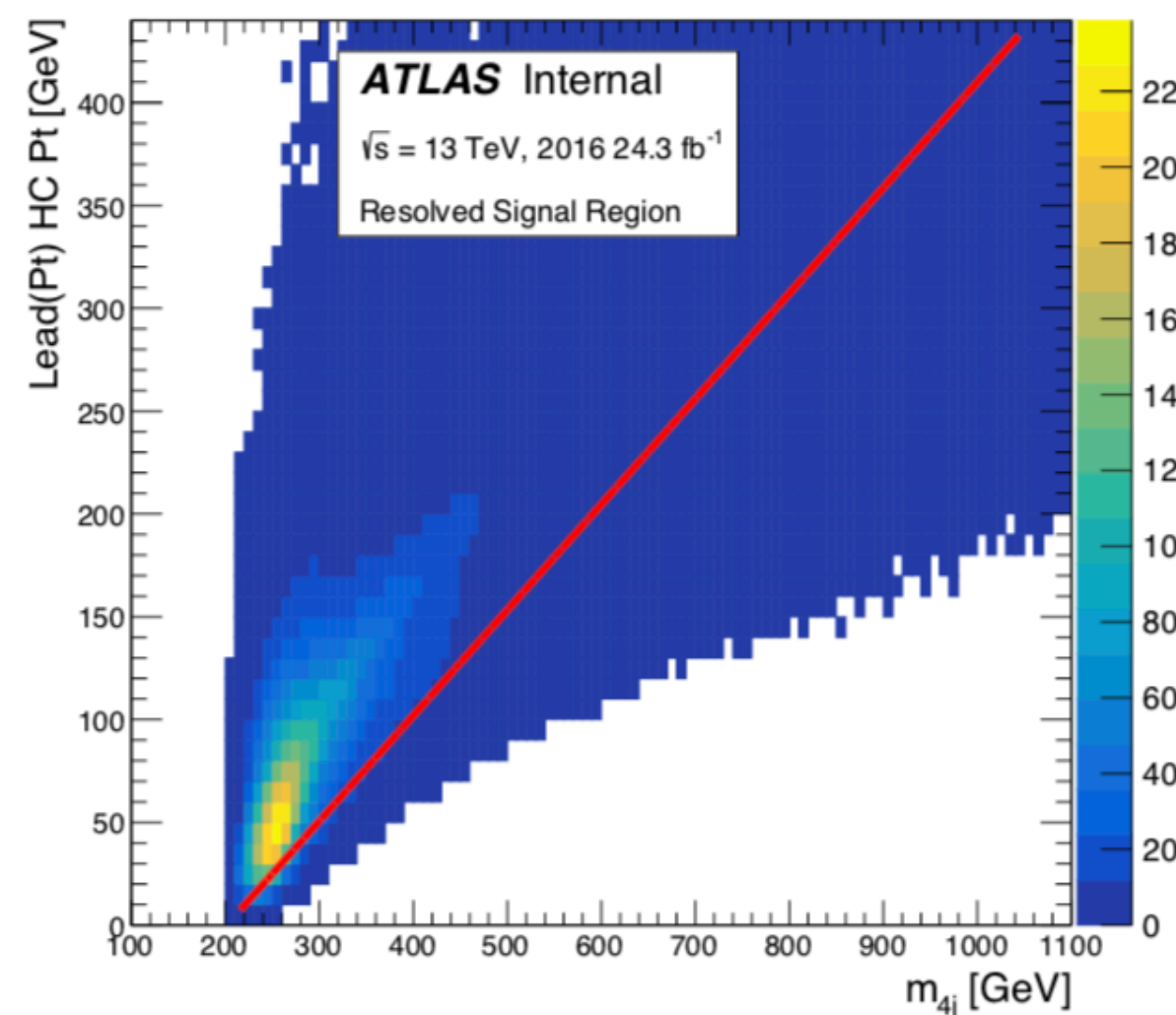
# Resolved Analysis: Kinematic Selections

- Mass dependent  $p_T$  cuts on the Higgs candidates:

$$p_T^{lead} > 0.5m_{4j} - 103 \text{ GeV}$$

$$p_T^{subl} > 0.33m_{4j} - 73 \text{ GeV}$$

- Consistency with  $X \rightarrow HH$
- $|\Delta\eta_{HH}| < 1.5$
- Somewhat back to back. Rejects QCD multijet background





# Resolved Analysis: Top Veto

- Reject events consistent with (hadronic) top quark decay
- Build top candidates using three jets (with at least one jet from a Higgs candidate)
- Order by b-tagging score: highest is the b quark, other two make the W candidate
- Make all possible candidates. Choose the one that minimizes  $X_{Wt}$  (consistency with W, top mass)
- If minimal  $X_{Wt} < 1.5$ , reject the event
- Reduces hadronic  $t\bar{t}$  by  $\sim 60\%$ , semi-leptonic by  $\sim 45\%$

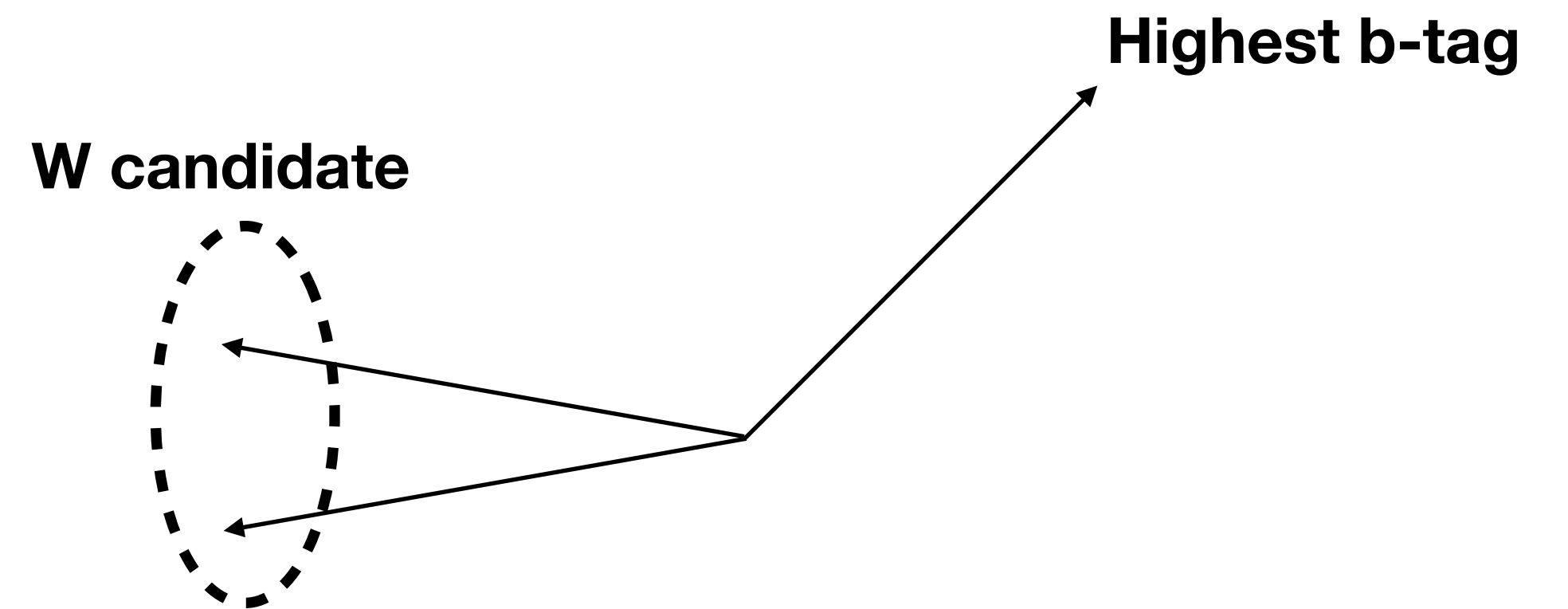


Illustration of top candidate building

$$X_{Wt} = \sqrt{\left(\frac{m_W - 80 \text{ GeV}}{0.1m_W}\right)^2 + \left(\frac{m_t - 173 \text{ GeV}}{0.1m_t}\right)^2}$$

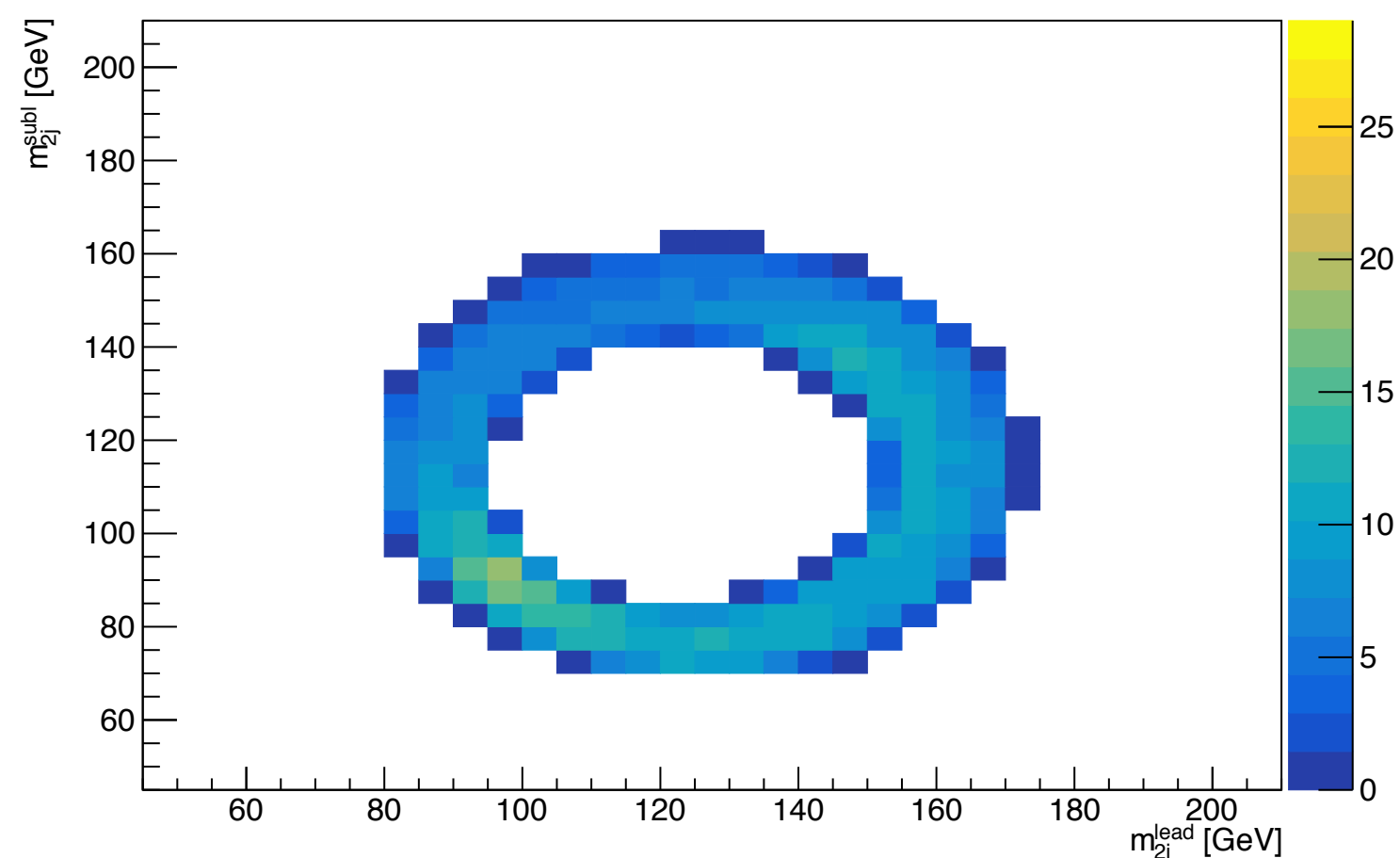
# Resolved Analysis: Mass Regions

$$\sqrt{(m_{2j}^{\text{lead}} - (120 \times 1.05)\text{GeV})^2 + (m_{2j}^{\text{subl}} - (110 \times 1.05)\text{GeV})^2} < 45 \text{ GeV}$$

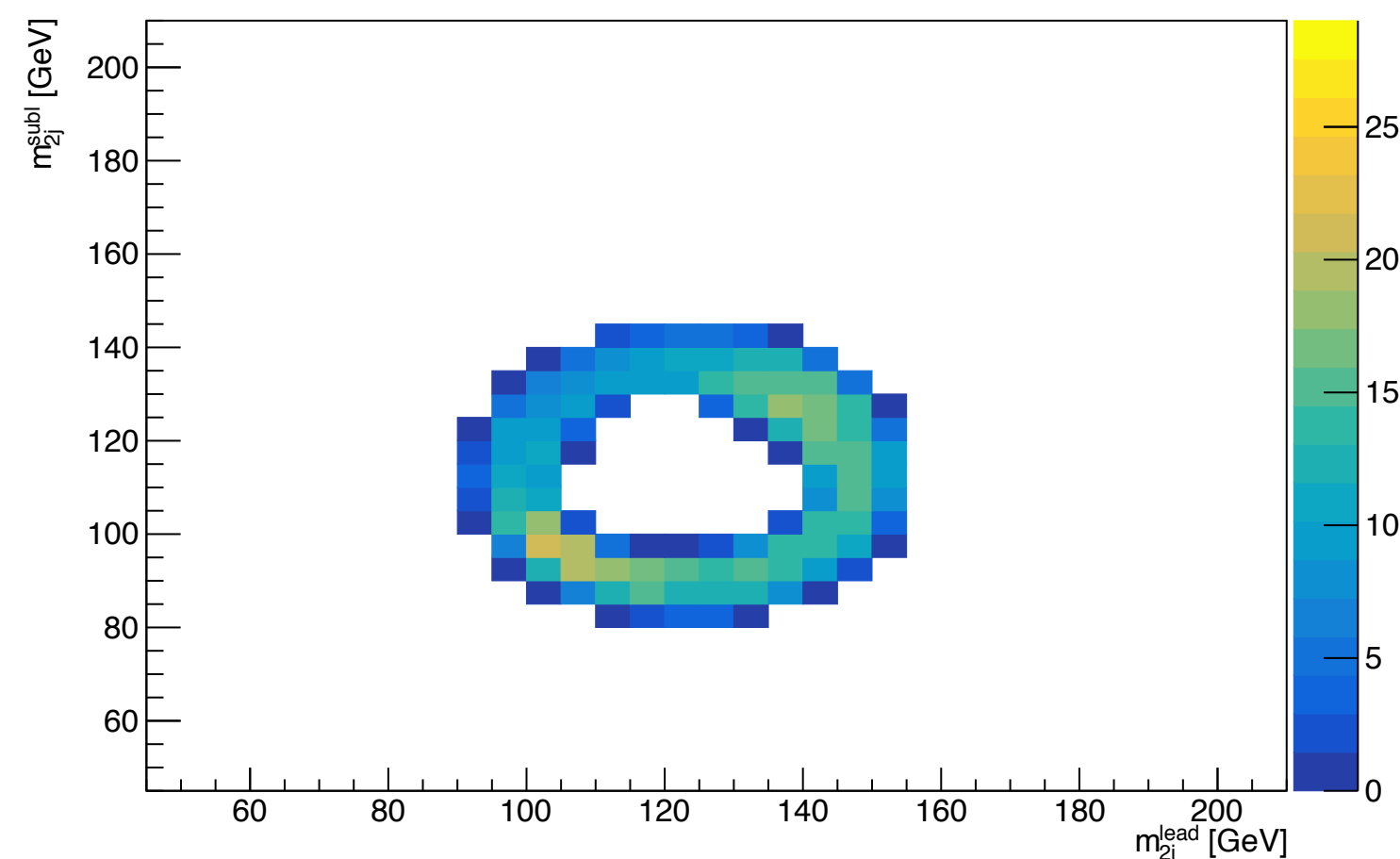
$$\sqrt{(m_{2j}^{\text{lead}} - (120 \times 1.03)\text{GeV})^2 + (m_{2j}^{\text{subl}} - (110 \times 1.03)\text{GeV})^2} < 30 \text{ GeV}$$

$$X_{HH} = \sqrt{\left(\frac{m_{2j}^{\text{lead}} - 120 \text{ GeV}}{0.1m_{2j}^{\text{lead}}}\right)^2 + \left(\frac{m_{2j}^{\text{subl}} - 110 \text{ GeV}}{0.1m_{2j}^{\text{subl}}}\right)^2} < 1.6$$

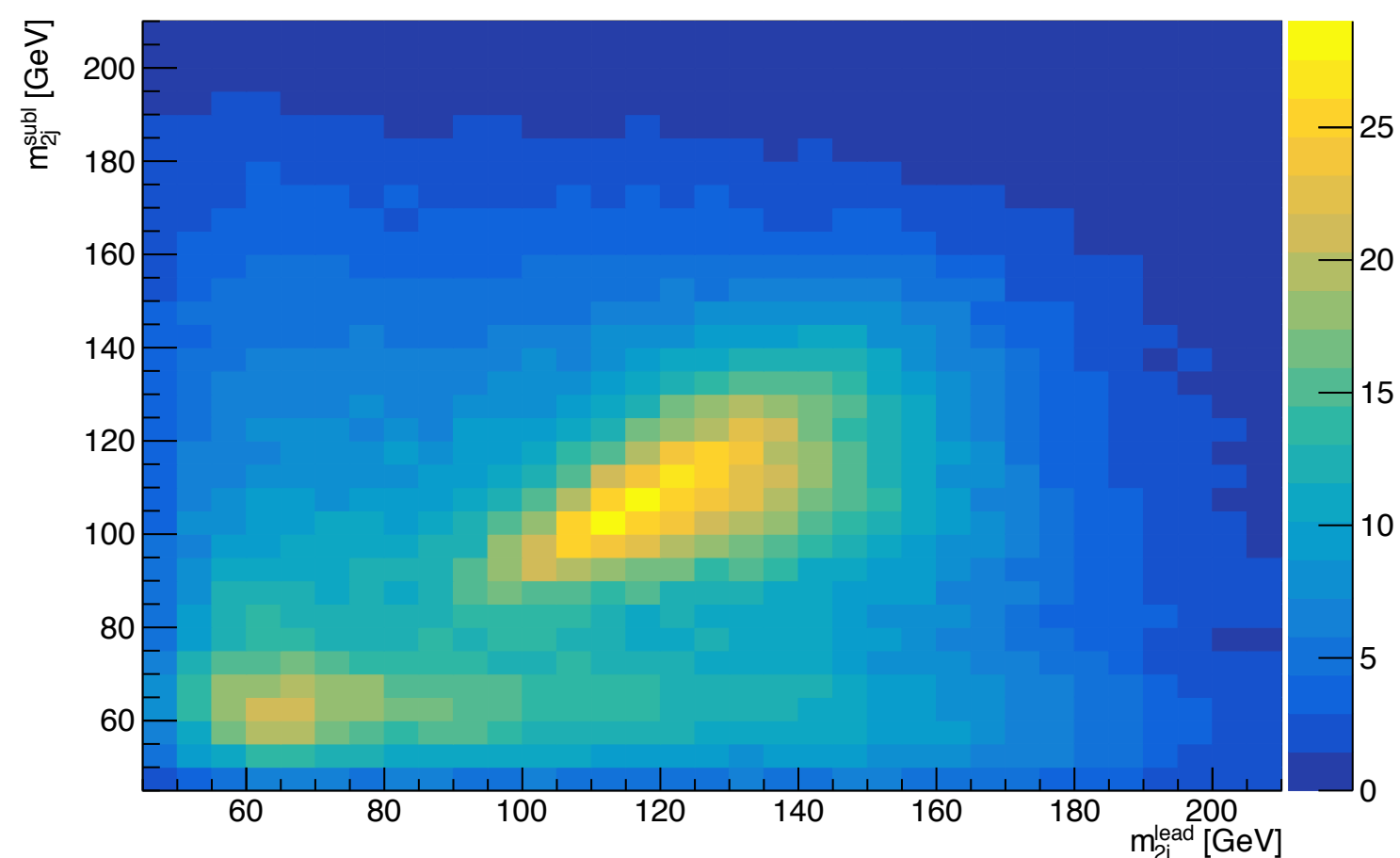
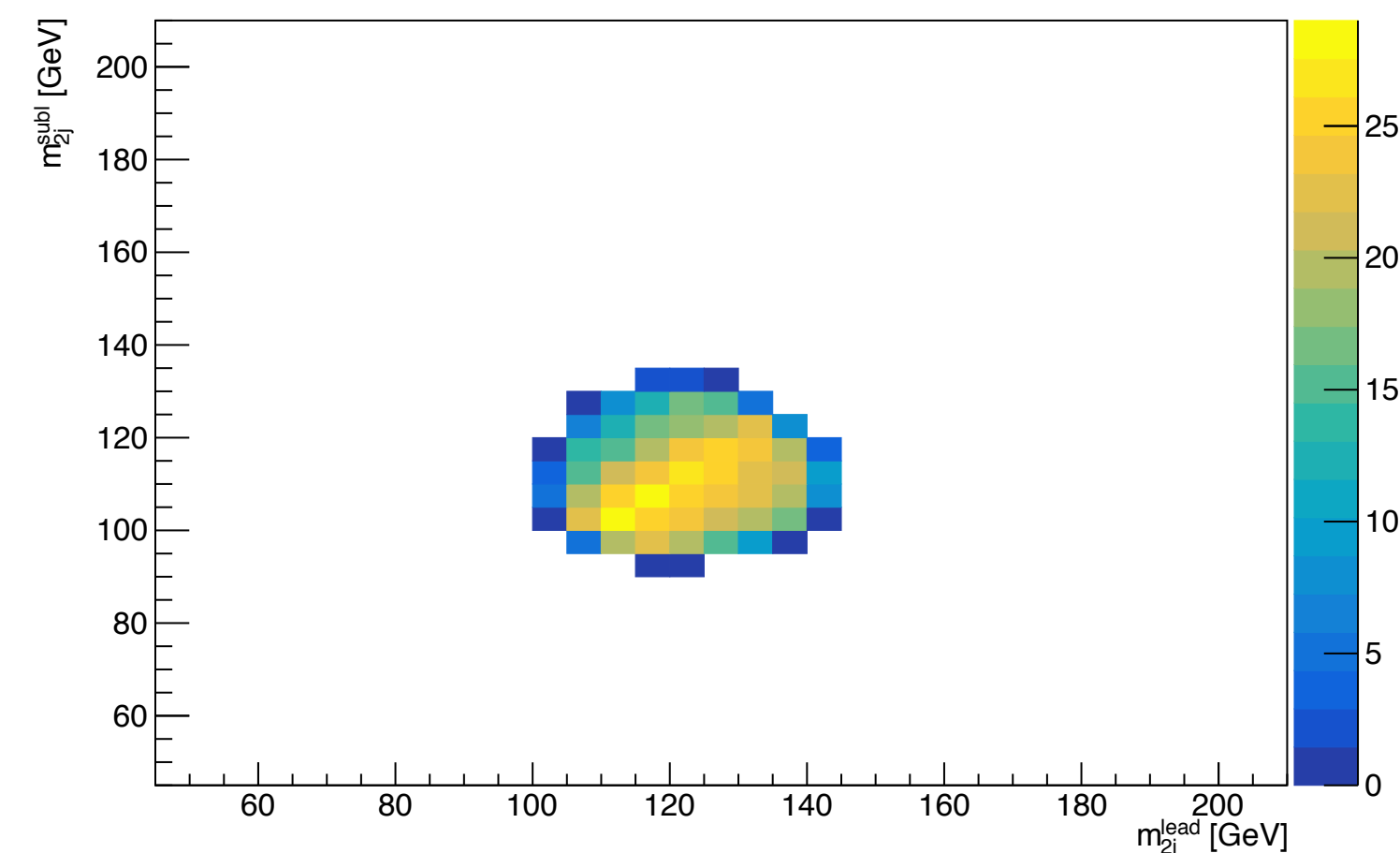
**Sideband**



**Control**



**Signal**

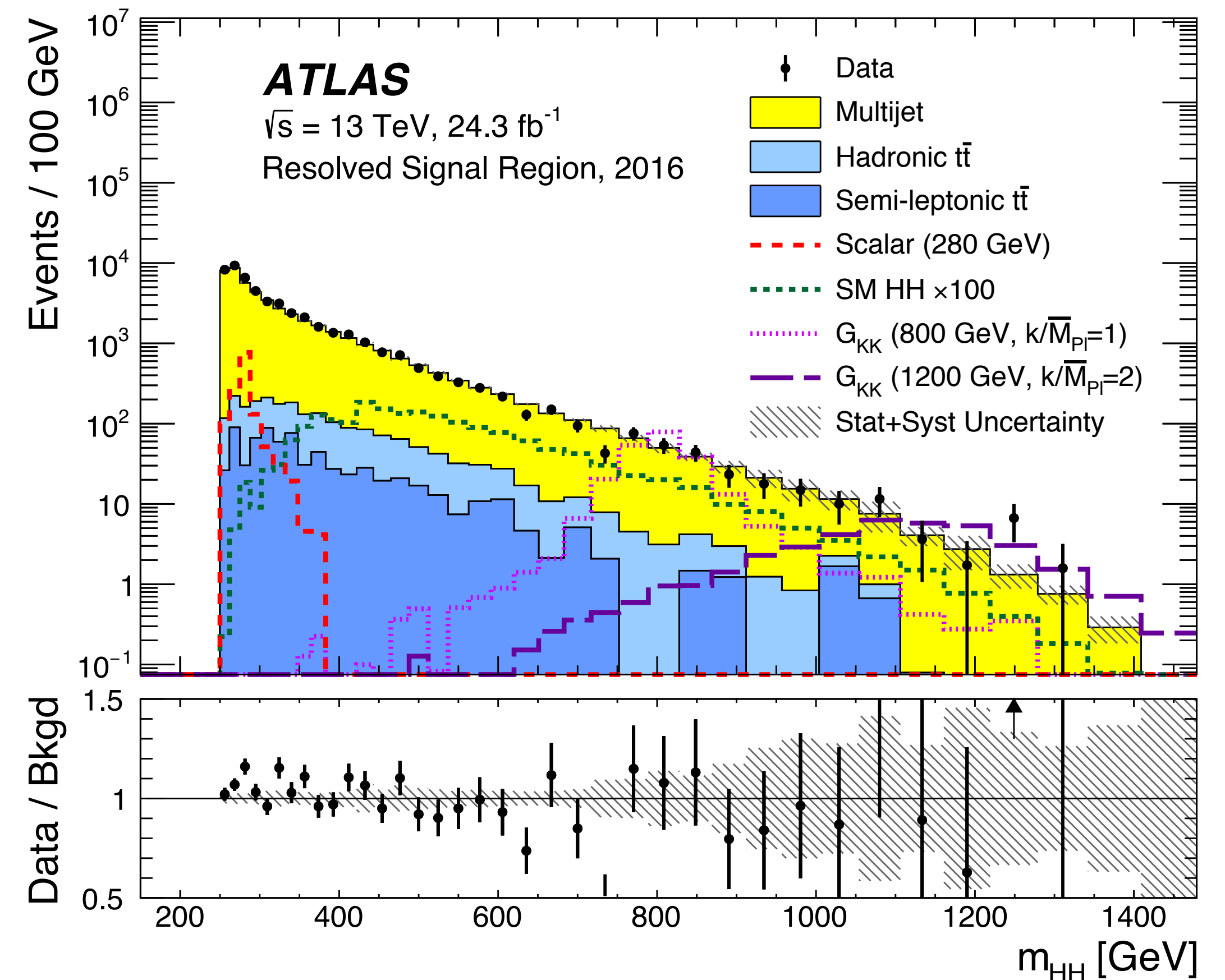


- Our signal region is then defined by a requirement that the Higgs candidate masses are close to the Higgs mass ( $X_{HH}$  above)
- We further define a sideband and control region in this Higgs candidate mass plane - assumed to be similar to, but still orthogonal from, our signal region

# HH→4b: Background Estimation

# The Analysis: Background Processes

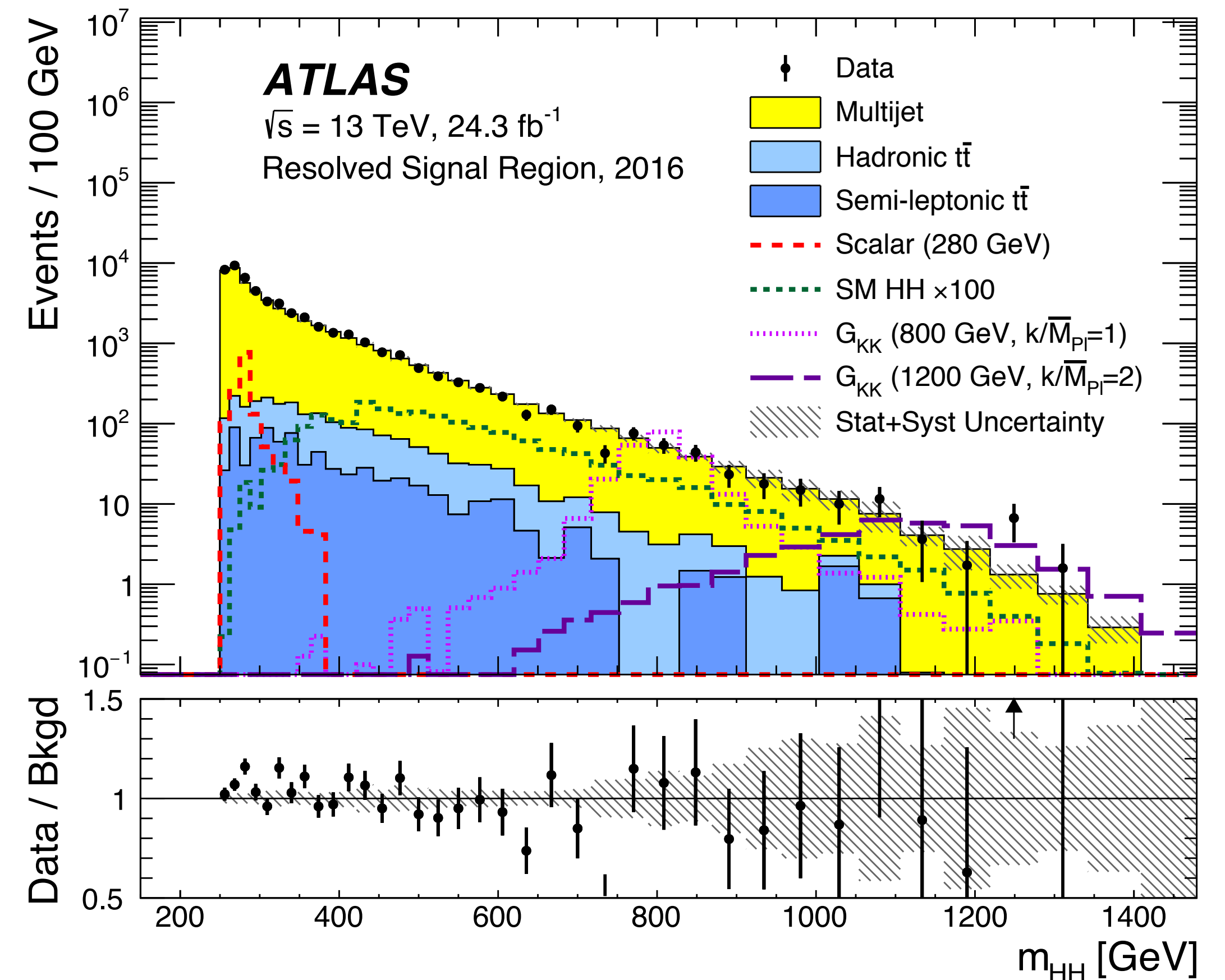
- We have a set of criteria chosen to select only those events consistent with our signal model
- However, there are some background processes which result in final states that are indistinguishable from our signal
- An important part of our analysis is understanding these backgrounds well!



$m_{HH}$  spectrum from 2016  $HH \rightarrow 4b$  analysis.  $t\bar{t}$  (blue) and QCD multijet (yellow) are the two dominant backgrounds (QCD  $\sim 95\%$ )

# The Analysis: Background Processes

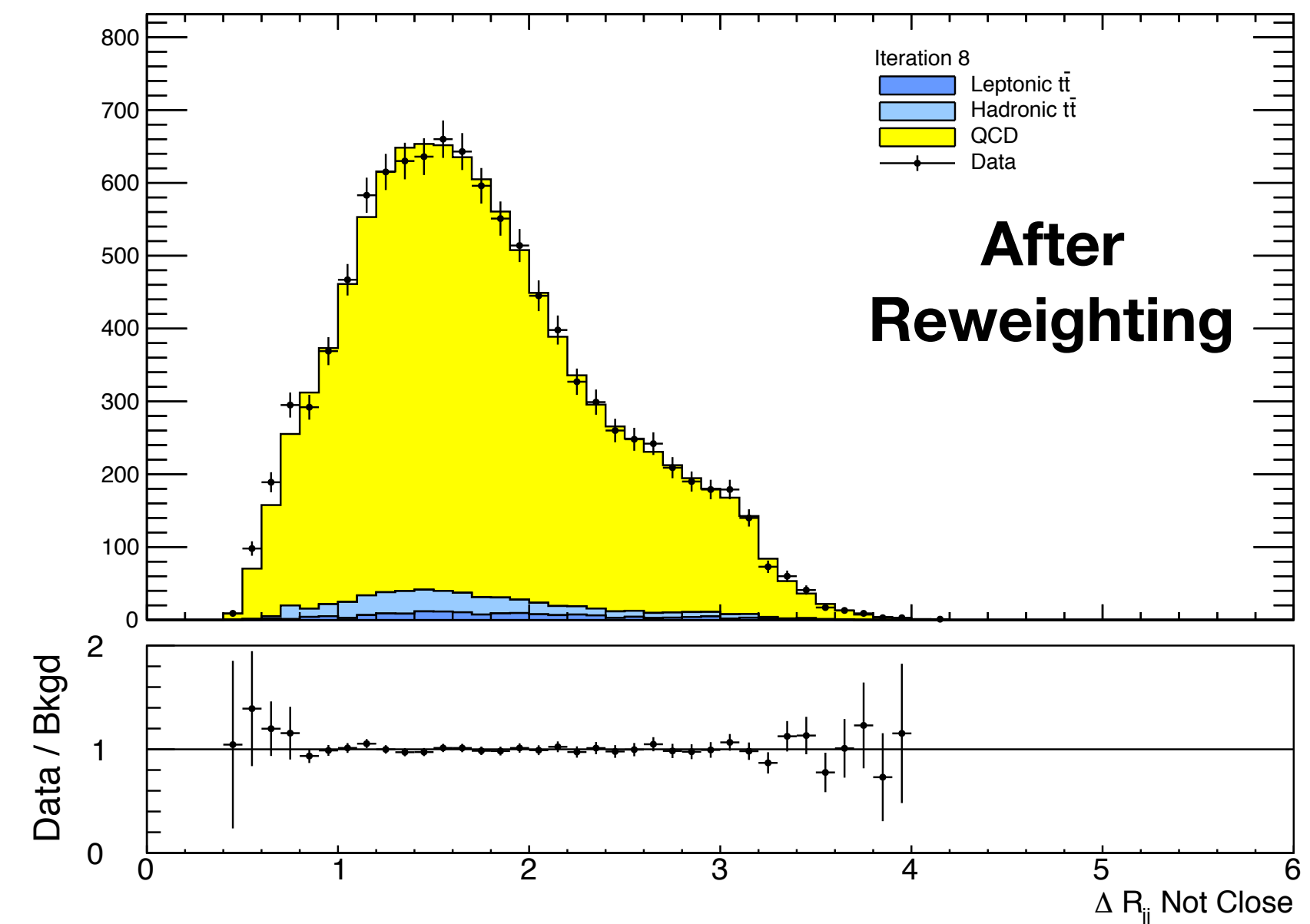
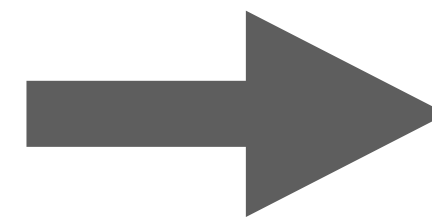
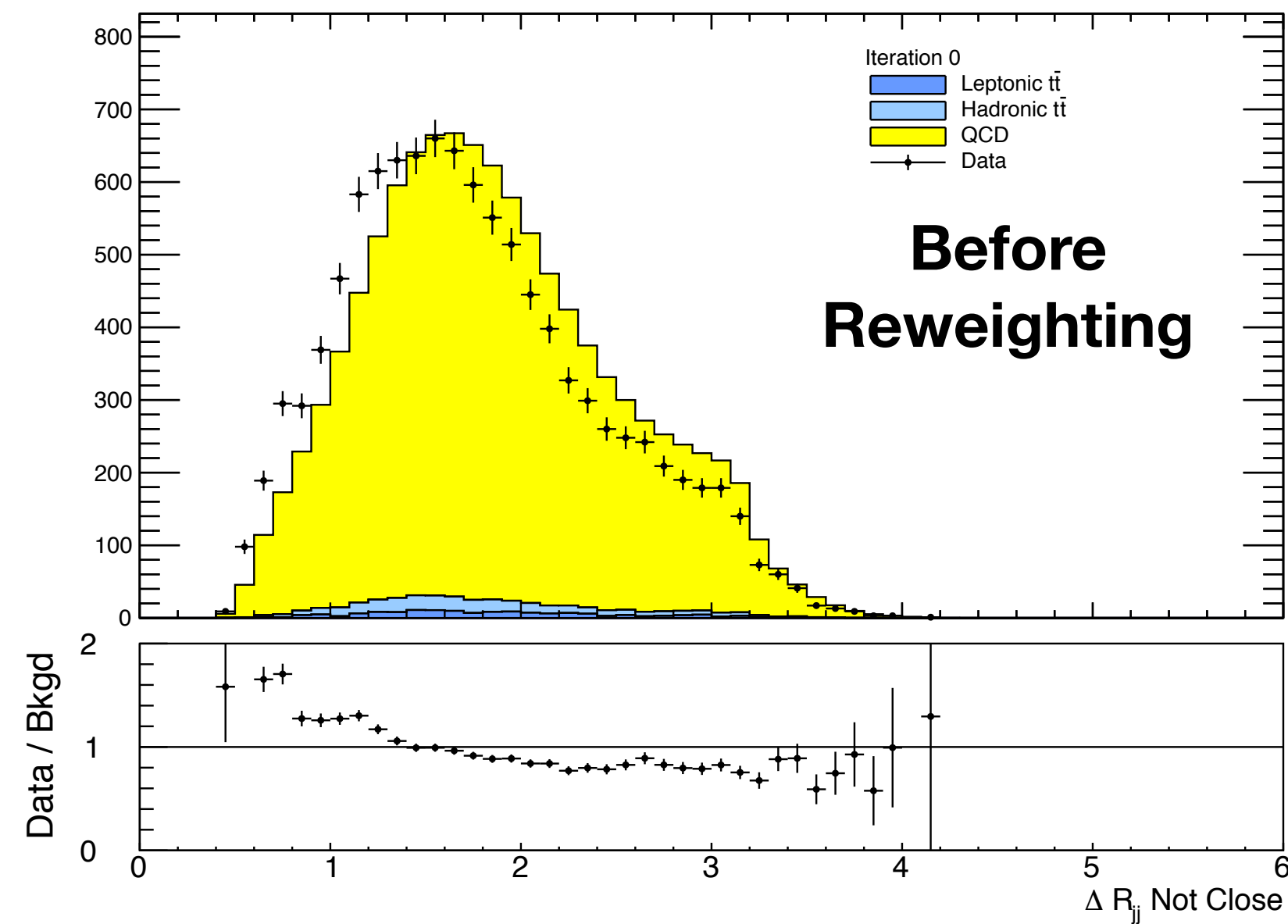
- **QCD Multijet** (~94.6%): Estimated with a data-driven method
- Difficult to get high statistics, reliable simulation for QCD with our 4 b-jet signal region
- **Hadronic** (~3.6%) and **semi-leptonic  $t\bar{t}$**  (~1.7%): Shape from MC simulation, normalization from data driven fit



$m_{\text{HH}}$  spectrum from 2016  $\text{HH} \rightarrow 4\text{b}$  analysis.  $t\bar{t}$  (blue) and QCD multijet (yellow) are the two dominant backgrounds (QCD ~95%)

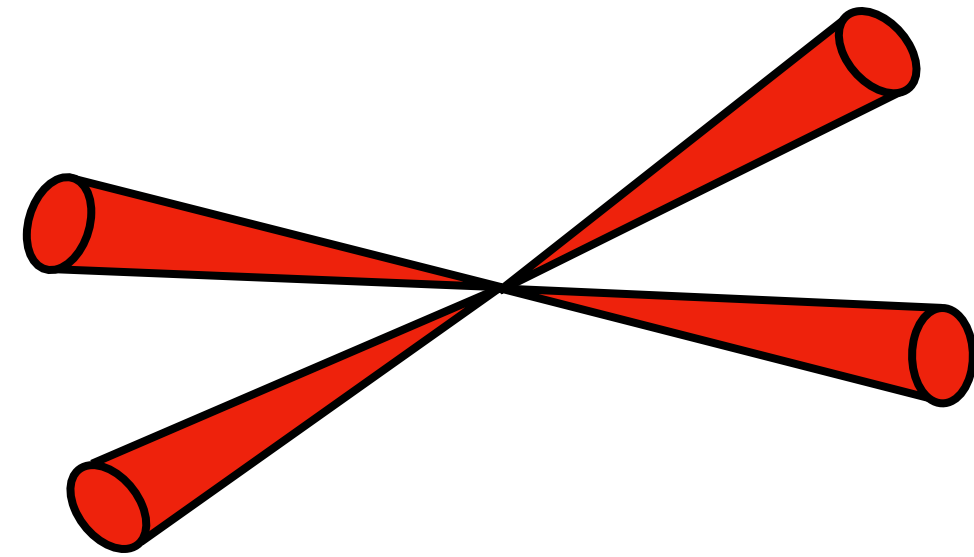


# Data Driven QCD

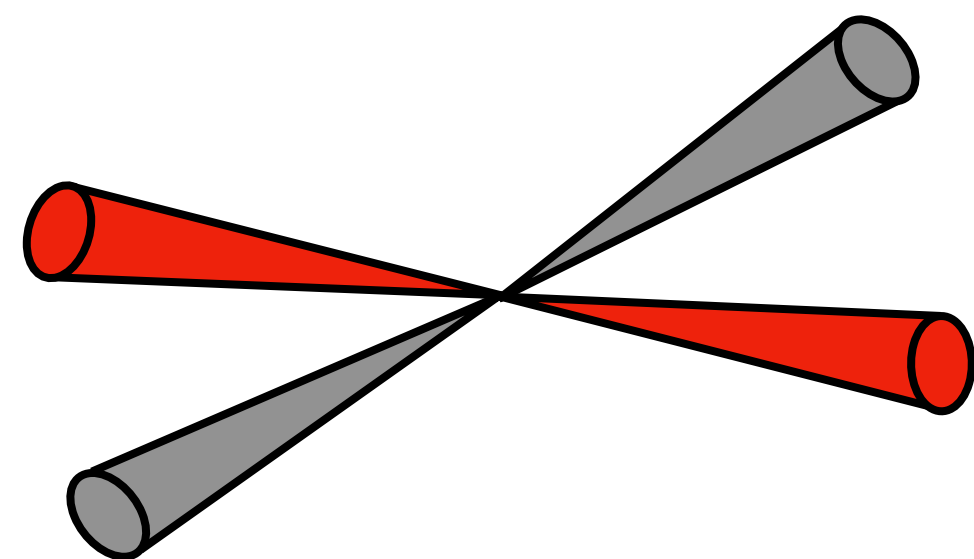


- Hypothesis: events with two b-tags are somewhat similar to events with four b-tags
  - We can correct for differences with a reweighting
- Idea: use reweighted 2 tag data as our QCD background estimate

# Data-driven QCD: Procedure



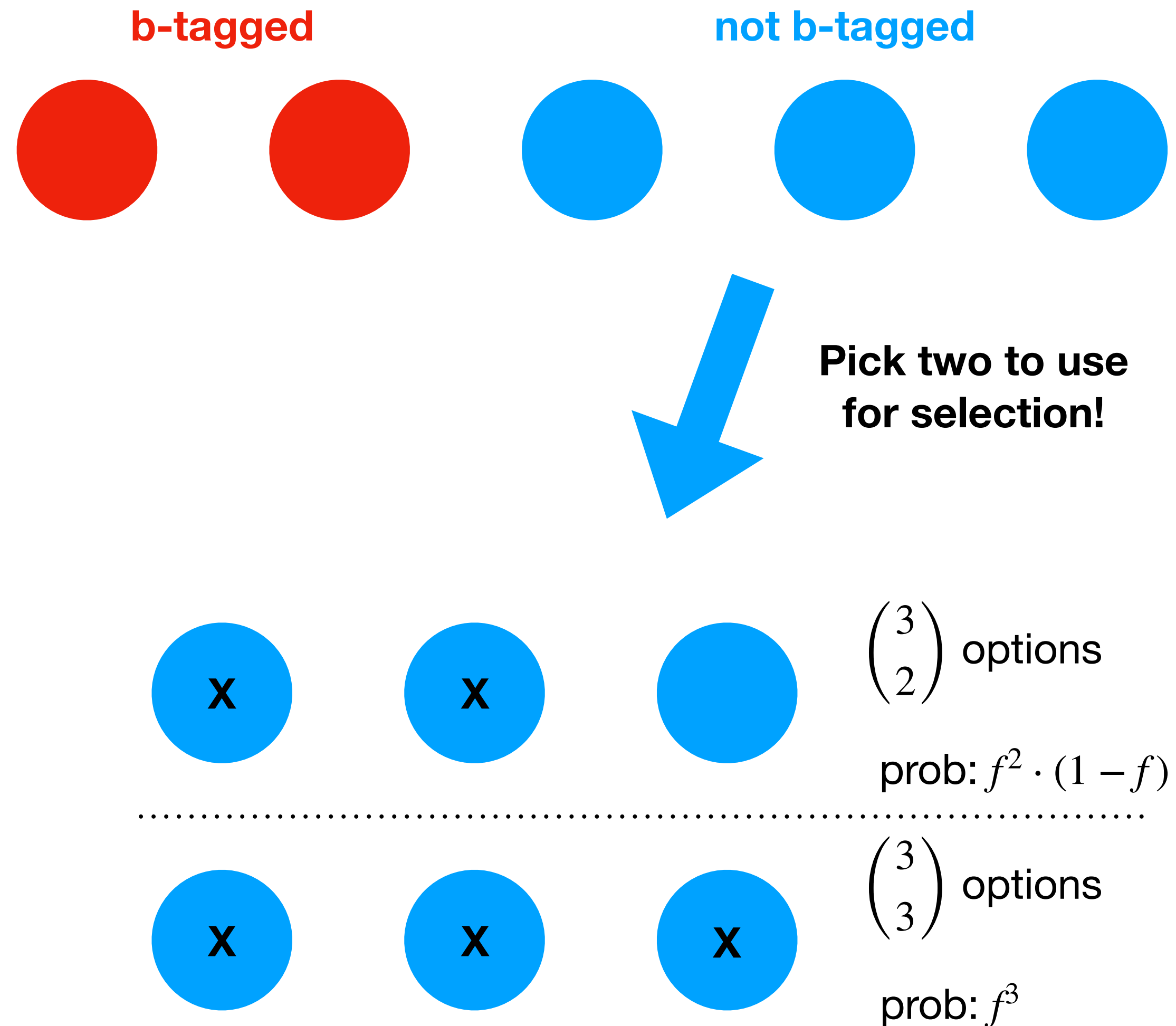
**Signal selection**  
( $\geq 4$  b-tagged jets)



**Background selection (2  
b-tagged jets,  $\geq 4$  total  
jets)**

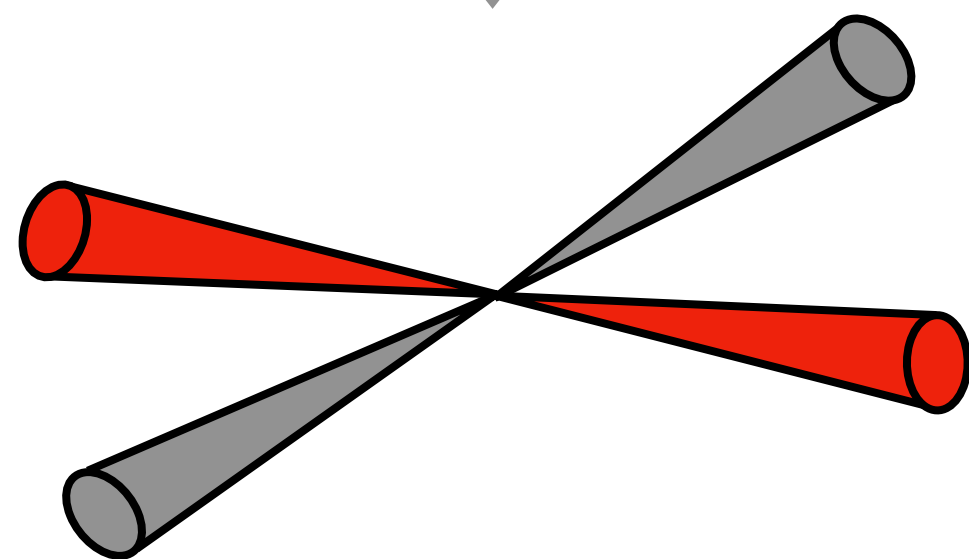
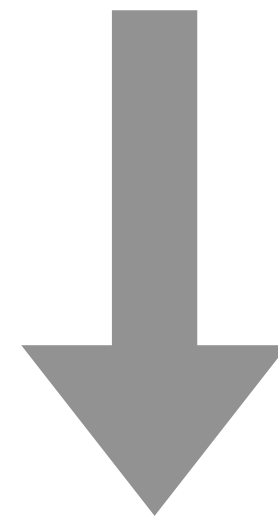
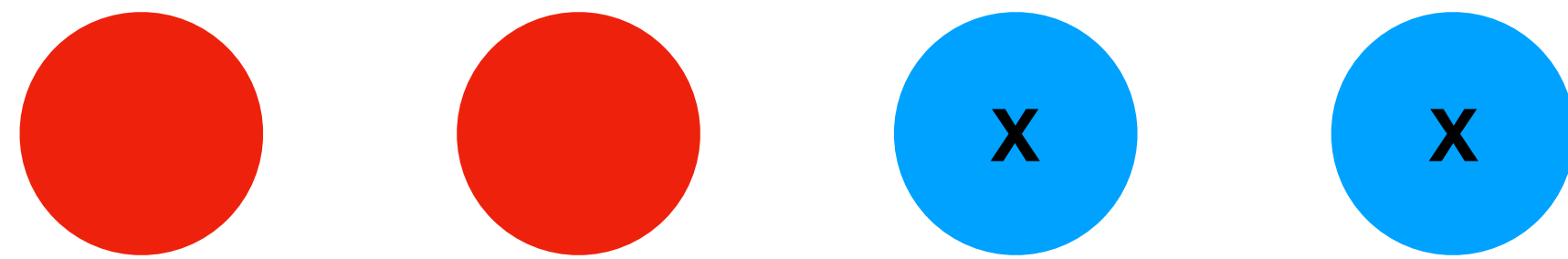
- First, select events with 4 jets (passing basic kinematic requirements), exactly 2 of which are b-tagged

# Data-driven QCD: Procedure



- We want to use the same signal region selection => need two more jets!
- Assign “pseudo-tags” among the remaining jets so that tagged+pseudo-tagged  $\geq 4$
- Flip a coin for each jet with probability  $f$

# Data-driven QCD: Procedure



$$\text{nJetWeight} = \binom{3}{2} \cdot f^2 \cdot (1 - f) + \binom{3}{3} \cdot f^3 = 3f^2 \cdot (1 - f) + f^3$$

Weight for the case of 3 non-tagged jets

- Use the 4 jets (tagged+pseudo-tagged) with the highest b-tagging score to form Higgs candidates and do the rest of the cutflow

- Assign a weight to the event:

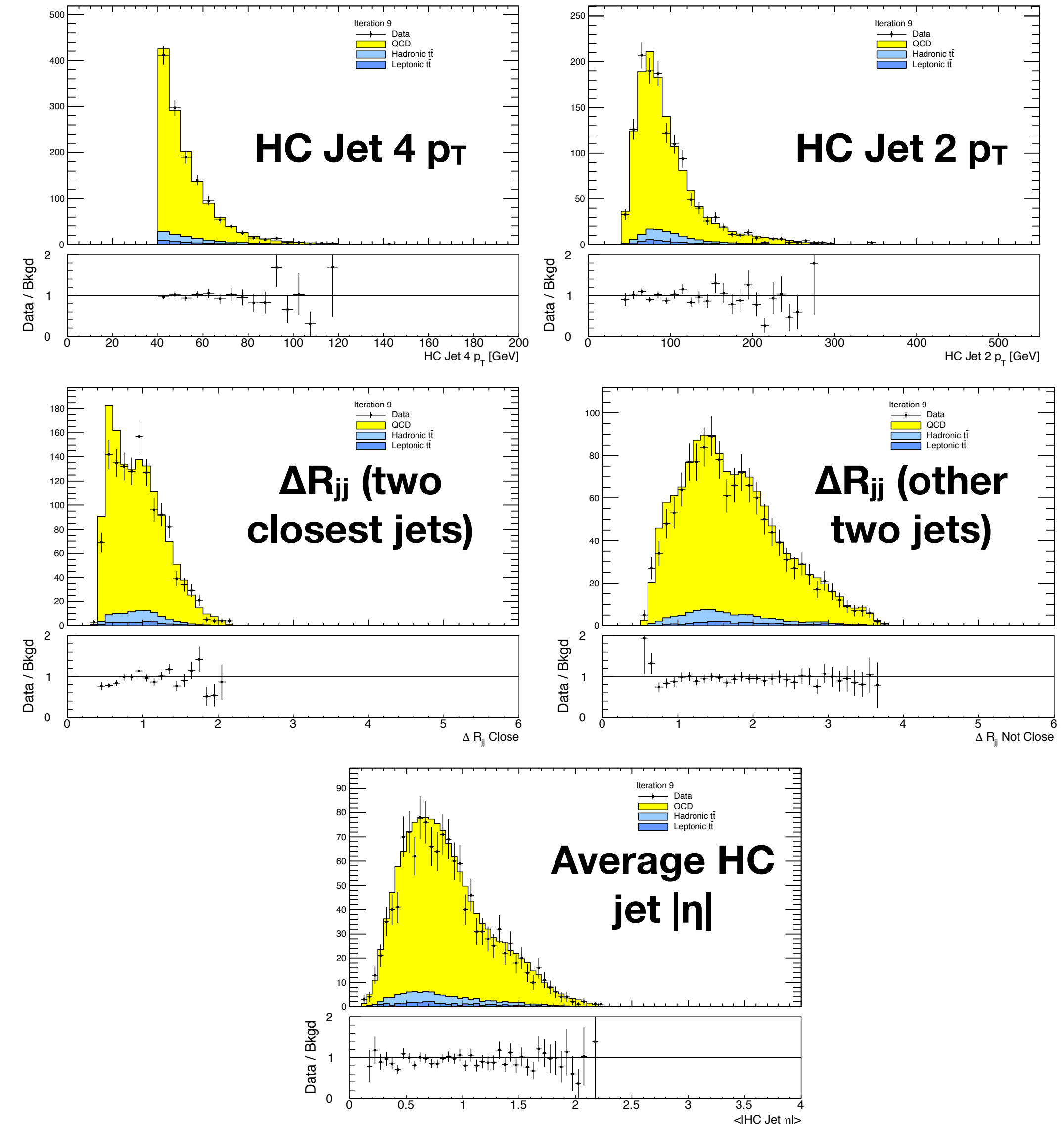
$$\text{nJetWeight} = \sum_{i=2}^n \binom{n}{i} f^i \cdot (1 - f)^{n-i}$$

= sum of probabilities of each choice



# Kinematic Reweighting

- Now we have 2 tag events in our signal region
- We then correct kinematic differences by deriving weights in our **sideband region**
- Reweighting procedure:
  - Pick distributions sensitive to 2 vs 4 tag differences
  - Subtract simulated  $t\bar{t}$  component for 2 and 4 tag
  - Take ratios of remaining distributions and form splines



# The Analysis: Background Estimation

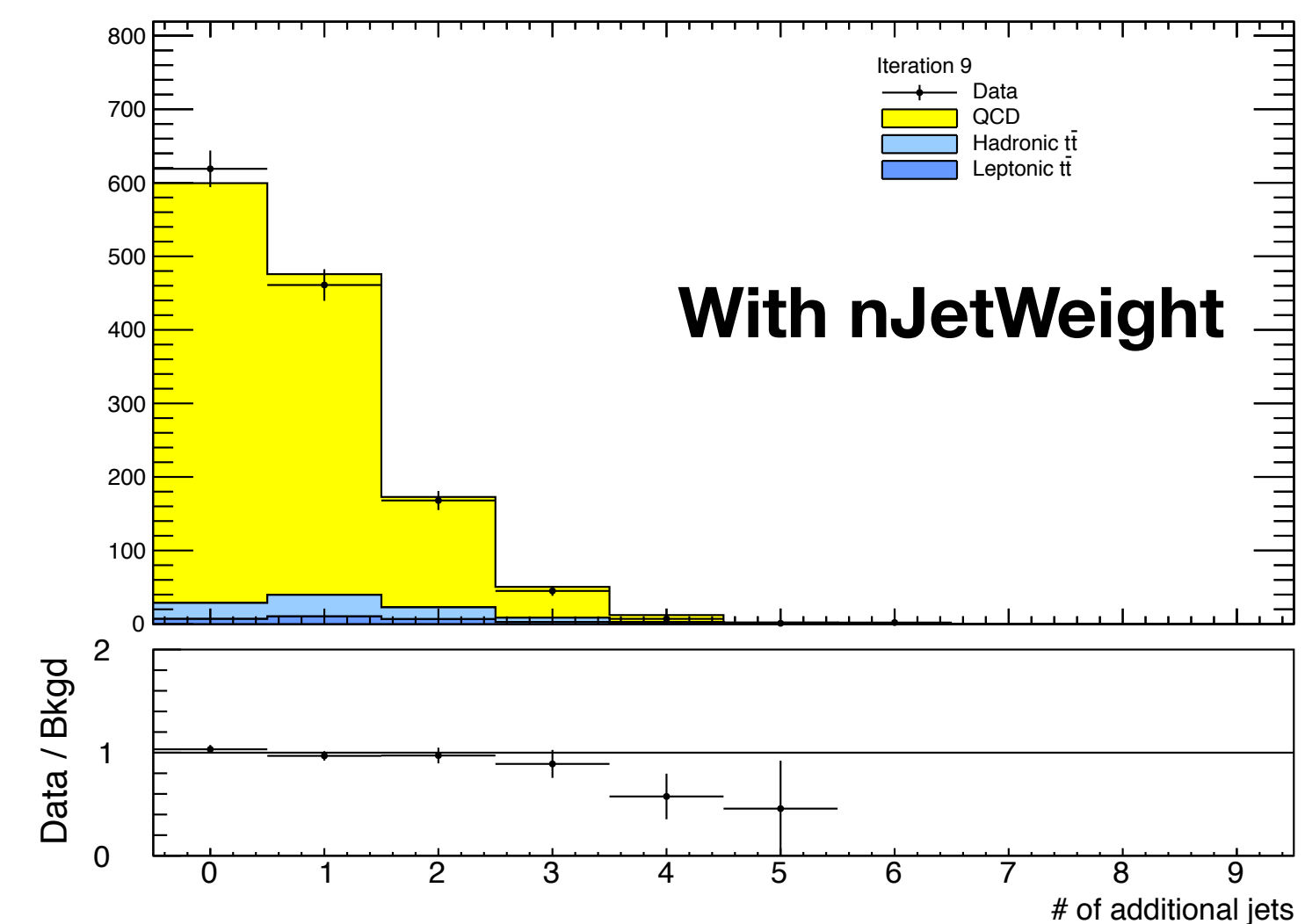
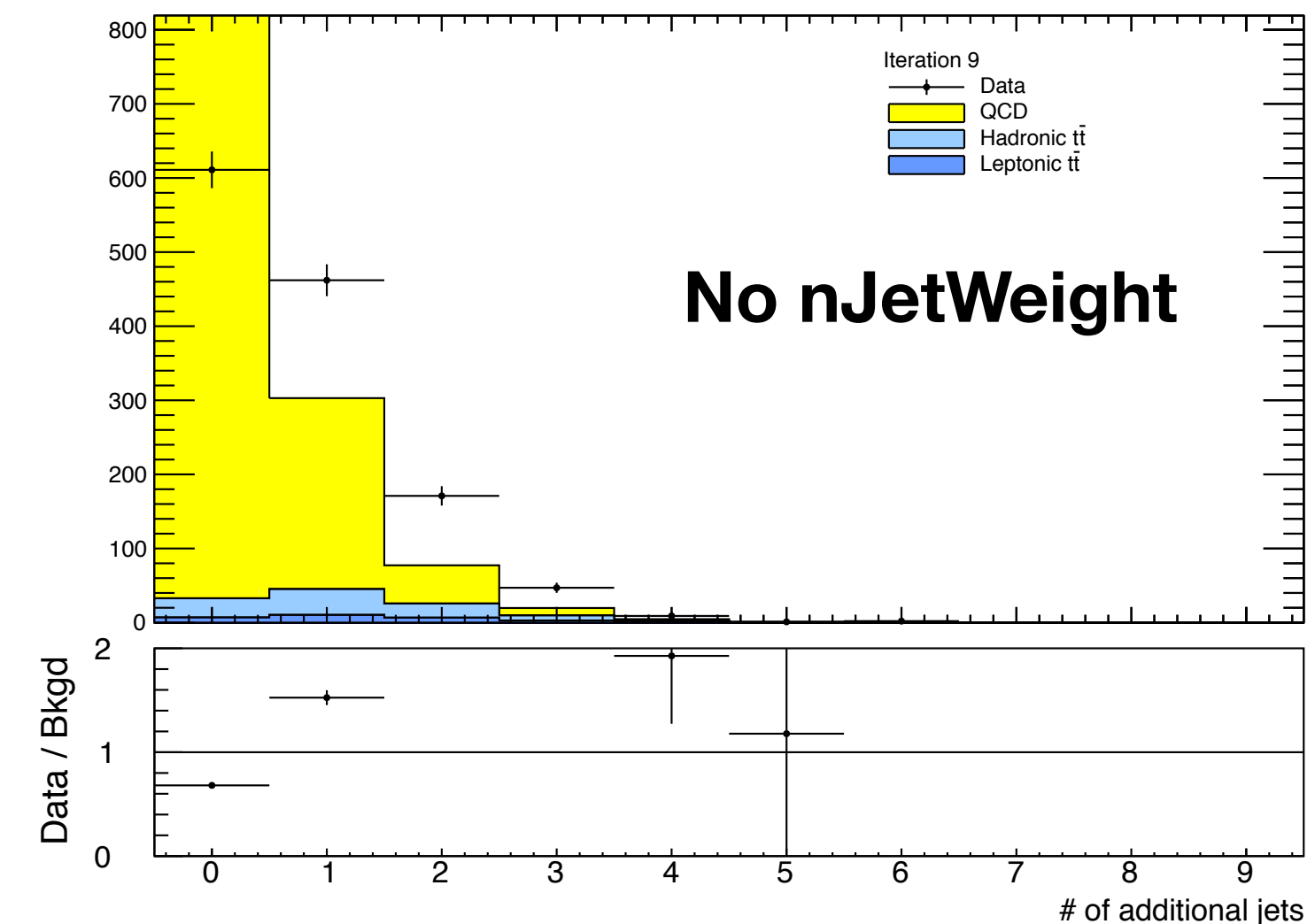
- Conceptually, weight for an event is then

$$w = \text{nJetWeight} \times \prod_{a \in A} f^a(x_a)$$

- $a \in A$  runs over the reweighting distributions
- $f^a(x_a)$  is taken from the splines
- nJetWeight depends on a fit of the pseudo-tag probability,  $f$ , to match the distribution of the number of jets
- In practice, this is a bit ad hoc, so we need to iterate. Adding a factor that approaches 1 for later iterations, our event weight is then

$$w = \text{nJetWeight} \times \prod_{i=0}^{i < I} \prod_{a \in A} [(f_i^a(x_a) - 1) \times (1 - 2^{-i-1}) + 1]$$

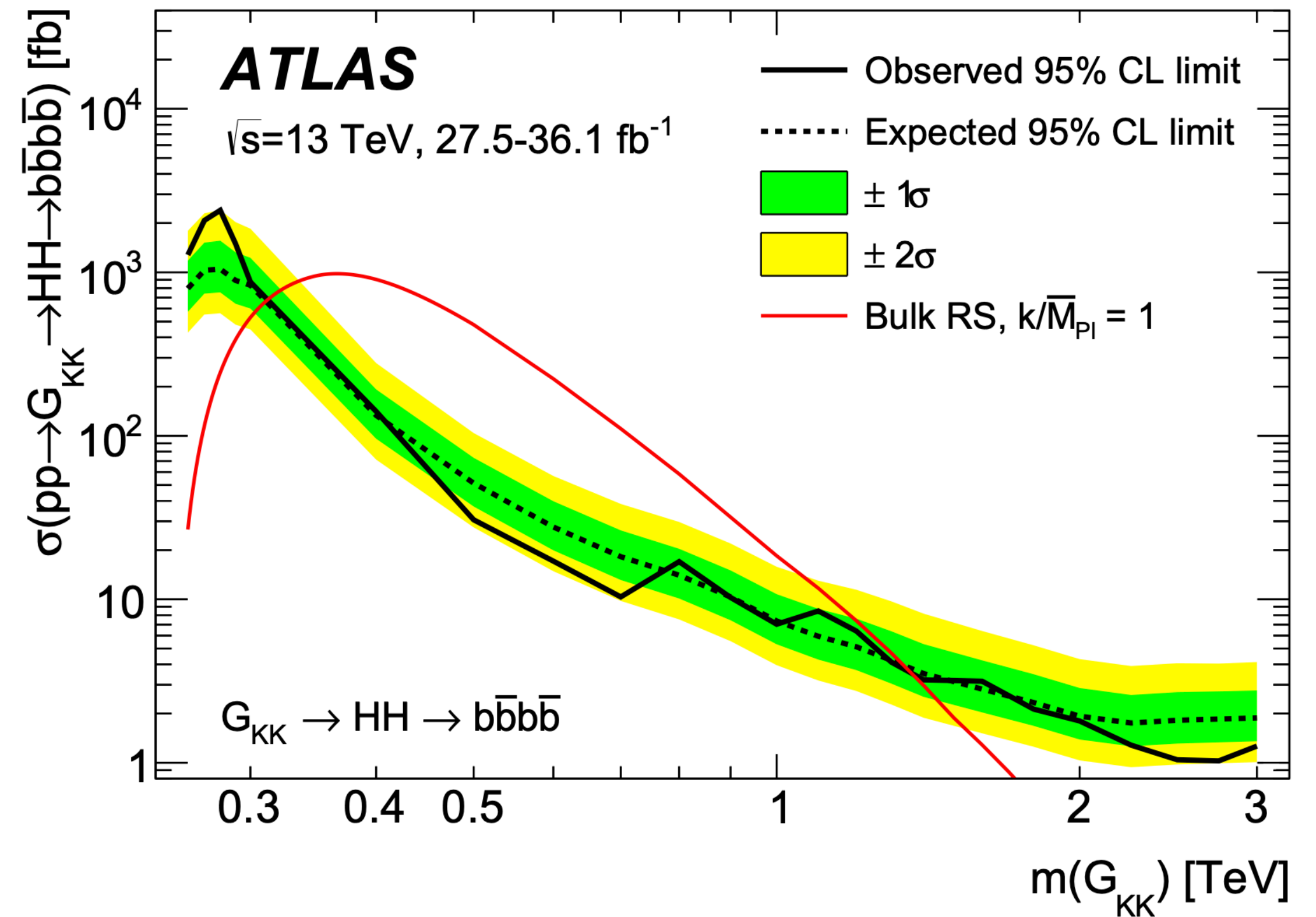
where  $i$  runs over iterations



# HH→4b: Results

# The Analysis: Results

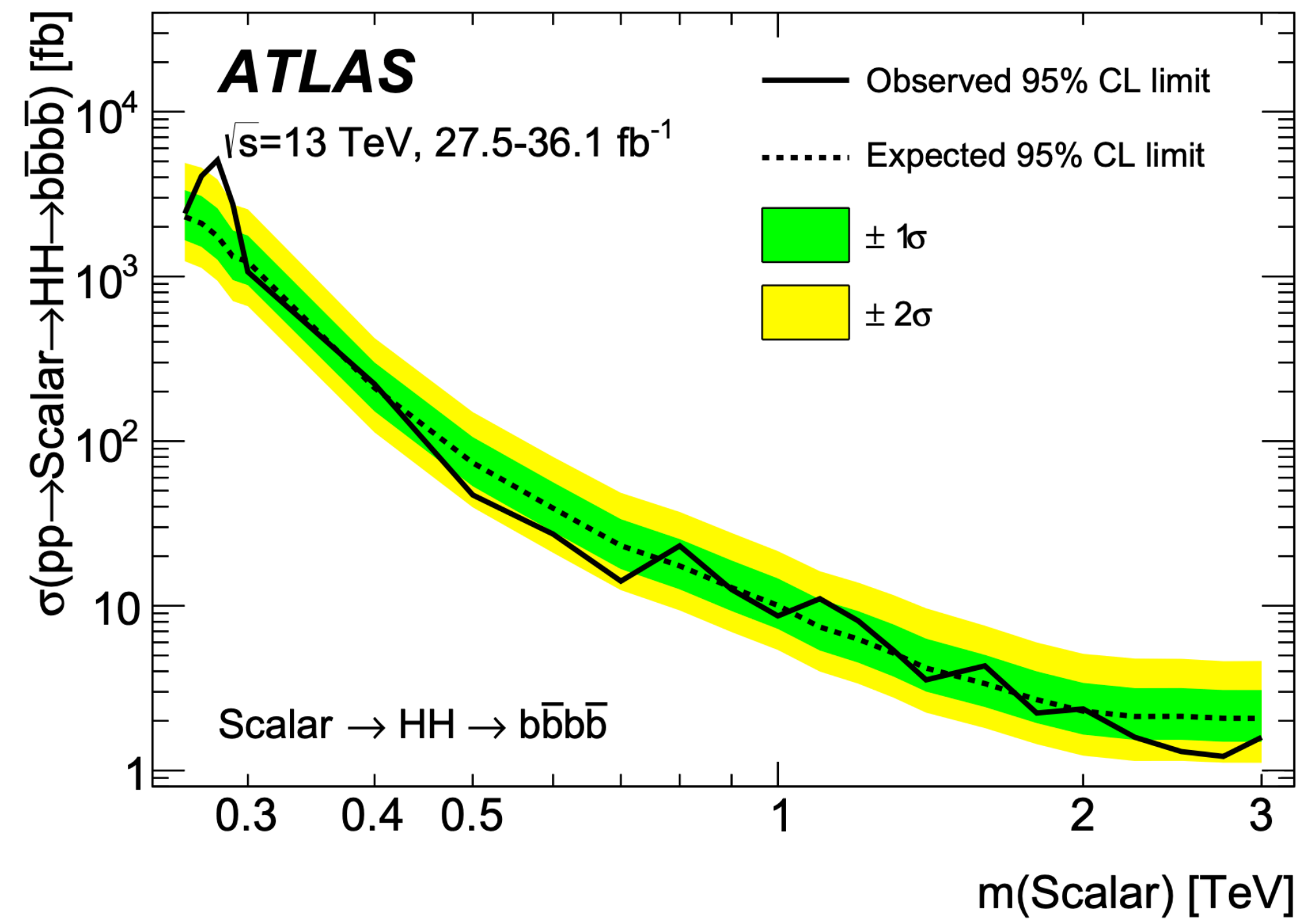
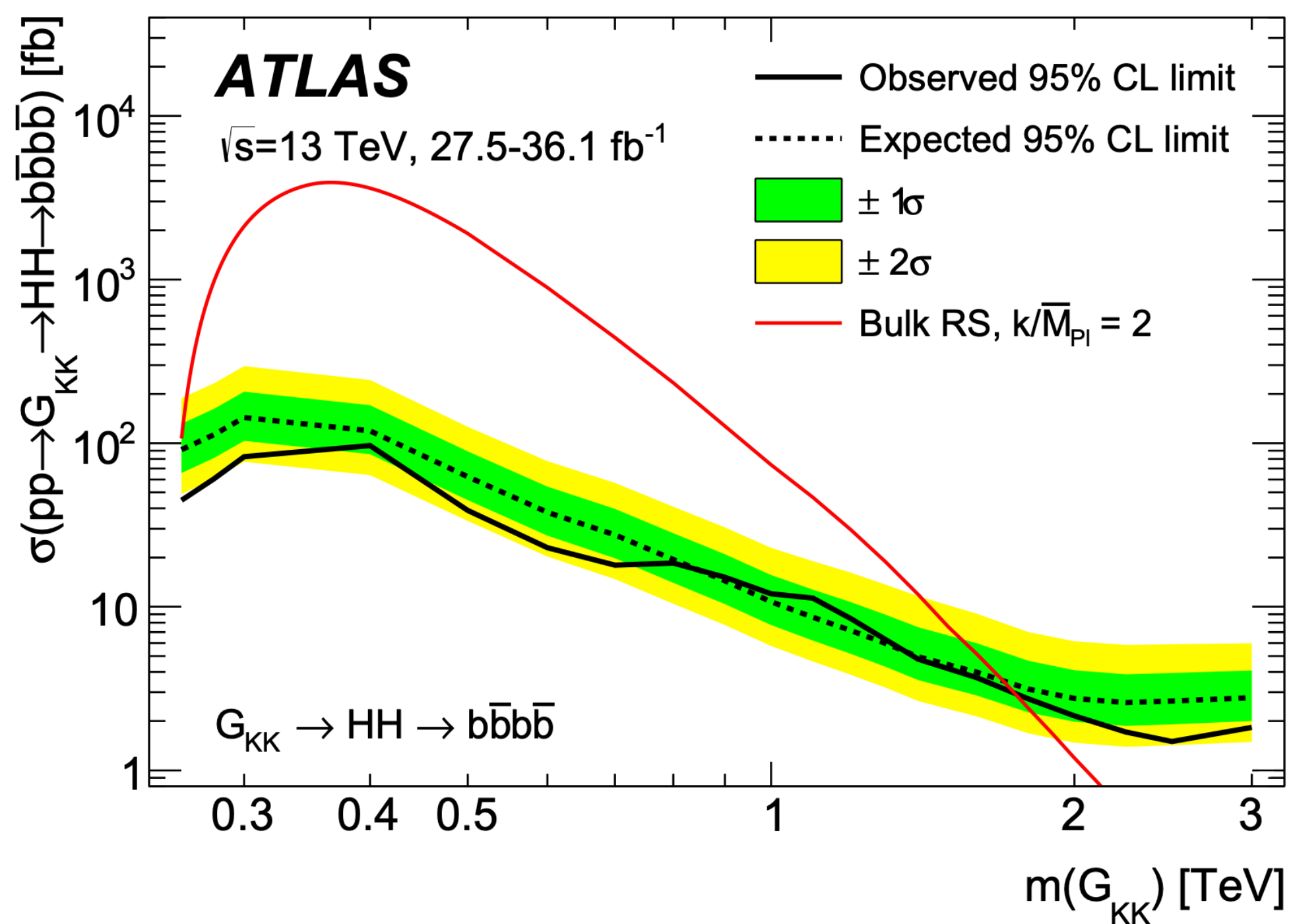
- We have not yet observed anything in the  $HH \rightarrow 4b$  channel
- We thus set upper limits on the cross sections for models we consider
- We report here the published results for the combined (boosted and resolved) analyses
  - Limits for  $c=1.0$  graviton and Standard Model HH shown here
- All cross sections above the line are excluded



Observed	-2σ	-1σ	Expected	+1σ	+2σ
12.9	11.1	14.9	20.7	30.0	43.6

**SM HH limits (as multiples of the SM cross section)**

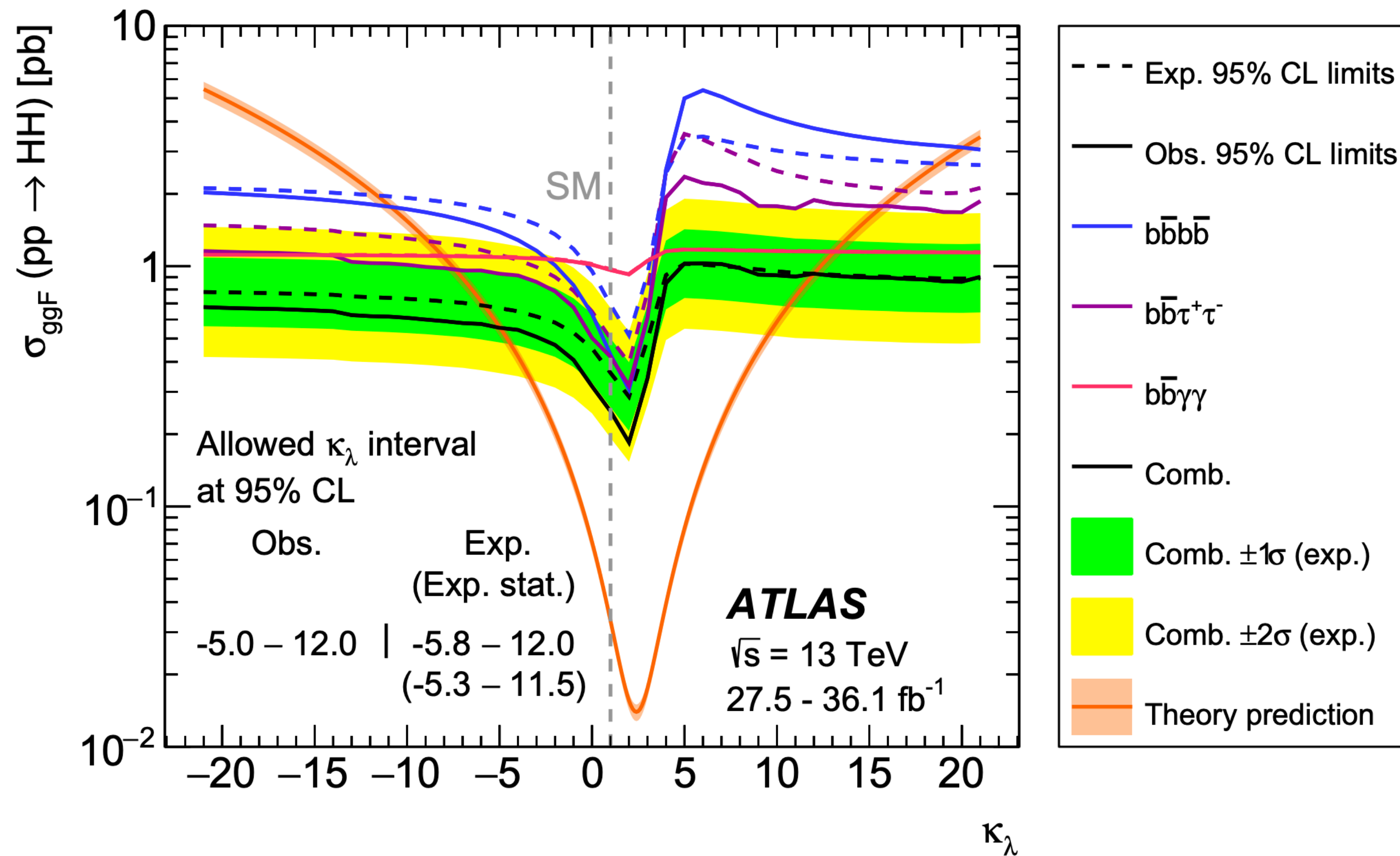
# The Analysis: Results



- Limits for  $c=2.0$  graviton and generic narrow width scalar



# The Analysis: $\kappa_\lambda$ Scan

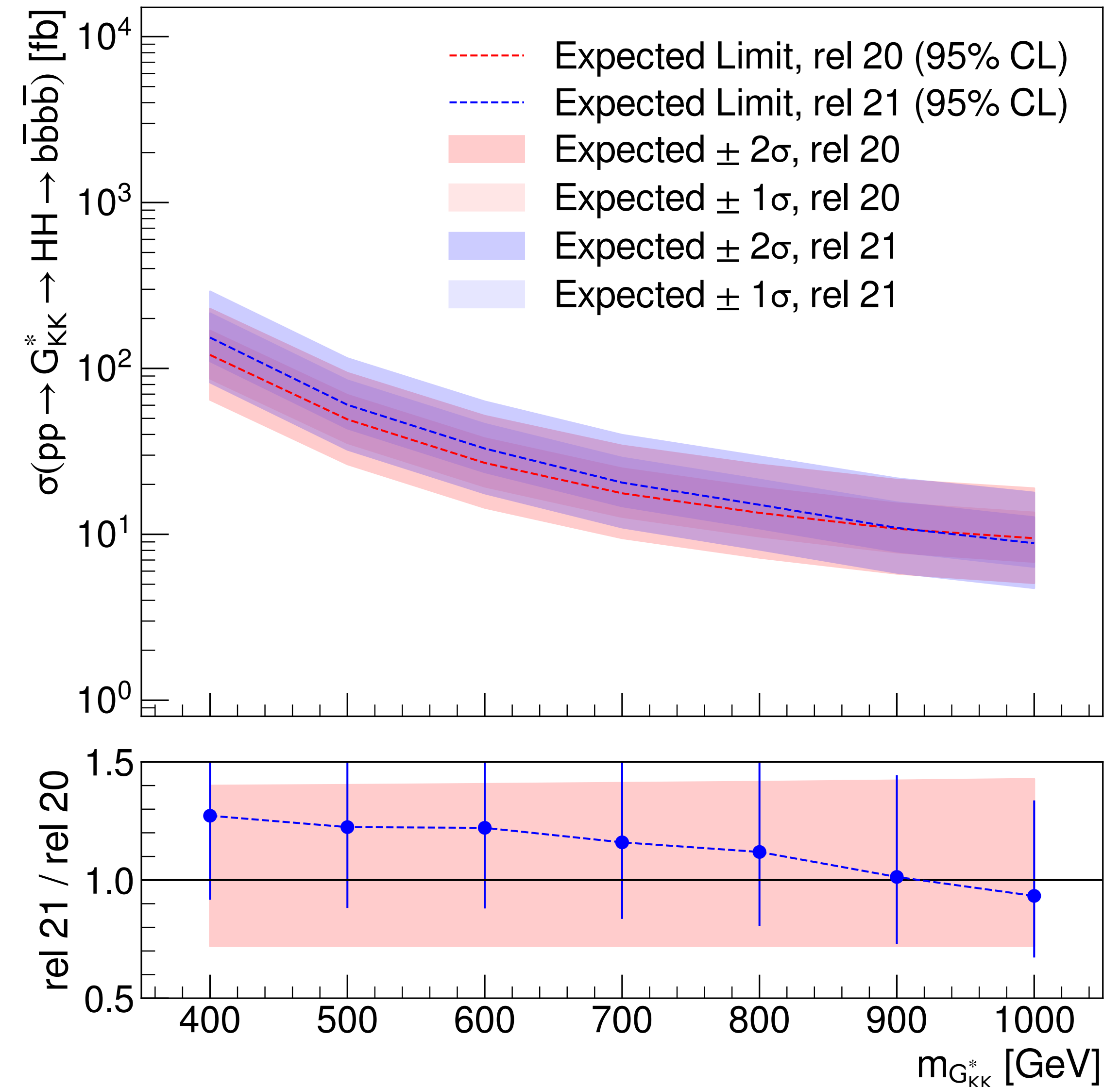


- Results from a scan over values of  $\kappa_\lambda$  for combined non-resonant HH production channels [ref]
  - Recall  $\kappa_\lambda = 1$  is the Standard Model value
- Allowed values are restricted to be between -5.0 and 12.0 (observed limits)
- 4b alone restricts the allowed range to be between -10.9 and 20.1

HH→4b: Looking Forward

# Old Analysis, New Software

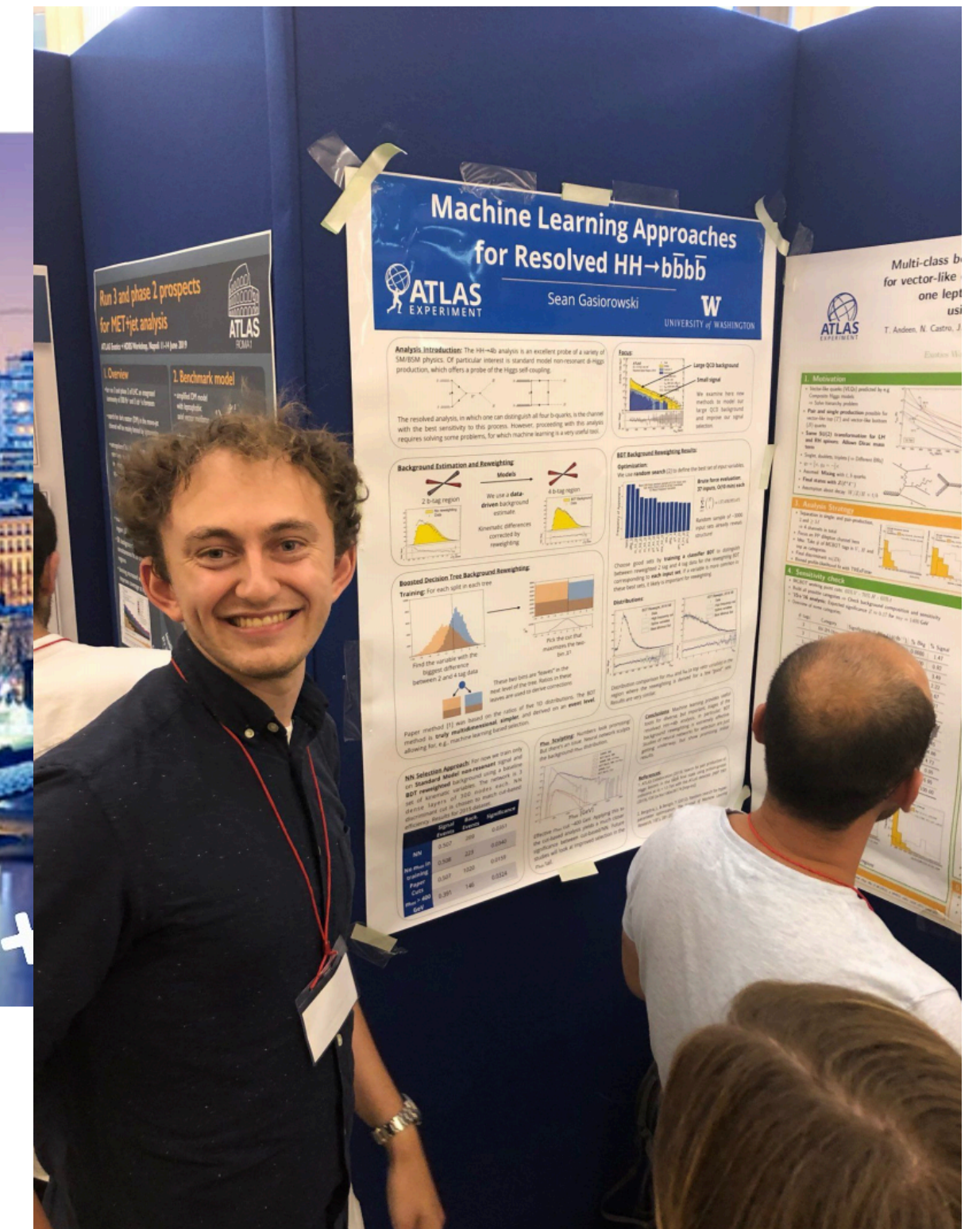
- As mentioned, I've reproduced the published resolved analysis and performed an extensive set of cross checks
- Show on the right limits for the previous (red) and the new (blue) ATLAS software for the  $c=1.0$  graviton
- Limits are  $\sim 25\%$  worse!
  - Consistent with observed changes in MC yields
- Changes are understood to be due to b-tagging modeling improvements





# Towards the Future

- Lightning talk and poster at ATLAS Exotics/HDBS workshop (Naples, Italy, June 2019)
- Winner of best poster (and a cool orange backpack)!
- Poster at ATLAS week (CERN, June 2019)

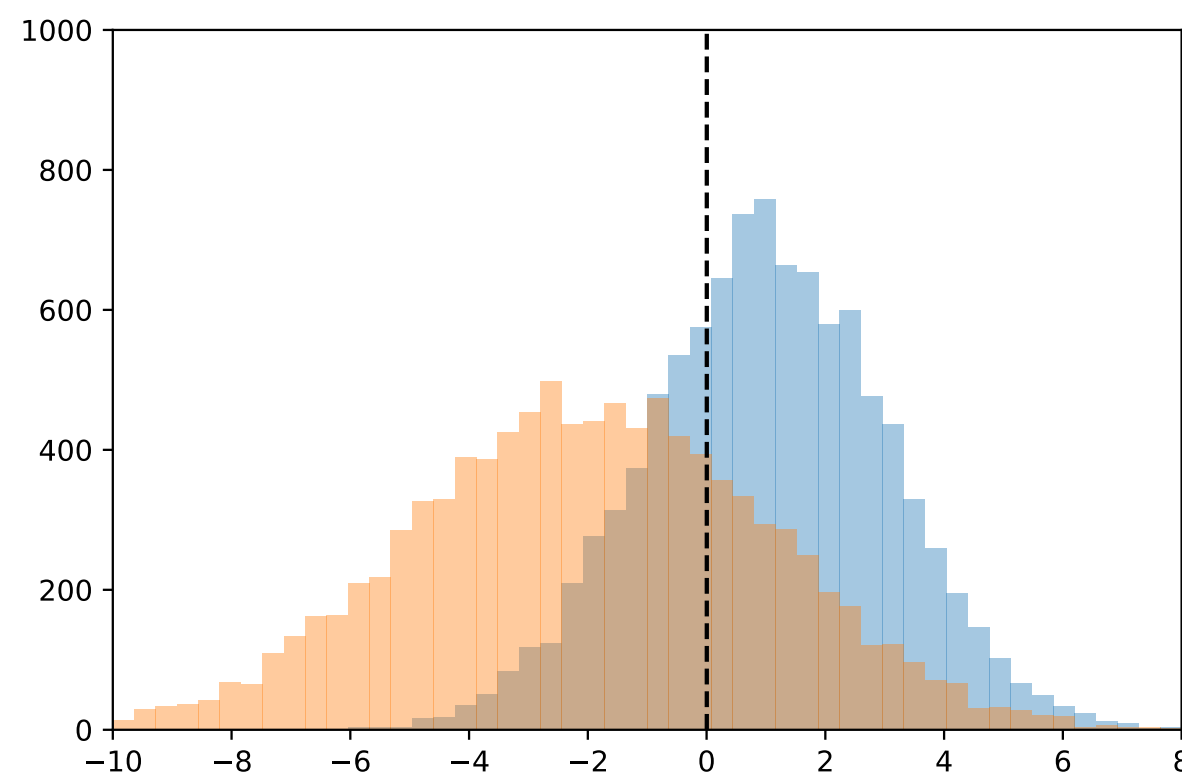


# Towards the future: Areas of Focus

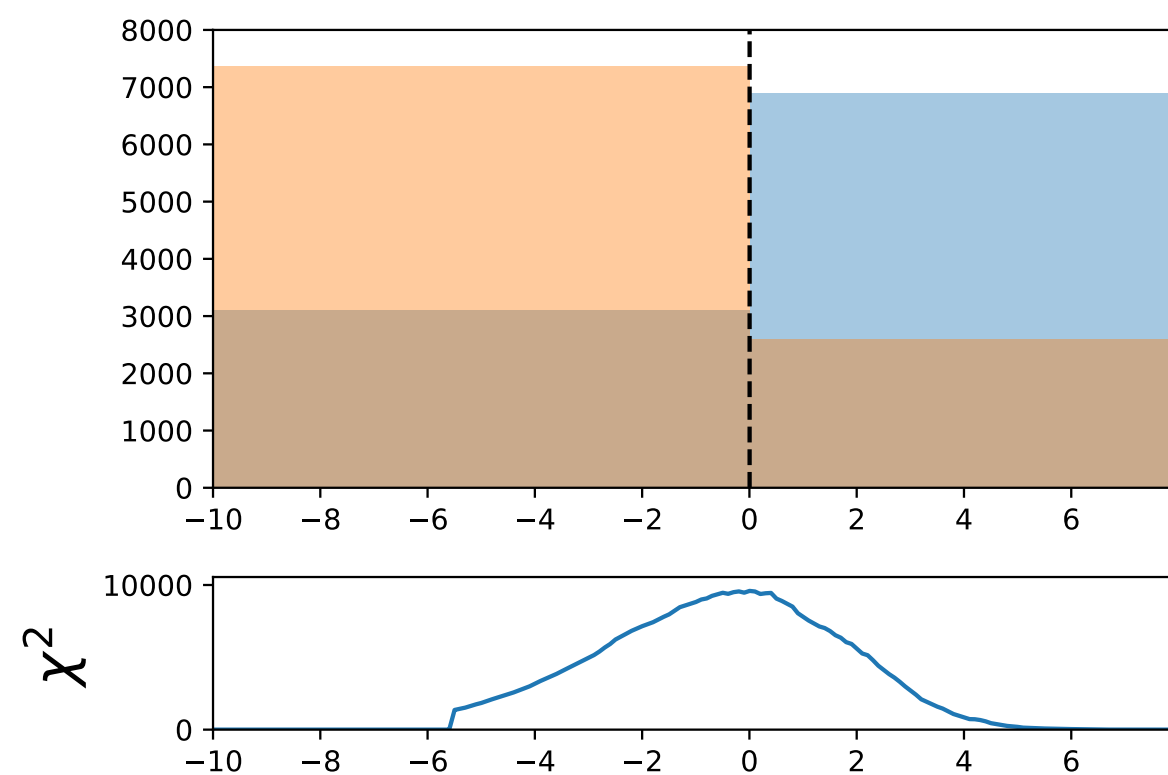
- **Background estimation:**
  - Previous method is complicated, ad hoc
    - Multiplying splines together doesn't properly account for correlations between variables
  - New idea: Boosted Decision Tree (BDT) for background estimation!
- **Selection:**
  - Machine learning tools have a lot to offer - what can they do for our analysis?
- Much activity in the group on several other areas of optimization. I will, in addition, be working on several aspects of the baseline analysis (systematics, fits, limits, etc)



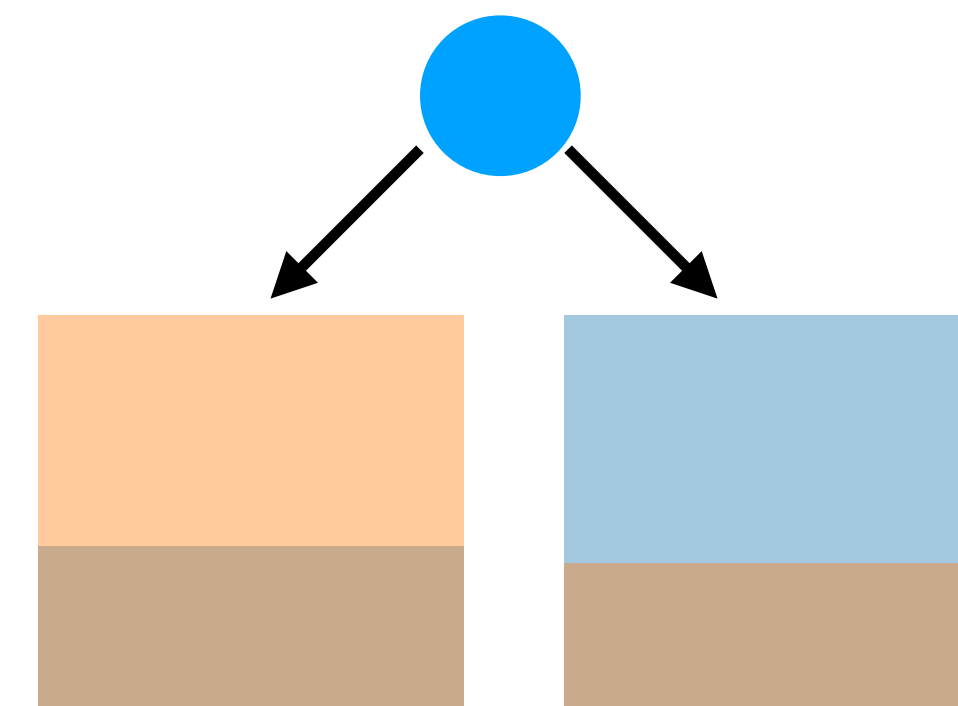
# Reweighting BDT: The Approach



Find the variable with the biggest difference between 2 and 4 tag data

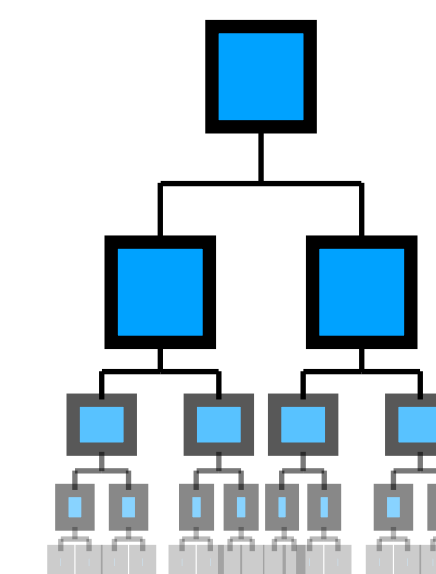


Pick the cut that maximizes the two-bin  $\chi^2$

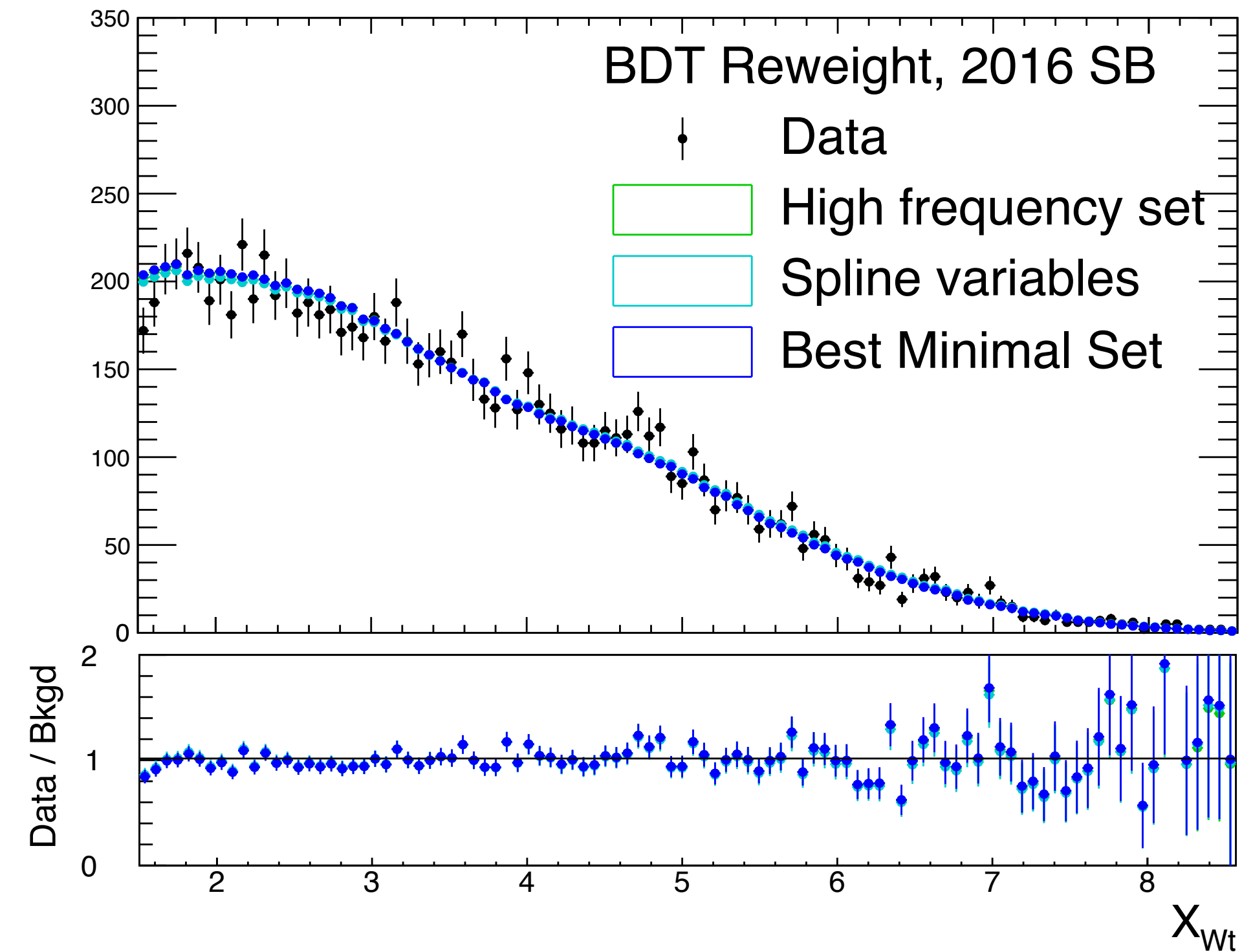
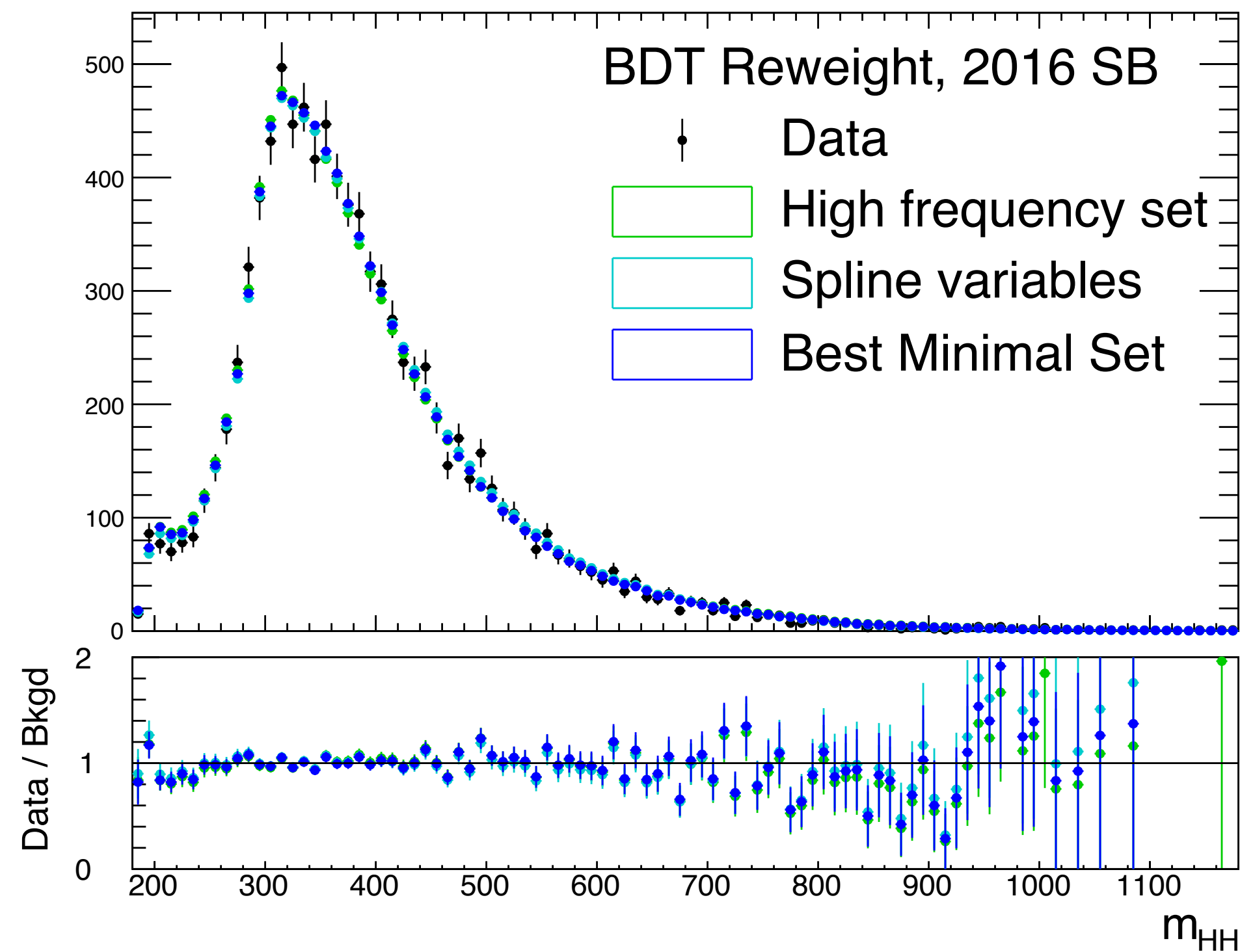


These two bins are “leaves” in the next level of the tree. Ratios in these leaves are used to derive corrections

- The general procedure is shown above for some given set of input variables
- We consider here a **fully data driven** background (recall, QCD ~95% of the background)
- The BDT method is **simpler** and **truly multidimensional**



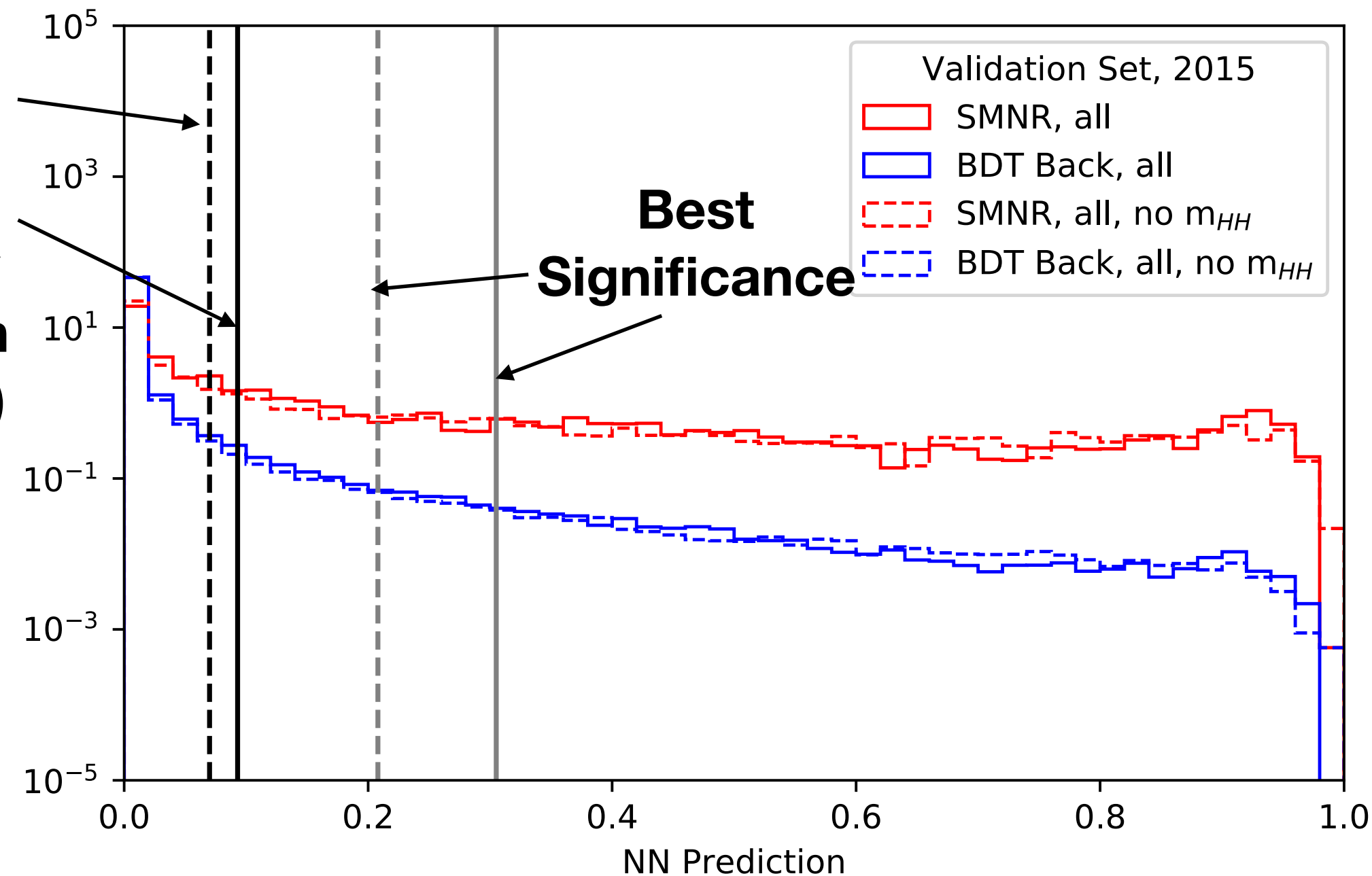
# Reweighting BDT: Results



- Work is ongoing on optimization of the BDT - in particular, choosing which variables are sensitive to 2 vs. 4 tag differences
- Results for a few different input set choices are shown above. Agreement with data is very good

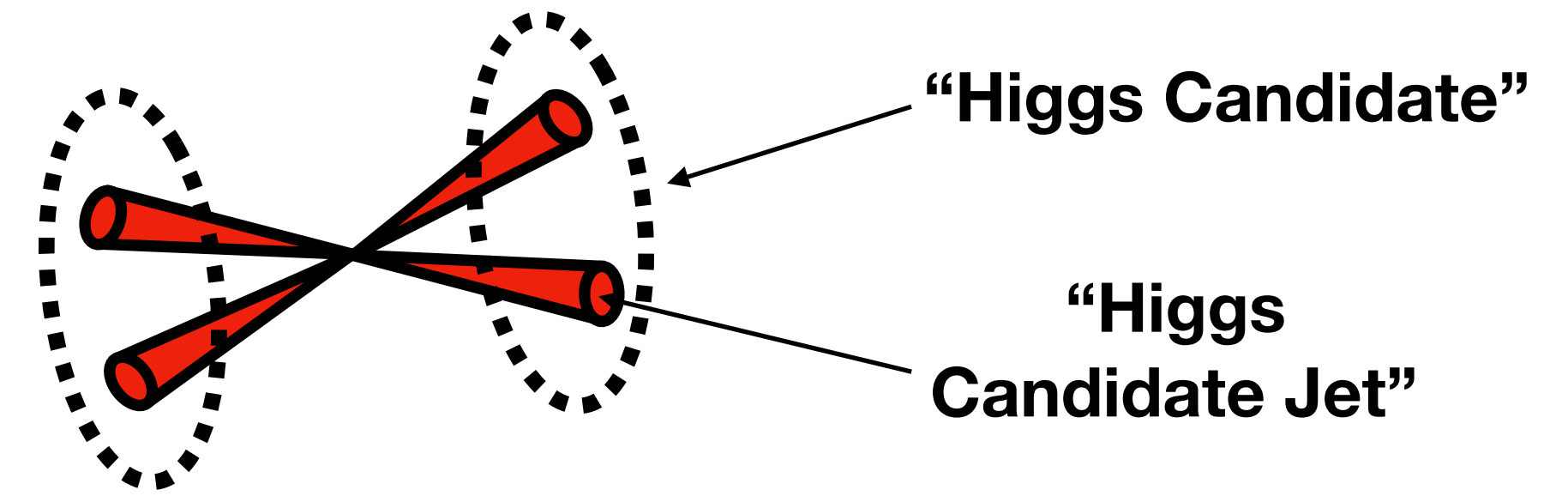
# Neural Network Selection

Match  
Paper  
Analysis  
Signal  
Efficiency  
(results on  
next slide)



**NN discriminant. Solid lines trained with variables on right, dashed lines same, but without  $m_{HH}$ . Histograms are normalized to 1.**

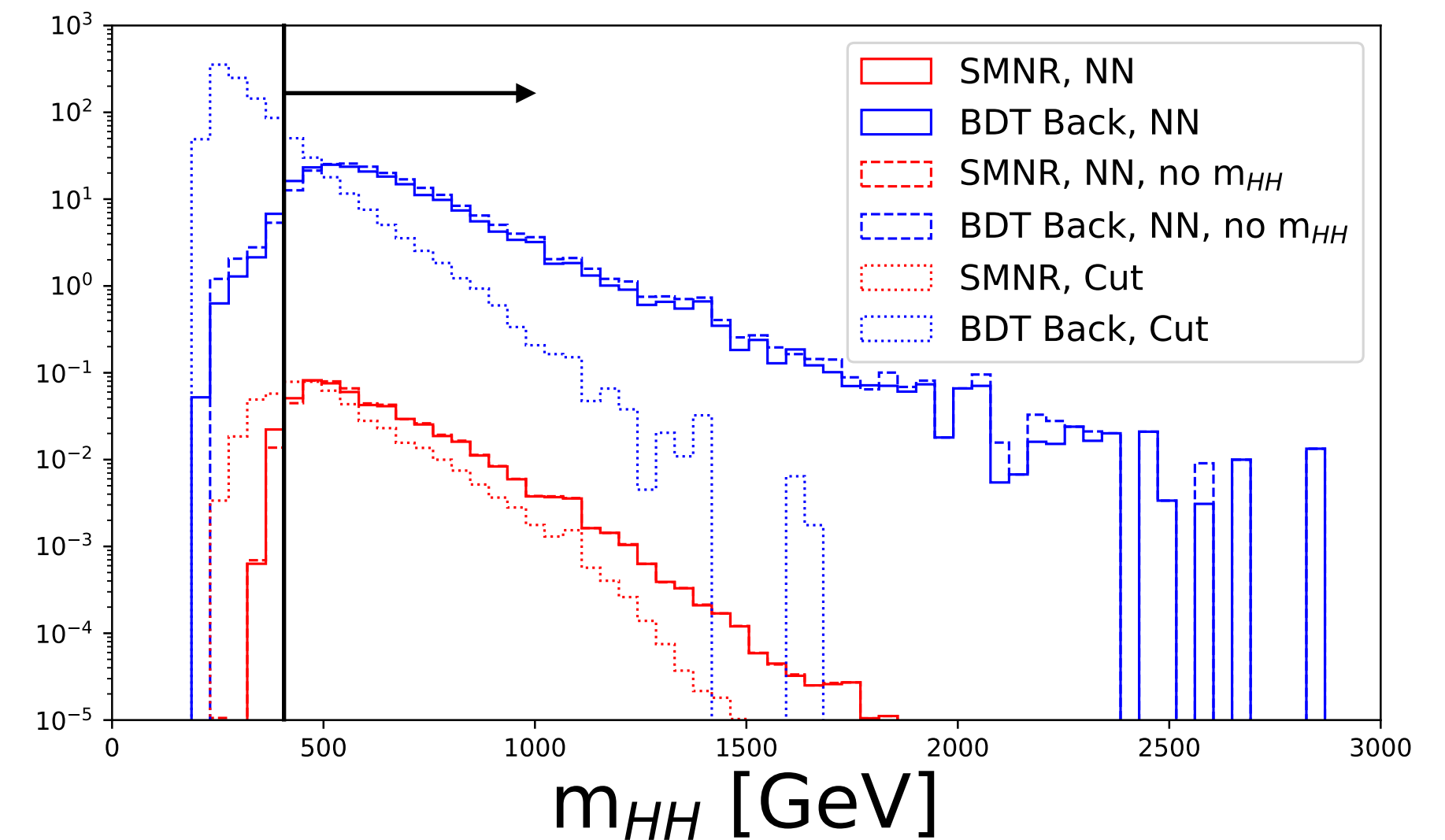
$$\text{Significance} = \sqrt{2 \cdot ((s + b) \cdot \ln(1 + \frac{s}{b}) - s)}$$



- Try to improve on the cut-based selection by using a neural network. Looking at Standard Model non-resonant signal here
- Input variables:
  - $m_{HH}$  (unless specified)
  - $p_T$ ,  $\eta$ ,  $\phi$ ,  $m$ , and  $E$  for each Higgs candidate and HC jet
  - $X_{Wt}$  (top veto variable) and  $X_{hh}$  (distance from (120 GeV, 110 GeV) in Higgs candidate mass plane)

# S vs. B: Neural Networks and $m_{HH}$

- NN improves significance, but sculpts the  $m_{HH}$  distribution (used for limit setting)
- This results in an “effective  $m_{HH}$  cut” at around 400 GeV
- Applying this cut on top of the paper cuts makes the NN/cut-based results much closer - selection power in  $m_{HH}$ !
- Future interest: Explore parameterizing selection as a function of  $m_{HH}$



	Signal Events	Back. Events	Significance
<b>NN</b>	0.507	209	0.0351
<b>Paper Cuts</b>	0.507	1020	0.0159
<b><math>m_{HH} &gt; 400</math> GeV</b>	0.391	146	0.0324

# Timeline and Conclusions



# Summary of Progress

- **Completed ATLAS qualification**
  - Developed and implemented method to improve shower shape modeling
- **Reproduced the baseline published  $HH \rightarrow 4b$  analysis**
  - Involved writing a more flexible, understandable code base
- **Performed extensive cross-checks between ATLAS software releases**
  - Up to 25% change in limits due to changes in b-tagging
- **Began detailed work on improvements to the  $HH \rightarrow 4b$  analysis**
  - In particular, focusing on selection and background estimation

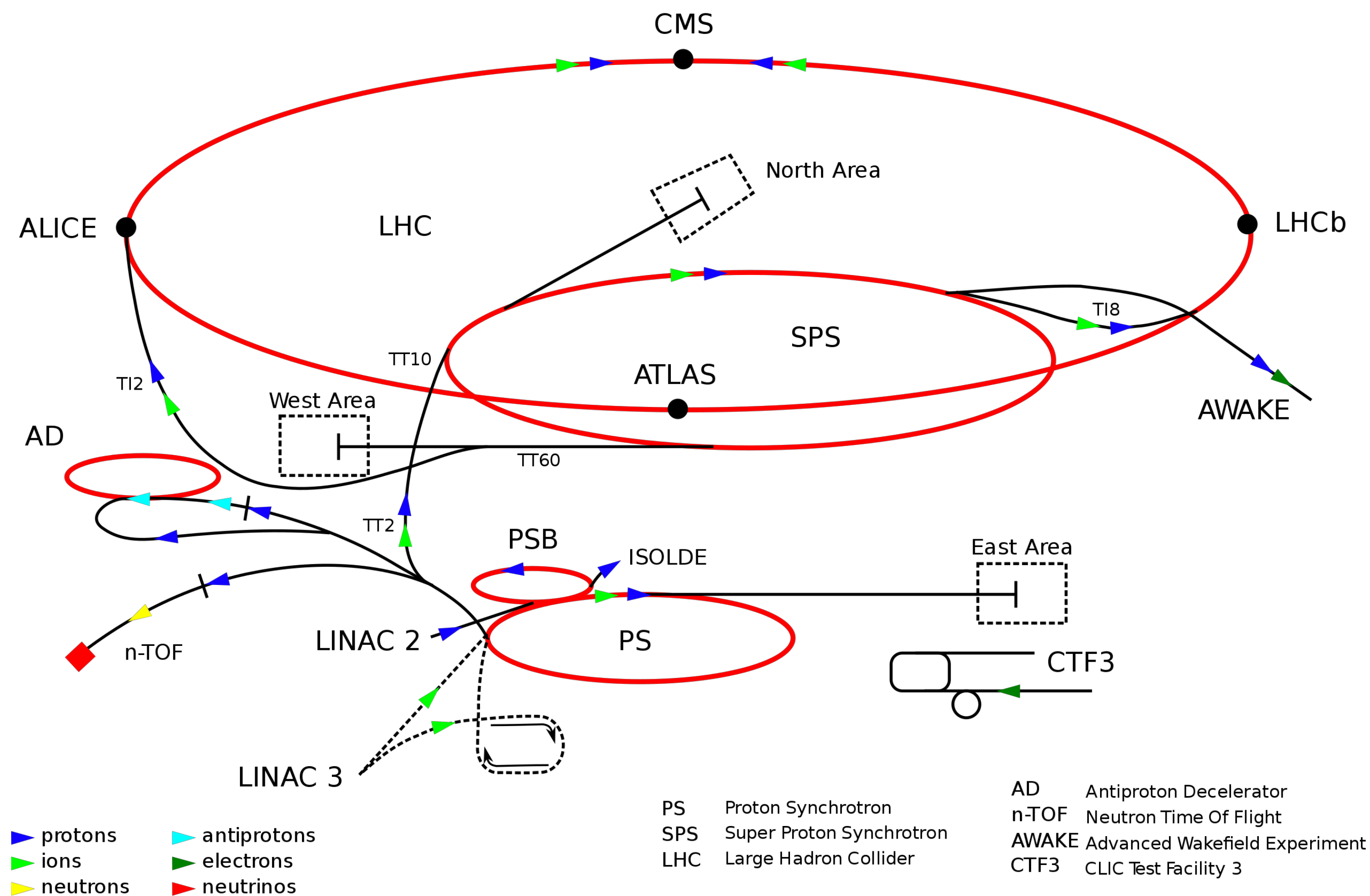
# Timeline

<b>Now - Early 2020</b>	Finalize background estimation, selection methods, systematics for 4b. Start writing paper. Test new FastCaloSim for physics, finish implementation.
<b>Early 2020</b>	Resonant 4b result published
<b>Summer 2020</b>	Non-resonant 4b result published
<b>Fall 2020 – Spring 2021</b>	Work on 4b reinterpretation paper ( $X \rightarrow SH$ , e.g.)
<b>Spring 2021 – Summer 2021</b>	Write thesis, finish up reinterpretation if need be
<b>Summer 2021 – Fall 2021</b>	Graduate

**Thanks!**

Backup

# LHC: Ring and Acceleration

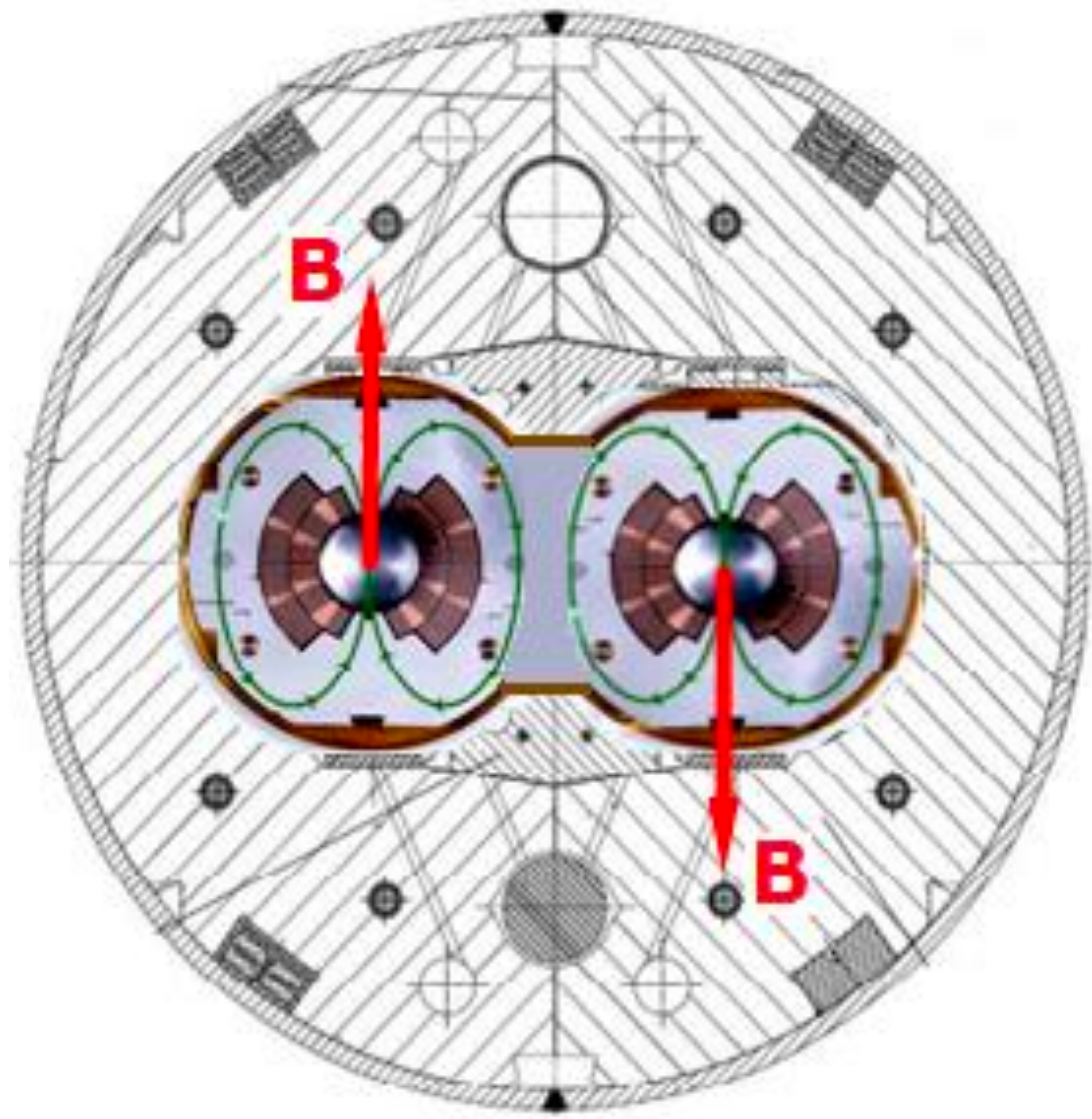


## Source, acceleration info

- The LHC is a 27 km circumference ring. There are 4 collision points along the ring for the 4 particle detectors (ATLAS, CMS, LHCb, ALICE)
- Protons move in two counter-circulating beams
- Acceleration chain:
  - Electric field strips hydrogen of its electrons
  - LINAC 2 accelerates protons to 50 MeV
  - Beam is injected into the Proton Synchrotron Booster (PSB), which pushes them to 1.4 GeV, and then the Proton Synchrotron (PS), bringing the beam to 25 GeV
  - From there, protons are transferred to the Super Proton Synchrotron (SPS) => 450 GeV, and then finally to the LHC => 6.5 TeV

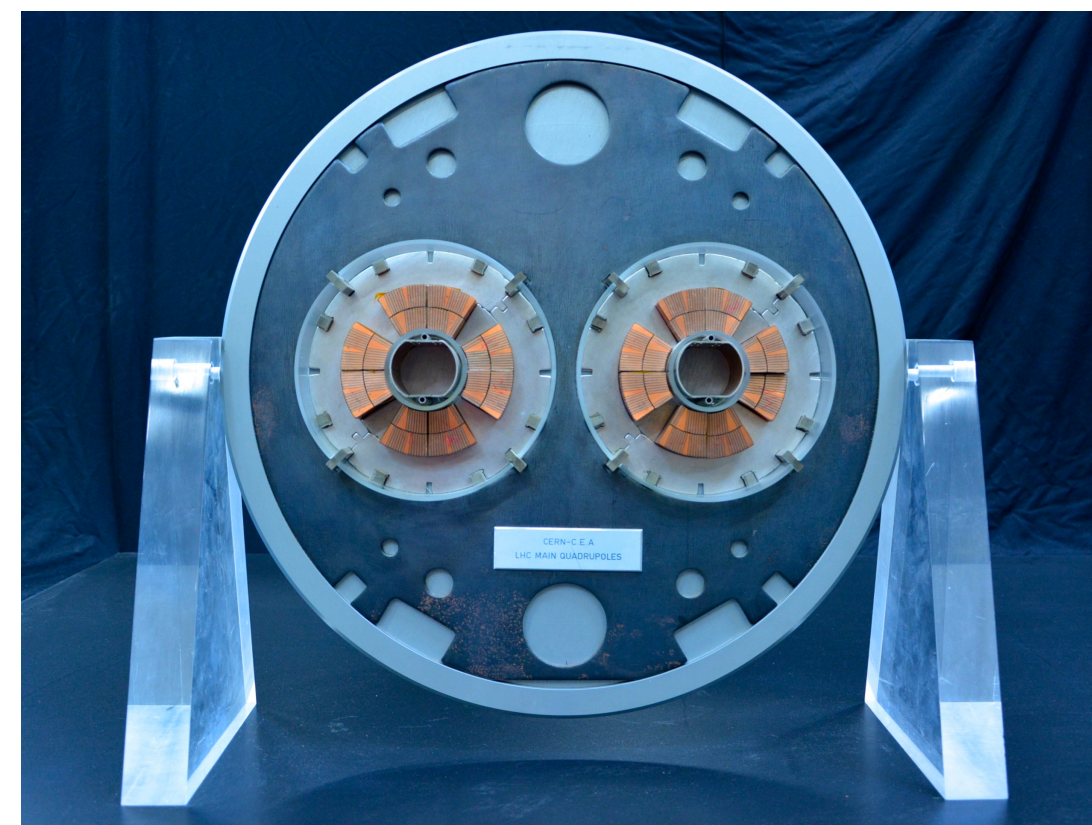
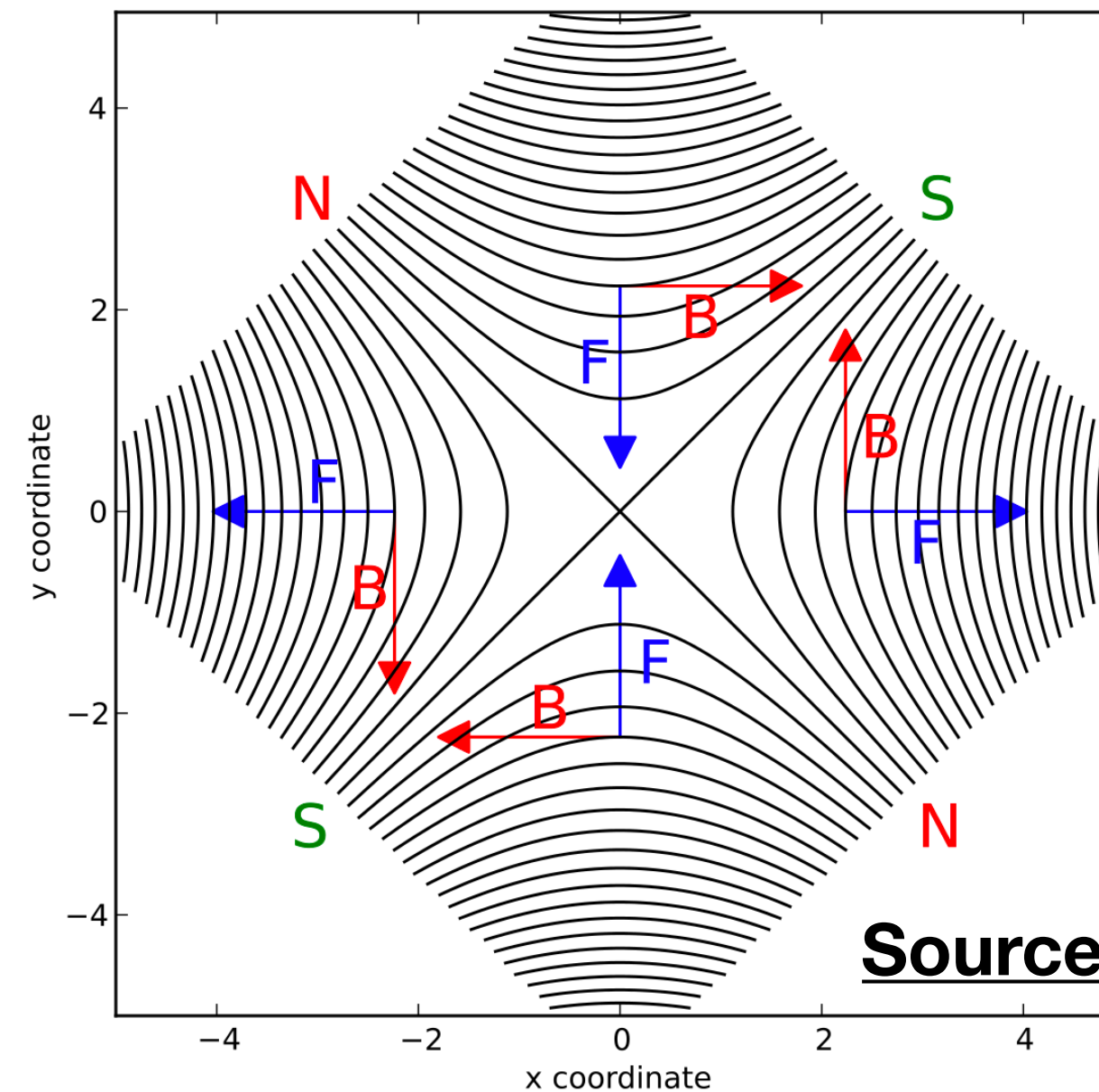


# LHC: Magnets



Dipole magnets provide a centripetal force to keep protons in the ring [ref]

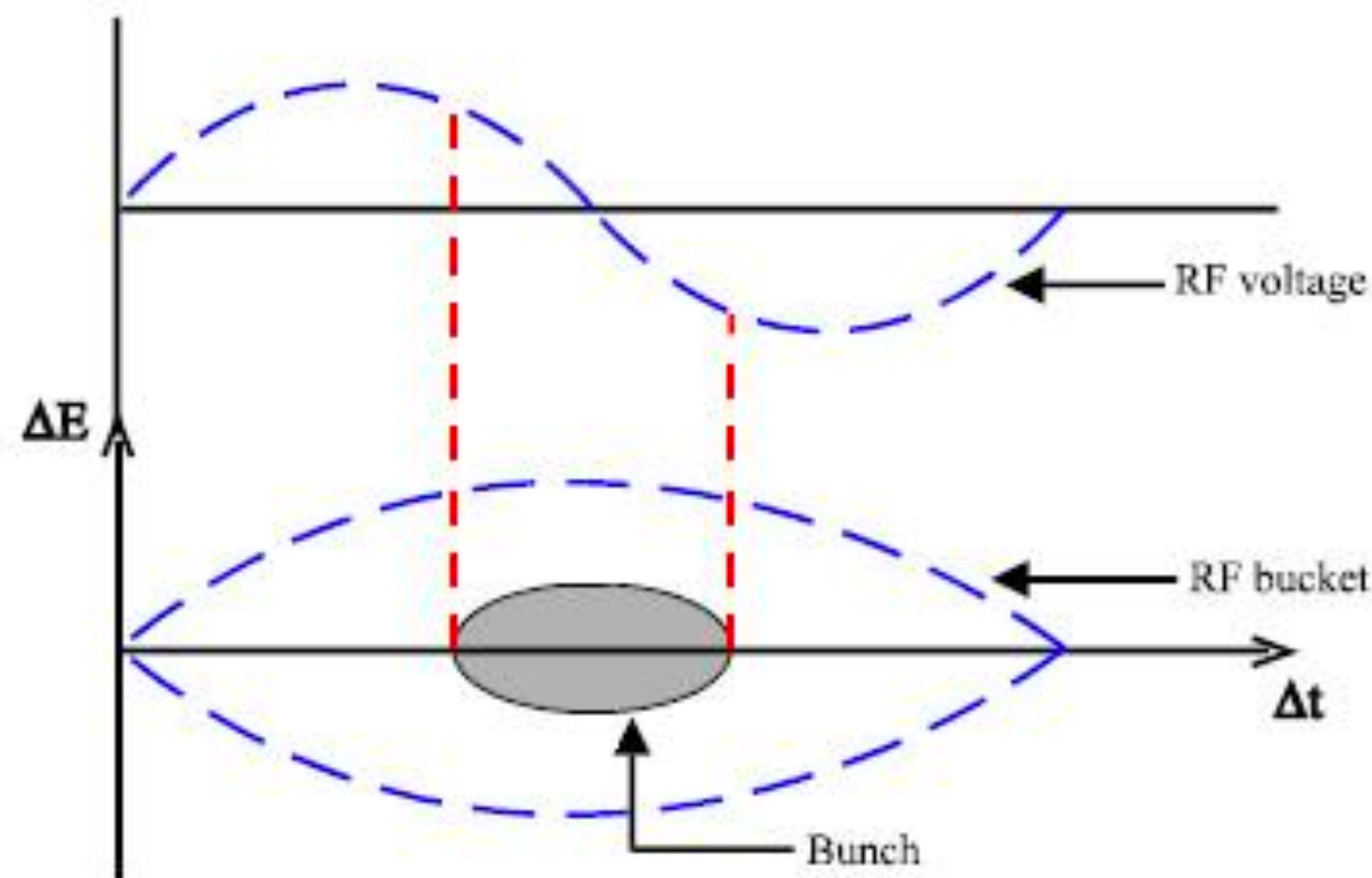
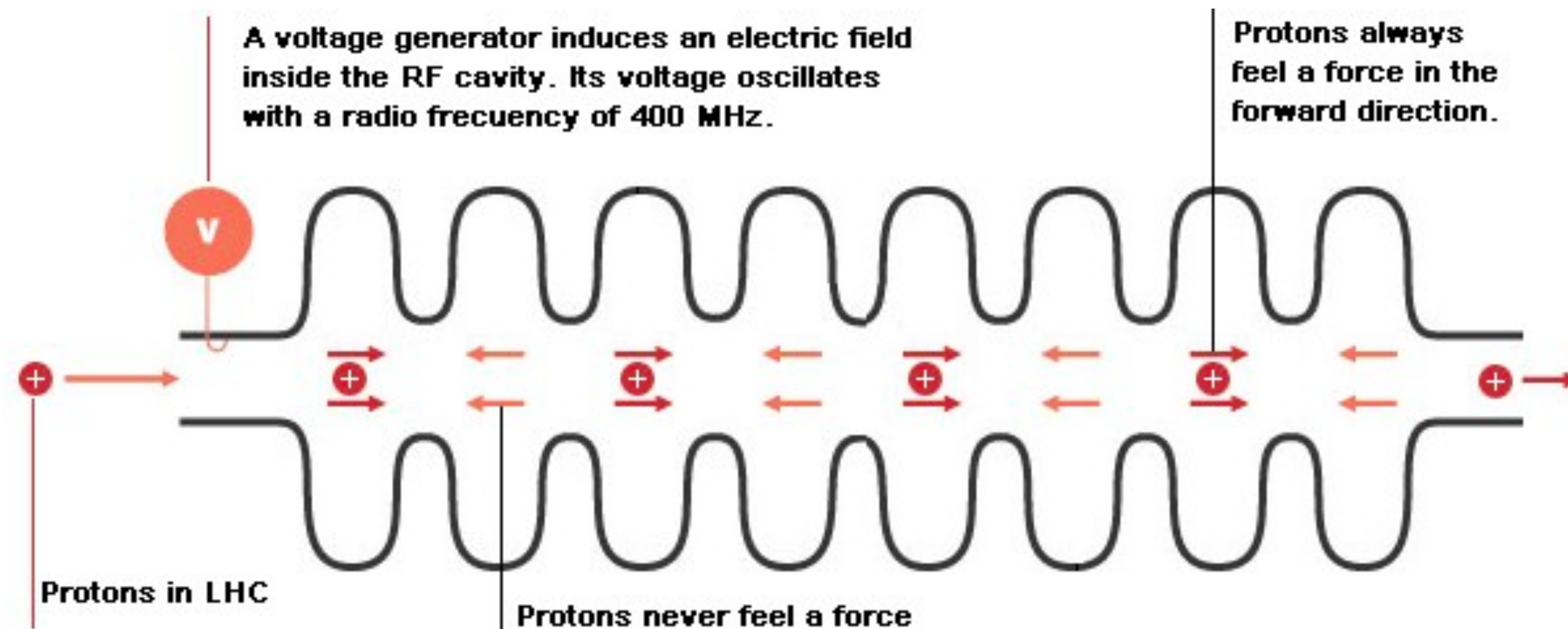
Quadrupole magnets focus (alternate in which direction)



- Superconducting magnets (cooled by liquid helium) are used to keep the protons in the LHC
- Dipole magnets are used to bend the paths of particles around the ring
- Quadrupoles are used to keep the particles in a tight beam
- Higher order magnets are used to correct for small imperfections



# LHC: Acceleration



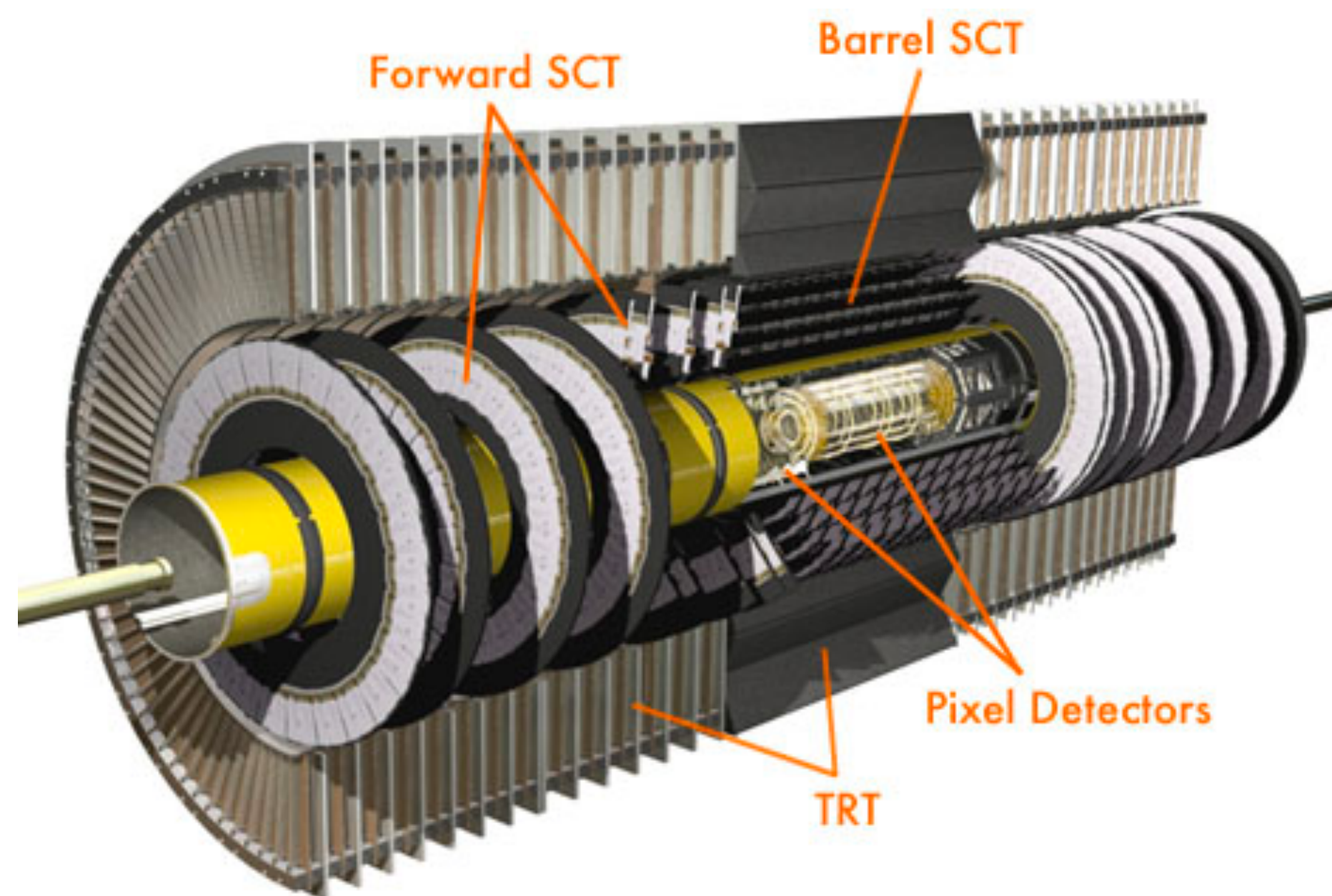
## Source, buckets

**Buckets are RF groupings. Bunches are groups of protons, filling a bucket. 25 ns bunch spacing is used at the LHC**

- Magnetic fields do no work! We need to use electric fields to accelerate the protons
- Most of this job is done by Radiofrequency (RF) cavities
- In these, an electromagnetic field is made to oscillate (switch direction) at a precise rate
- Timing is important so that protons always see an accelerating voltage
- However there's some self correction! There is some finite spread in grouping of particles. If a particle arrives too early, e.g., it will see some decelerating voltage, too late, it will see a higher accelerating voltage



# ATLAS Detector: Inner Detector



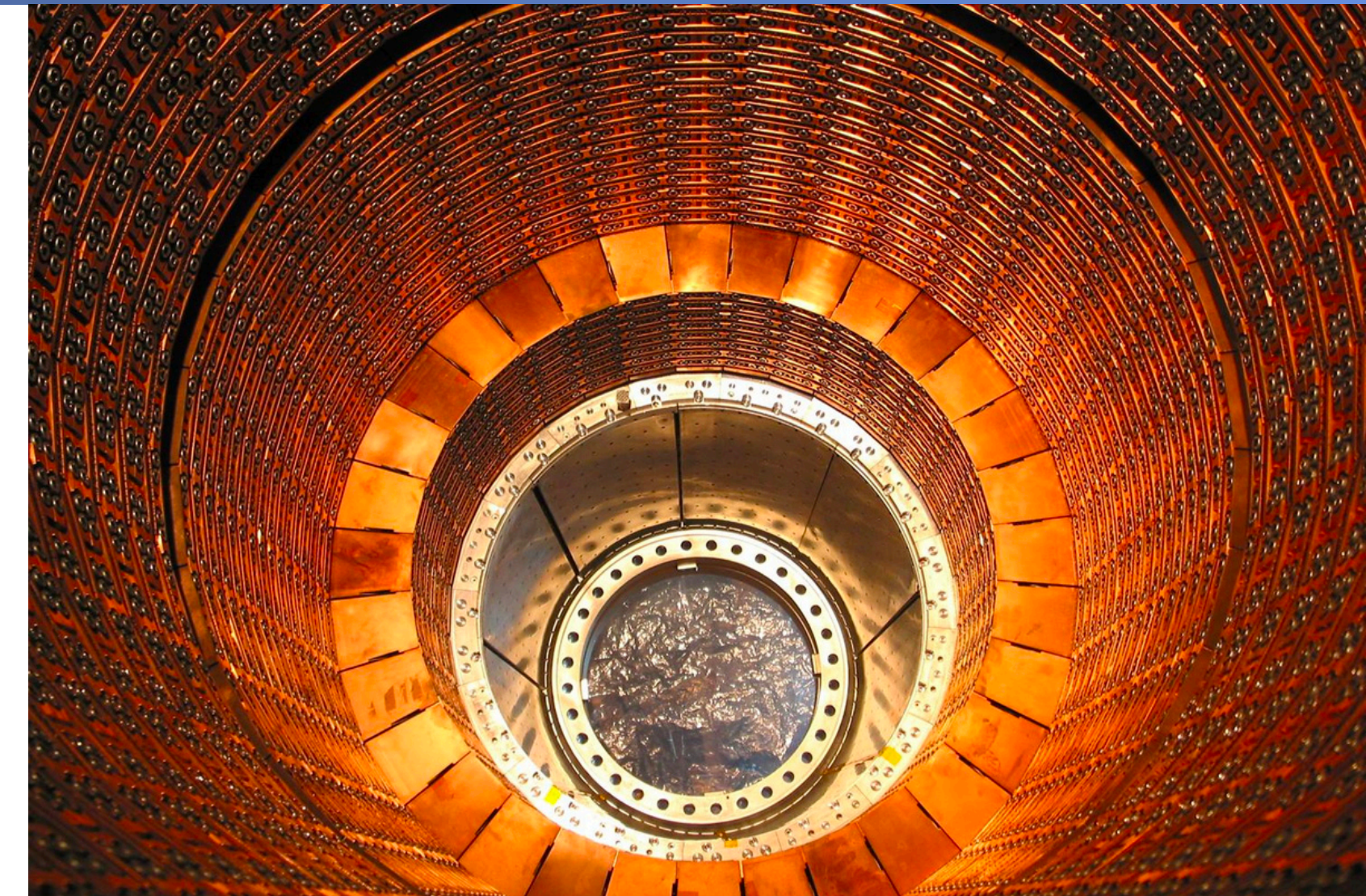
- The Inner Detector contains the tracking elements for ATLAS
  - Everything is inside of a 2 T solenoid magnet, providing information about momentum from curvature (in x, y direction, z is along the beamline)
- Silicon tracking: Silicon is ionized by a charged particle (knocks out electrons), charge is collected
- **Pixel detector:** High granularity, very close to interaction point, high degree of positional information - important for b-tagging!
- **Semiconductor Tracker (SCT):** Lower granularity, but similar in concept to Pixel
- **Transition Radiation Tracker (TRT):** Drift tubes and materials with widely varying indices of refraction
  - Drift tube: straw filled with (Xenon) gas with a wire in the center, which collects electrons displaced by an ionizing particle
  - Varying index of refraction => transition radiation. The amount given off depends on particle speed, lower mass => higher speed for a given energy => helps with particle identification



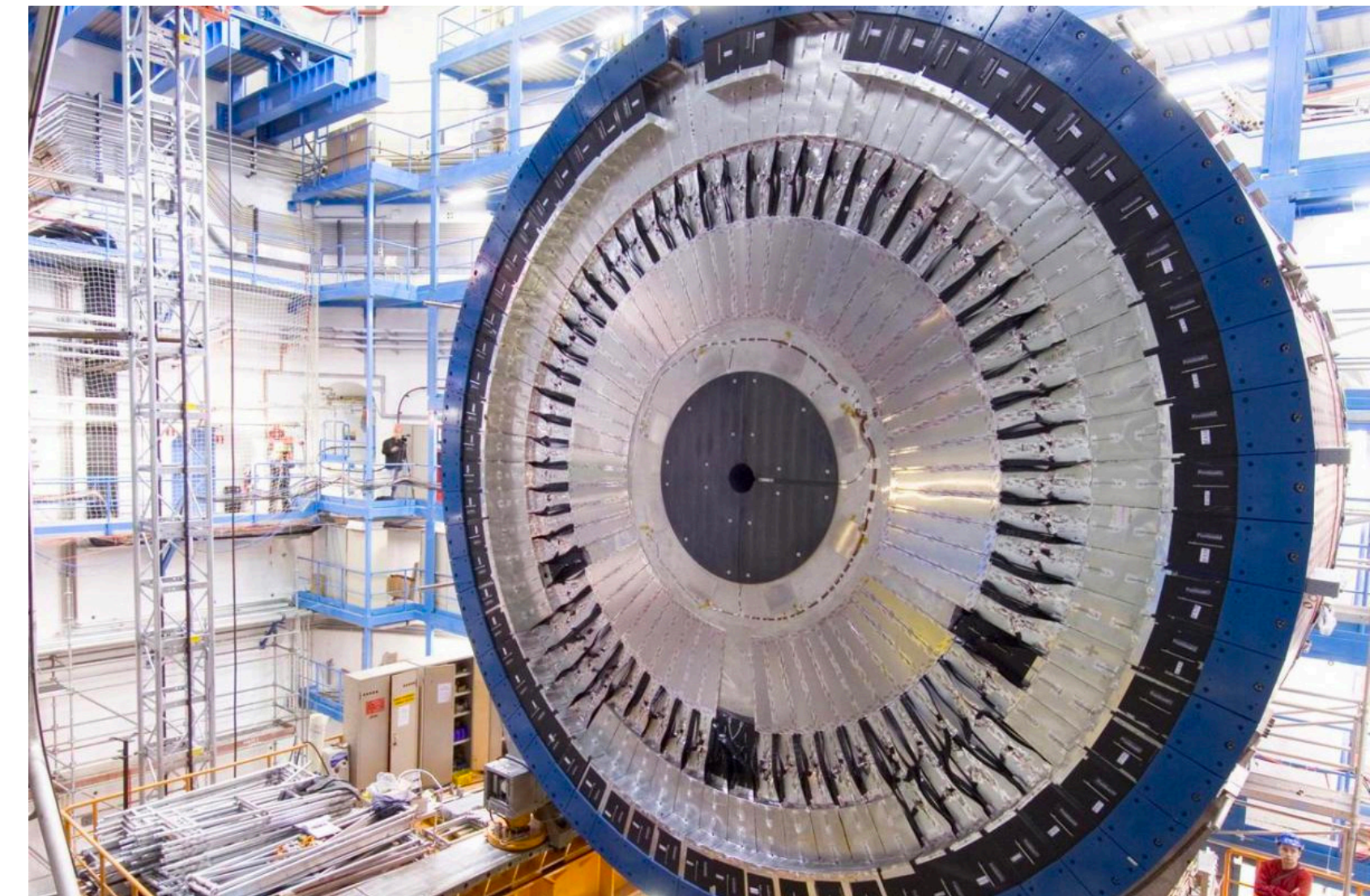
# ATLAS Detector: Calorimeters

- Concept: absorb the energy of a particle in order to measure it. Have sensitive material to look at the shape of a particle shower.
- **EM Calorimeter:** Lead absorbers with liquid argon in between
  - EM showers are usually shorter, more compact
    - Electron mean free path, e.g., is short in lead=> usually can be contained in the EM calorimeter
  - Closer to the interaction point, high granularity
  - Charged particles from EM decay ionize liquid argon to give shape
- **Hadronic Calorimeter:** Steel absorbers with plastic scintillating tiles in between
  - Hadrons rely on nuclear (strong) interactions - mean free path is longer => make it through the EM calorimeter
  - Less precise than EM. Scintillator produces light with ionizing particle, that is then collected

**Electromagnetic  
Calorimeter  
(Liquid Argon):**

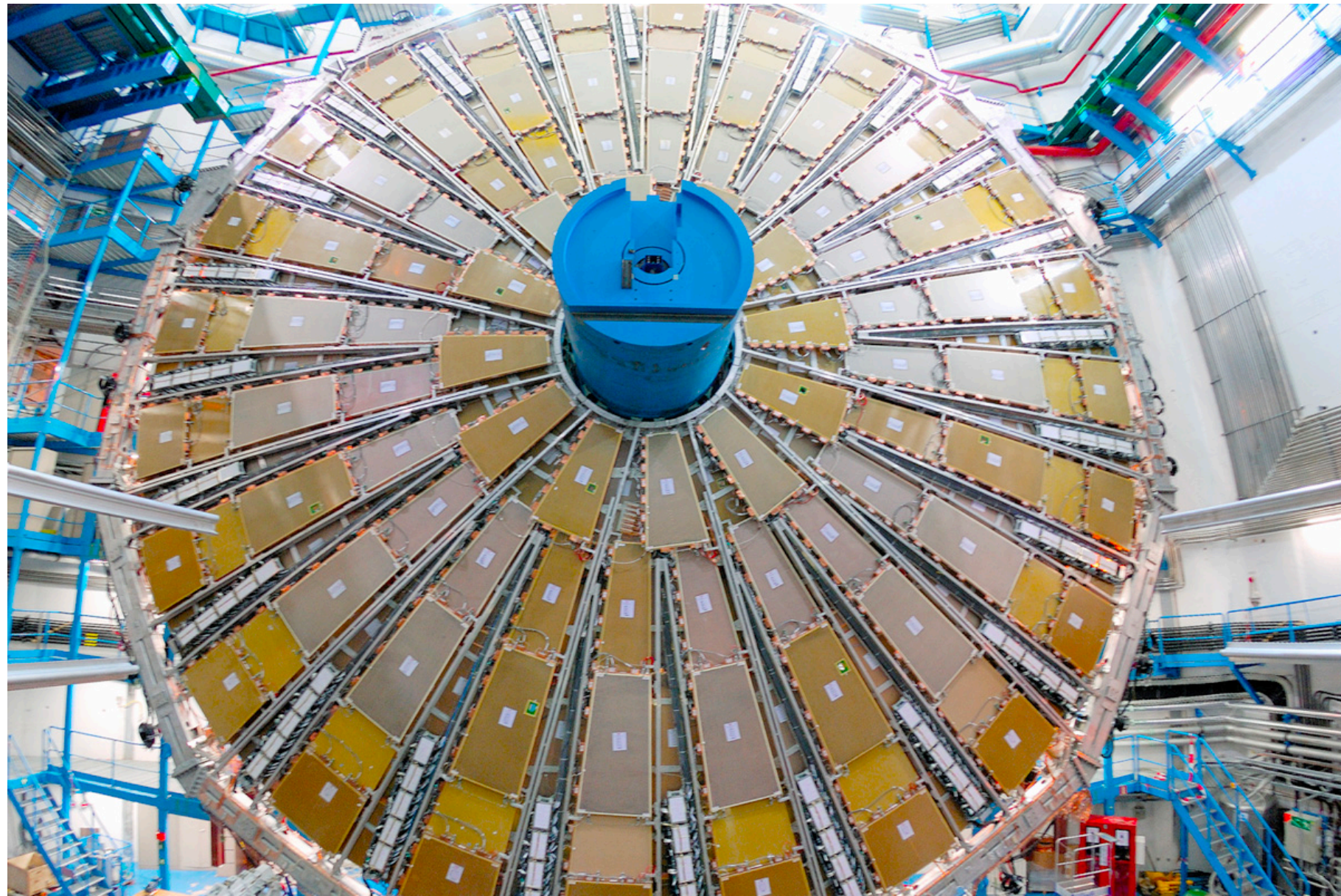


**Hadronic  
Calorimeter  
(Tile):**





# ATLAS Detector: Muon Spectrometer

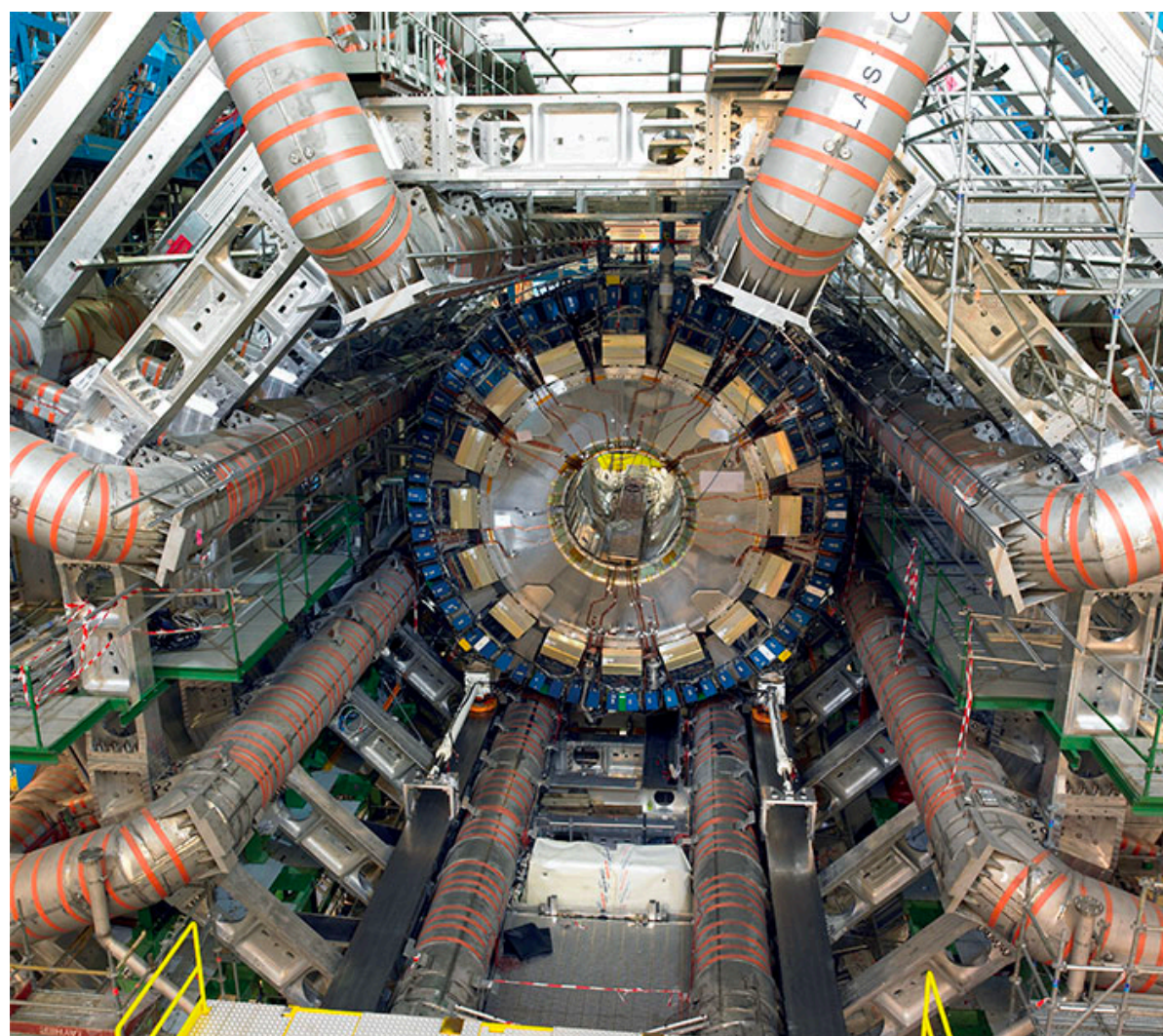
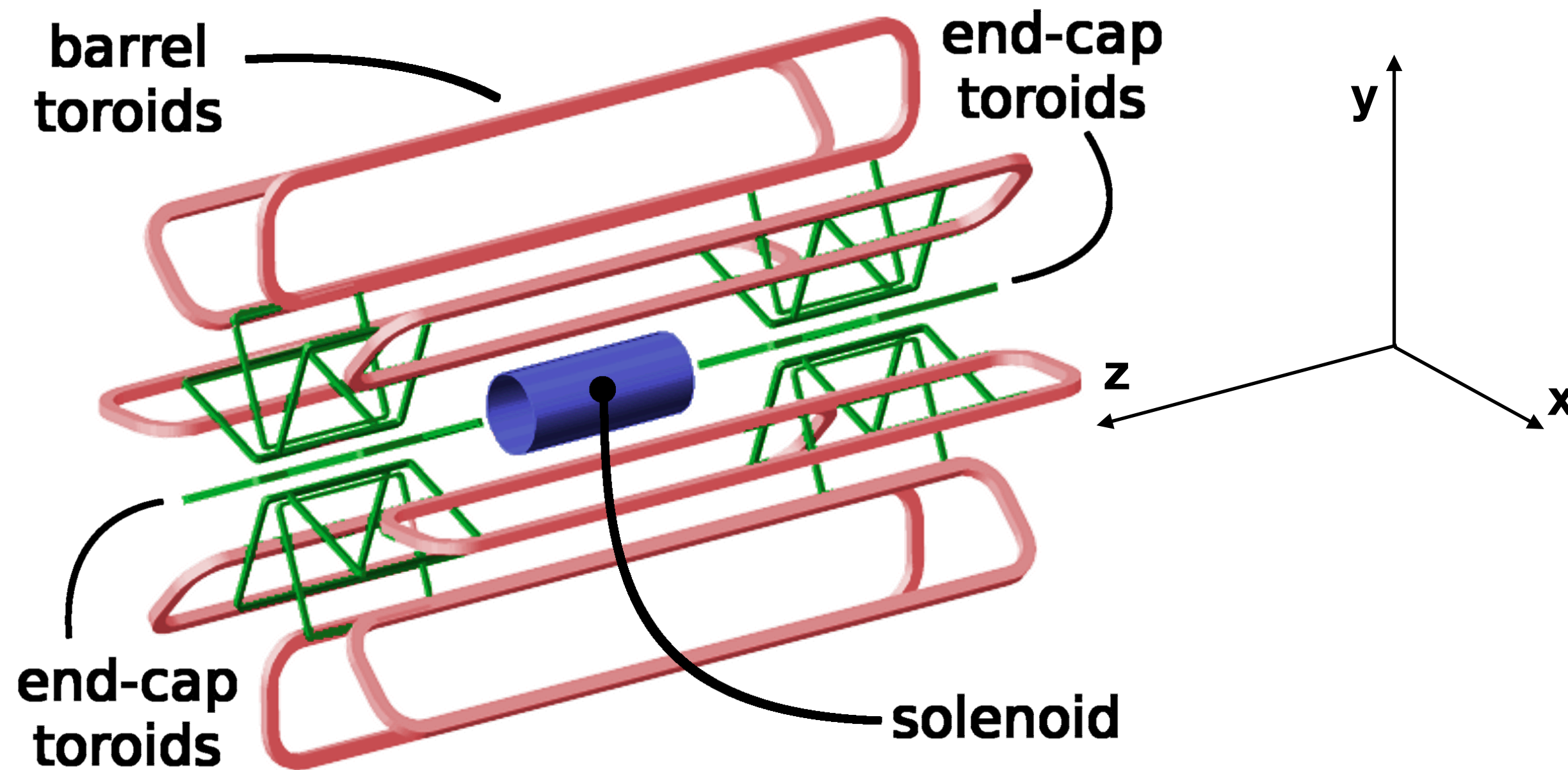


$$m_{\mu} = 106 \text{ MeV}$$
$$m_e = 0.510 \text{ MeV}$$

- Outermost layer of ATLAS
- Muons are heavy and don't interact strongly
  - 200 x heavier than electrons => are not stopped by EM interactions with, e.g., electrons in the absorbers of the calorimeter
  - Don't interact strongly, so hard scattering with nuclei is rare
- Three parts: **Triggering chambers** (detect if muon, non-bending direction coordinate measurement), **drift tubes** (tracking system - measure path/curve of muons), and **toroid magnets** (provide the magnetic field for curve/momentum measurement. Similar concept to solenoid, different configuration)



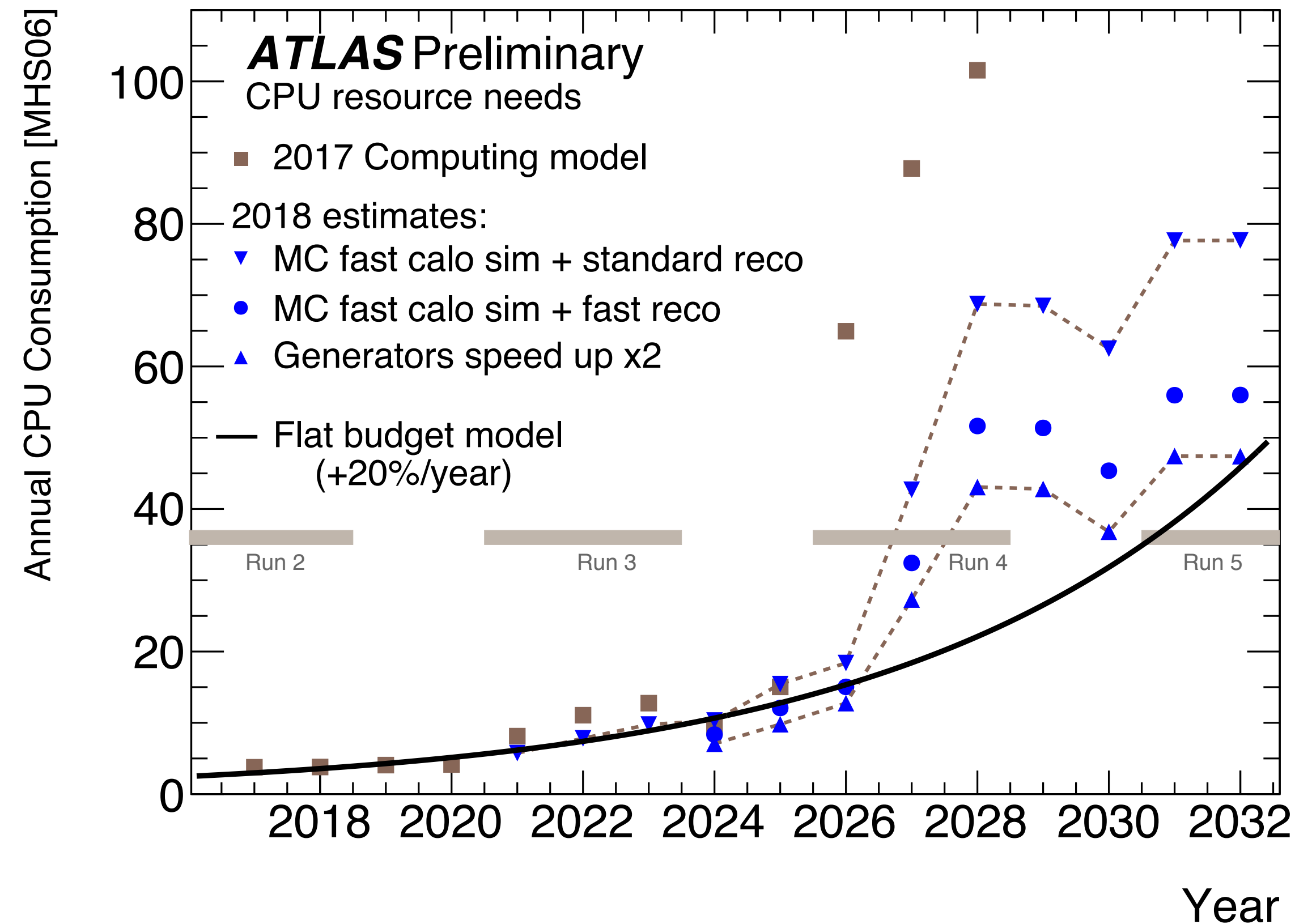
# ATLAS Detector: More on Magnets



- Particles come from the interaction point ~ radially
- Solenoid: Magnetic field along z-axis
  - => particles bent in x-y plane (e.g. s6)
- Toroid: magnetic field ~circle in x-y plane around beam line
  - => particles bent along the z-axis



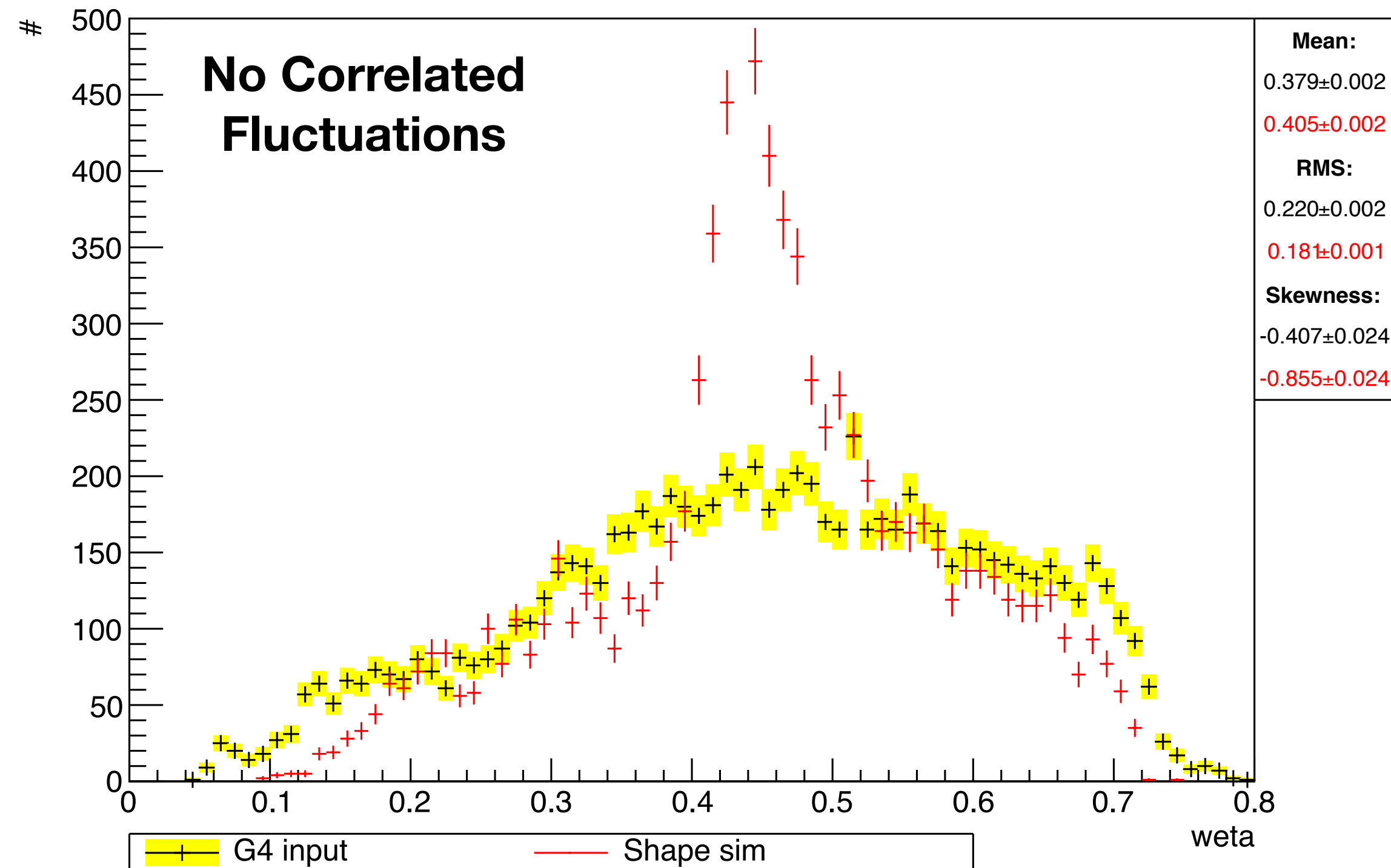
# Need for Fast Simulation



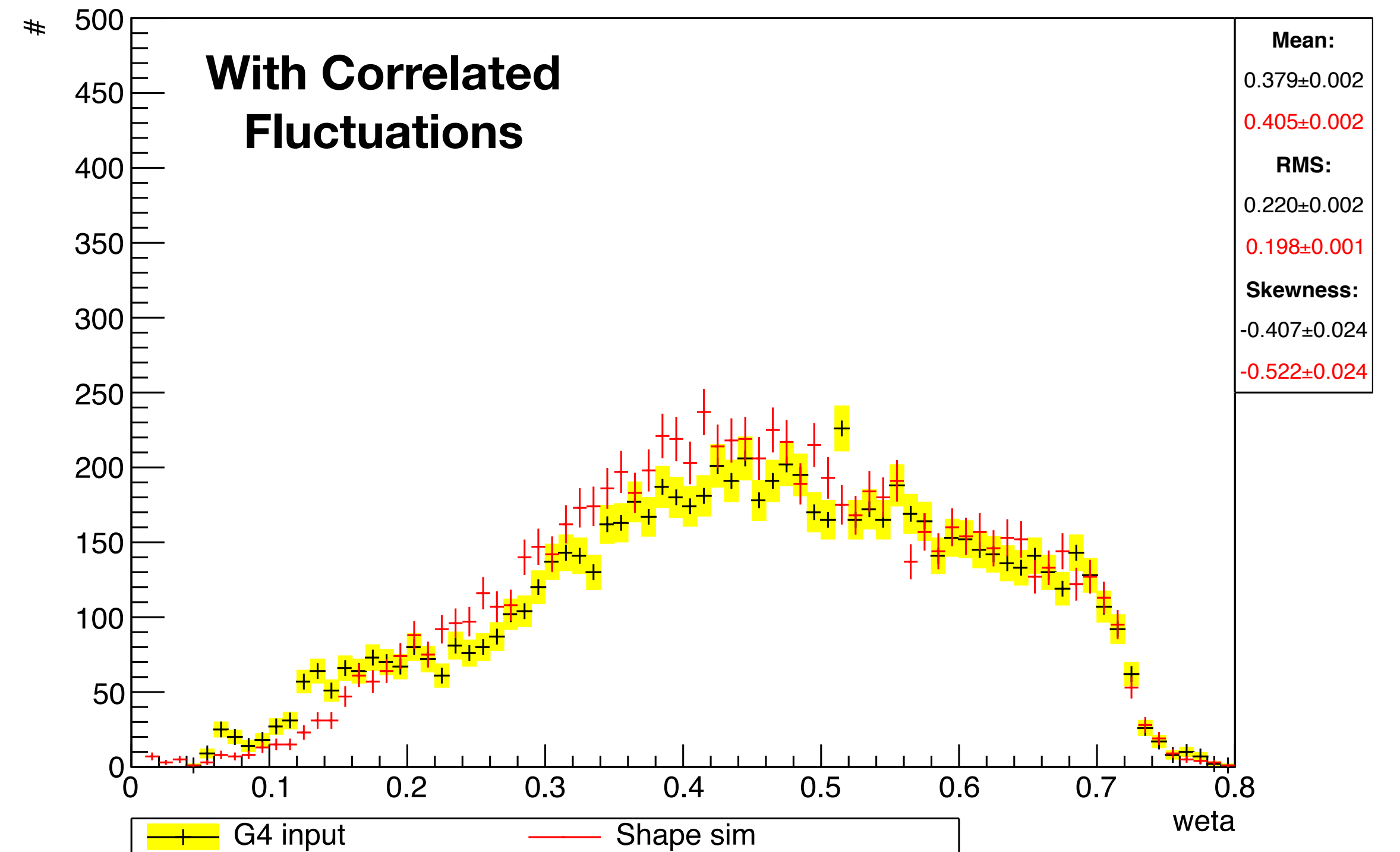
- CPU consumption for ATLAS. Current model is unsustainable, fast simulation improves the situation substantially

# Layer 2 (EMB2): Weta

G4 input and Shape sim : weta pion, E=65536 MeV,  $0.20 < \eta < 0.25$ , sample=2, all pca



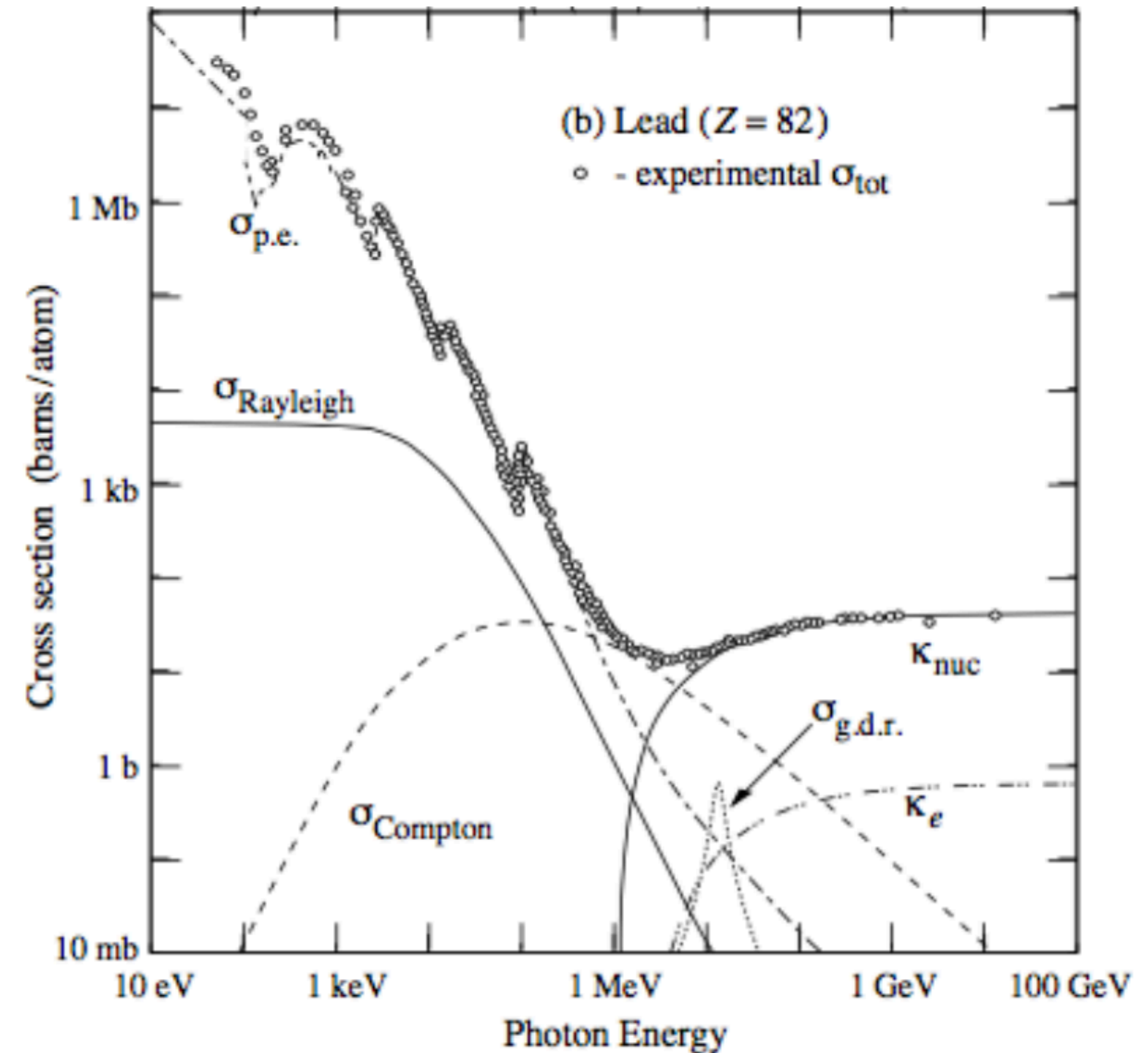
G4 input and Shape sim : weta pion, E=65536 MeV,  $0.20 < \eta < 0.25$ , sample=2, all pca



- Large peak present in shape sim without correlated fluctuations. This disappears with them - much better agreement!

# EM Showering

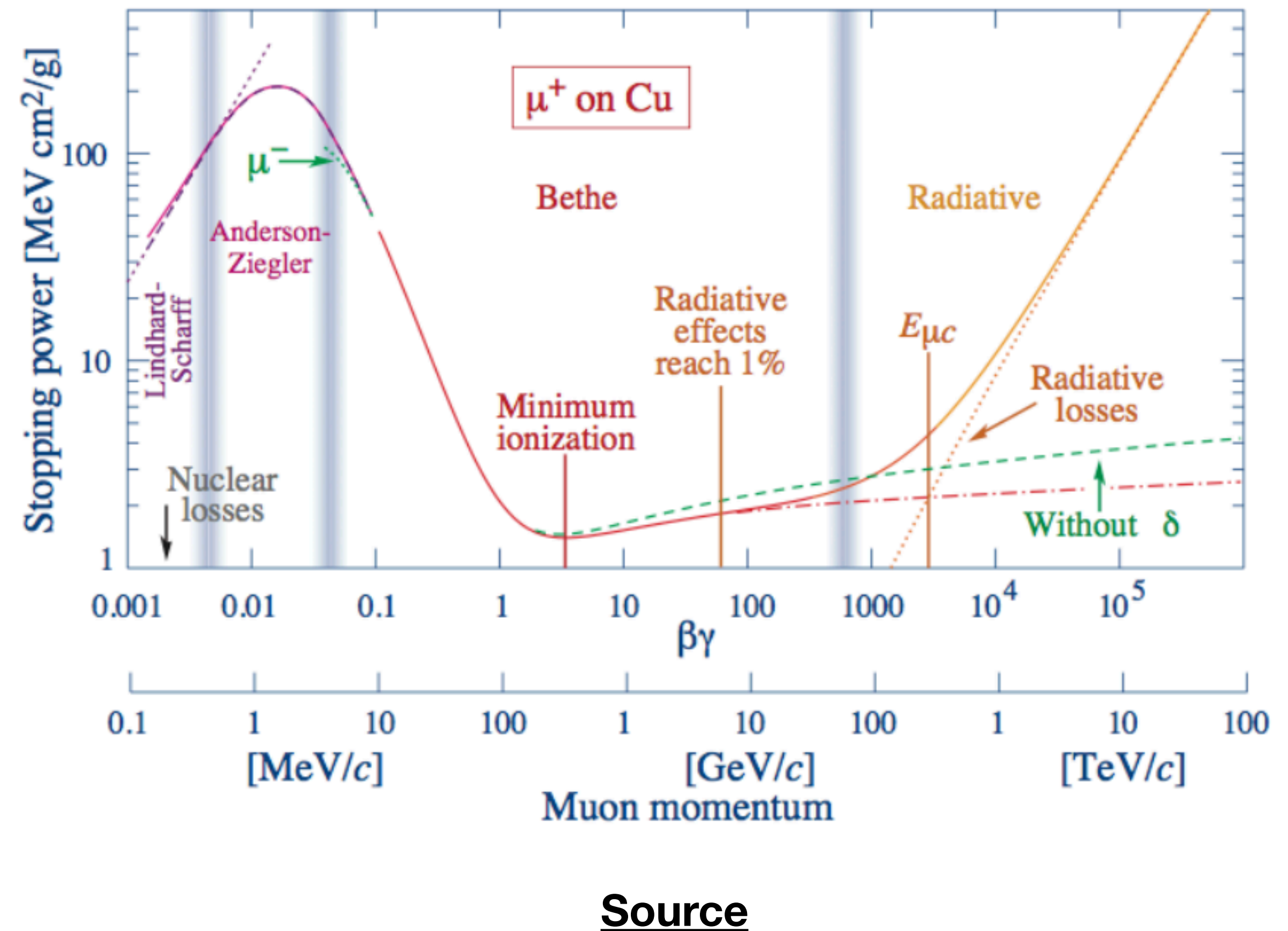
- EM showers: mostly due to
  - Bremsstrahlung (electron): high energy electron emits a photon with some (potentially significant) amount of energy
    - Due to scatter off of field of heavy nucleus
  - and pair production (photon)
    - Energy split in production of electron-positron pair
- Cross section for photon to scatter is quite large for lead<sup>1</sup>



Source

# Muons and EM Showers

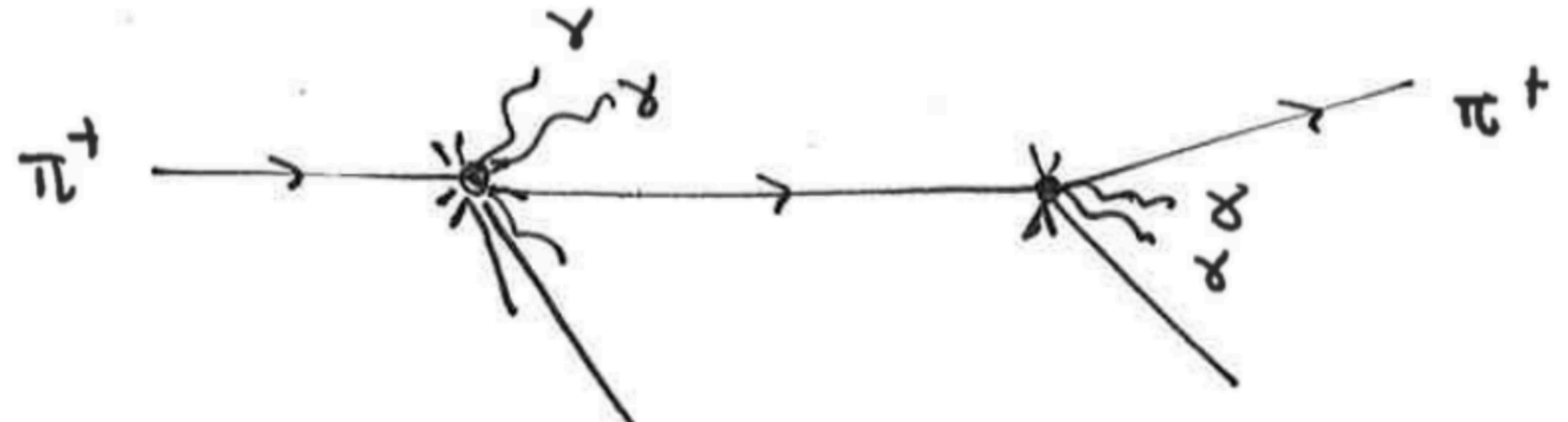
- For heavier particles (muons) radiative losses don't contribute as much
- See in copper on right - radiative losses don't contribute until high energy
- Coulomb scattering from a nucleus can change particle direction





# Hadronic Showers

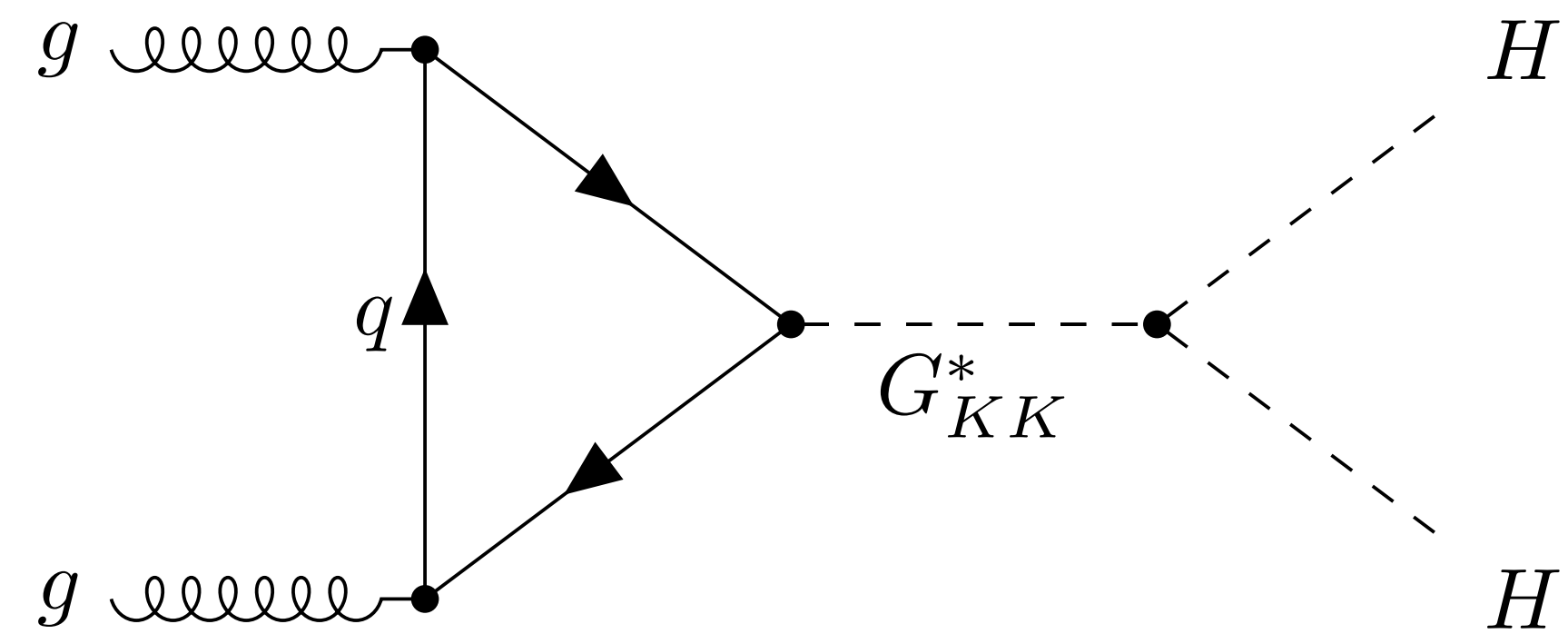
- Hadrons can interact strongly with atomic nuclei
- More complex because they involve a wider variety of processes with different length scales
- Consider, e.g.,  $\pi^+$ :
  - Scatter creates, e.g.,  $\pi^0$ ,  $\pi^+$ ,  $\pi^-$
  - $\pi^0$  decays very quickly to two photons, which then shower
  - $\pi^+$ ,  $\pi^-$  are longer lived, and may continue for some distance (interaction length)



Source

# Resonant Searches: Spin 2

- Spin 2 Randall-Sundrum Kaluza Klein Graviton
  - Graviton arising from a warped extra dimension
  - Decay width to HH is a function of  $c = k/\bar{M}_{Pl}$ 
    - $k$  is the curvature of the warped extra dimension
    - $\bar{M}_{Pl} = 2.4 \times 10^{18}$  GeV is the reduced Planck mass
  - Consider here  $c=1.0, 2.0$
  - Model beginning to be disfavored by the community - much of the parameter space is already excluded



# SM Higgs Mechanism

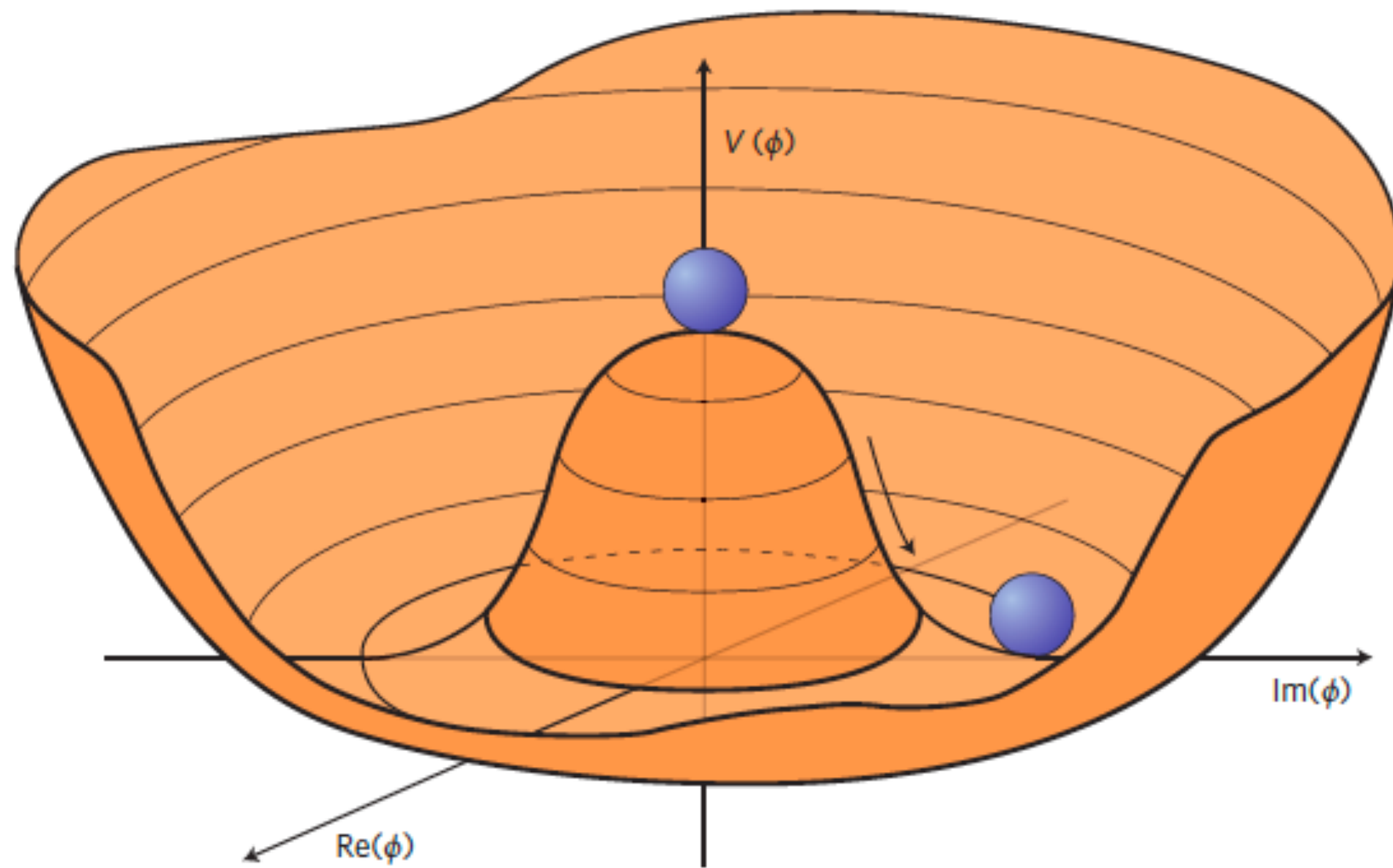


Illustration of the Higgs potential in a U(1) model. Minima are a circle at the bottom of the hat. Choosing one point spontaneously breaks the symmetry [ref]

SU(2) x U(1) gives 4 vector bosons,  $A^1, A^2, A^3, B$

**Higgs Potential:**  $V(\phi) = -\mu^2\phi^2 + \lambda\phi^4$

**Minimum satisfies**  $0 = -2\mu^2\phi + 4\lambda\phi|\phi|^2$

$$\implies |\phi|^2 = \frac{\mu^2}{2\lambda}$$

**Define**  $v = \sqrt{2}\langle|\phi|\rangle = \frac{\mu}{2\lambda}$

**spontaneously breaks SU(2) x U(1) symmetry.**

**Minima form a sphere in 4d space (Higgs doublet => 4 degrees of freedom). All minima equivalent by SU(2) rotation.**

**Look at vacuum state with**  $\langle\phi\rangle = \begin{pmatrix} 0 \\ v/\sqrt{2} \end{pmatrix}$

**Expanding around this gives**  $\phi(x) = \begin{pmatrix} \pi^+(x) \\ (v + h(x) + i\pi^3(x))/\sqrt{2} \end{pmatrix}$

# SM Higgs Mechanism

For  $\phi(x) = \begin{pmatrix} \pi^+(x) \\ (v + h(x) + i\pi^3(x))/\sqrt{2} \end{pmatrix}$ ,  $\pi^+ = (\pi^1 + i\pi^2)/\sqrt{2}$  and  $\pi^3$  are

Goldstone bosons. We can set these to 0 by an SU(2) gauge transformation, leaving a real valued scalar field  $h(x)$ , the field of the Higgs boson

Covariant derivative on Fermions:  $D_\mu \Psi = (\partial_\mu - igA_\mu^a I^a - ig' B_\mu Y) \Psi$

Apply to the Higgs field. Get terms:  $(\frac{gv}{2})^2 W_\mu^+ W^{\mu-} = m_W^2 W_\mu^+ W^{\mu-}$   $W^\pm = \frac{1}{\sqrt{2}}(A_\mu^1 \mp iA_\mu^2)$

$$c_w = \cos \theta_w = \frac{g}{\sqrt{g^2 + g'^2}}, \quad s_w = \sin \theta_w = \frac{g'}{\sqrt{g^2 + g'^2}} \quad Z_\mu = c_w A_\mu^3 - s_w B_\mu \quad m_Z^2 = \frac{(g^2 + g'^2)v^2}{4}$$

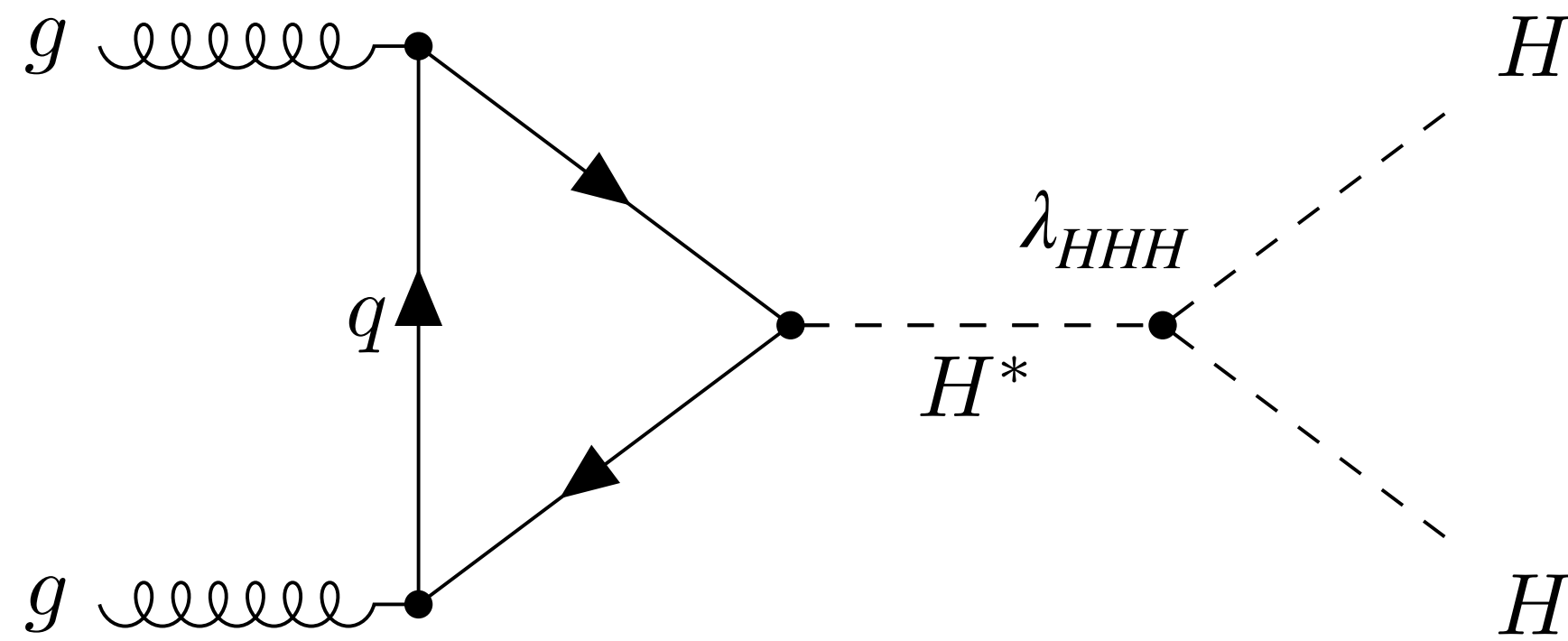
$$A_\mu = s_w A_\mu^3 + c_w B_\mu$$

$A_\mu$  remains massless - identify with the photon

Source



# Non-resonant HH



$$m_H^2 = 2\lambda v^2 \approx 125 \text{ GeV}$$

$$v = \frac{\mu}{\sqrt{\lambda}} \approx 246 \text{ GeV}$$

$$V(\phi) = -\mu^2\phi^2 + \lambda\phi^4$$

This is the most general, renormalizable potential for a single Higgs doublet consistent with electroweak symmetry (SU(2) x U(1))

[M] = 4  
 [phi] = 1  
 [mu] = 1  
 [lambda] = 0  
 A phi^5 term would have a coupling with negative dimension

Expand about minimum:  $V(\phi) \rightarrow V(v + h)$

$$V = V_0 + \frac{1}{2}(-\mu^2 + 3\lambda v^2)h^2 + \lambda v h^3 + \frac{\lambda}{4}h^4$$

$$= V_0 + \lambda v^2 h^2 + \lambda v h^3 + \frac{\lambda}{4}h^4$$

$$= V_0 + \frac{1}{2}m_H^2 h^2 + \frac{m_H^2}{2v} h^3 + \frac{m_H^2}{8v^2} h^4$$

Fermi effective theory/  
 SM:

$$m_W = \frac{gv}{2}$$

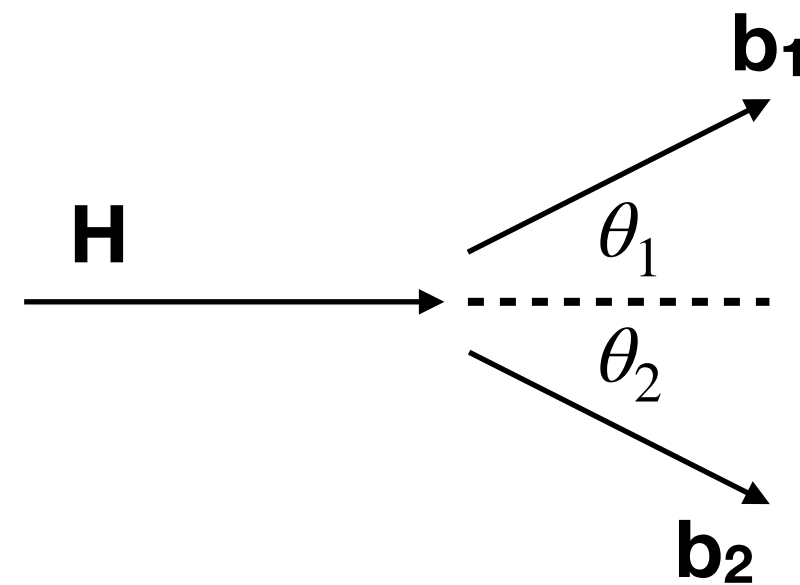
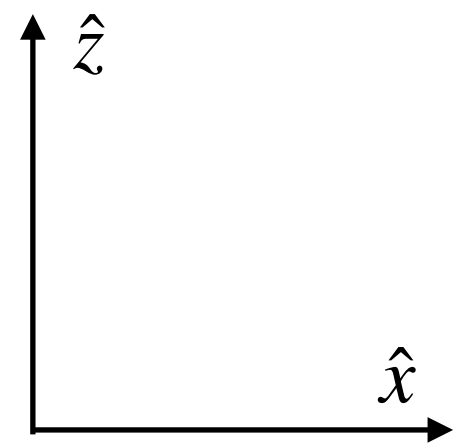
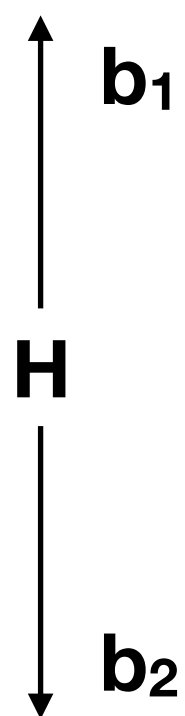
$$\frac{G_F}{\sqrt{2}} = \frac{g^2}{8m_W^2} \implies G_F = \frac{1}{\sqrt{2}v^2} \implies v = \frac{1}{\sqrt{\sqrt{2}G_F}}$$

$$G_F \approx 1.166 \times 10^{-5} \text{ GeV}^{-2}$$

Best determination from muon lifetime

$$\Gamma_\mu = \frac{1}{\tau_\mu} = \frac{G_F^2 m_\mu^5}{192\pi^3}$$

# 1 → 2 ΔR Relation



$$\tan \theta_1 = \frac{p_{1x}}{p_{1z}} = \frac{\sqrt{m_H^2 - 4m_b^2}}{P}$$

$$\tan \theta_2 = \frac{p_{2x}}{p_{2z}} = \frac{\sqrt{m_H^2 - 4m_b^2}}{P}$$

$$\theta_1 + \theta_2 = 2 \arctan\left(\frac{\sqrt{m_H^2 - 4m_b^2}}{P}\right) \approx 2 \frac{\sqrt{m_H^2 - 4m_b^2}}{P} \approx \frac{2m_H}{P}$$

$$m_b \ll m_H$$

## Higgs Rest Frame

$$E_H^0 = m_H$$

$$\vec{p}_1^0 = p_1^0 \hat{z} = p_2^0 \hat{z} = -\vec{p}_2^0$$

$$\vec{p}_1^0 = -\vec{p}_2^0 \implies (\vec{p}_1^0)^2 = (\vec{p}_2^0)^2 \equiv (\vec{p}_b^0)^2$$

$$m_1 = m_2 = m_b$$

$$E_b^0 \equiv E_1^0 = E_2^0 = \sqrt{(\vec{p}_b^0)^2 + m_b^2} = \frac{m_H}{2}$$

$$p_b^0 = \sqrt{E_b^0 - m_b^2} = \sqrt{\frac{m_H^2}{4} - m_b^2} = \frac{1}{2} \sqrt{m_H^2 - 4m_b^2}$$

## Boost

$$\vec{P}_H = P \hat{x}$$

$$P = \gamma m_H \implies v = \frac{P}{E_H}$$

$$E_H = \gamma m_H \implies \gamma = \frac{E_H}{m_H}$$

$$p_{1z} = p_{1z}^0 = p_{2z}^0 = p_{2z} = \frac{1}{2} \sqrt{m_H^2 - 4m_b^2}$$

$$p_{1x} = \gamma(p_{1x}^0 + vE_1^0) = \gamma v \frac{m_H}{2} = \frac{P}{2}$$

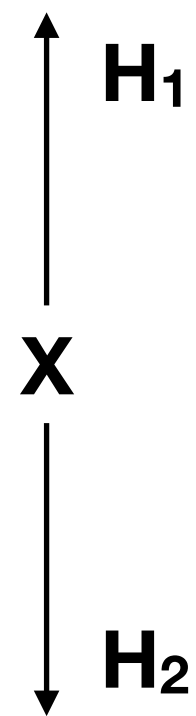
$$p_{2x} = \gamma(p_{2x}^0 + vE_2^0) = \gamma v \frac{m_H}{2} = \frac{P}{2}$$

$$\theta_1 + \theta_2 \approx \Delta R$$

$$P \approx p_{T,H}$$

$$\Delta R_{bb} \approx \frac{2m_H}{p_{T,H}}$$

# 1 → 2 ΔR Relation



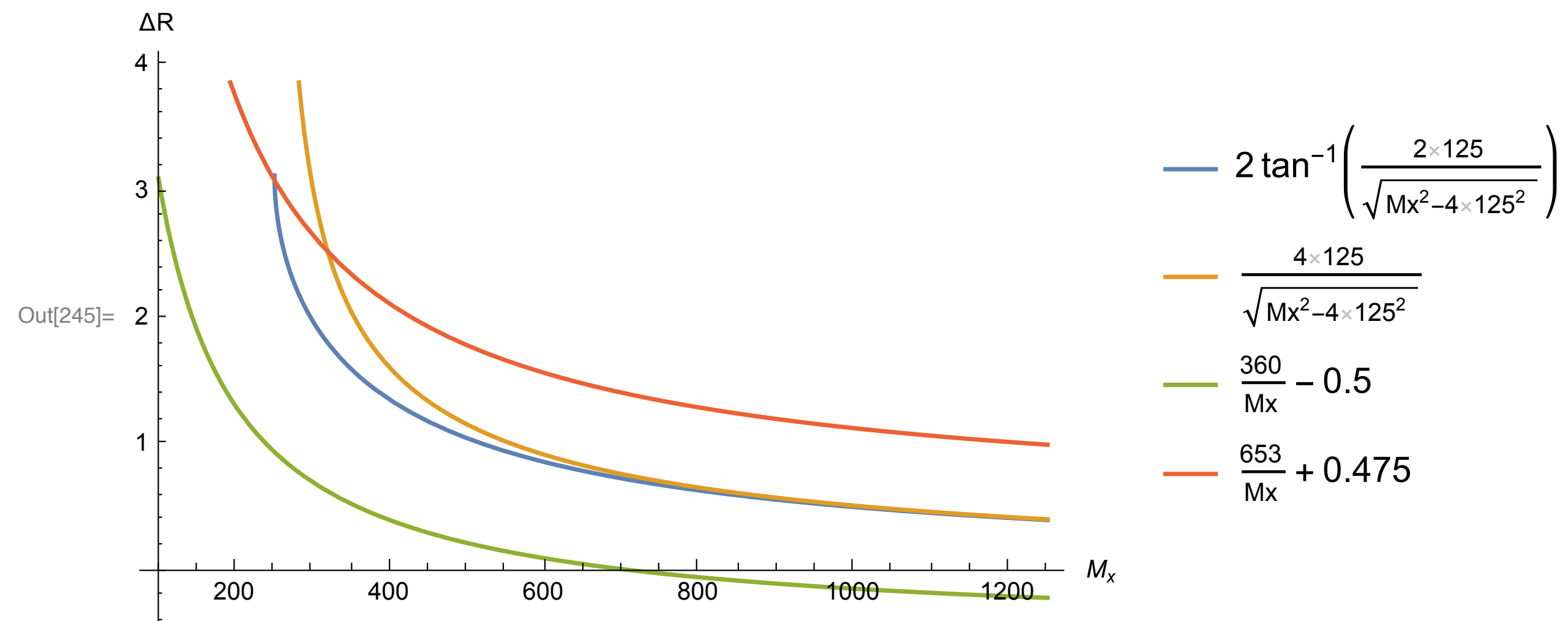
$$E_X = m_X$$

$$E_H \equiv E_{H_1} = E_{H_2} = \frac{m_X}{2}$$

$$p_H \equiv p_{H_1} = p_{H_2} = \sqrt{E_X^2 - m_H^2} = \frac{1}{2} \sqrt{m_X^2 - 4m_H^2}$$

In terms of resonance mass, X  
produced roughly at rest, Higgses  
are roughly back to back

```
In[245]:= Plot[{2 * ArcTan[2 * 125 / Sqrt[Mx^2 - 4 * 125^2]],
  4 * 125 / Sqrt[Mx^2 - 4 * 125^2], 360 / Mx - 0.5, 653 / Mx + 0.475}, {Mx, 100, 1250},
  AxesLabel -> {Mx, ΔR}, PlotLegends -> LineLegend["Expressions"]]
```



$$\implies \Delta R_{bb} \approx \frac{2m_H}{p_{T,H}} \approx \frac{4m_H}{\sqrt{m_X^2 - 4m_H^2}}$$

or (not Taylor  
series-ing the  
arctan)

$$\Delta R_{bb} \approx 2 \arctan\left(\frac{2m_H}{\sqrt{m_X^2 - 4m_H^2}}\right)$$

# The Analysis: Background Processes

- What can these be? Need processes that result in a final state with 4 b-quarks
  - QCD processes:  $gg \rightarrow 4b$ ,  $2c2b$  e.g.
  - $t\bar{t} \rightarrow bW^+\bar{b}W^-$ 
    - Leptonic  $t\bar{t}$ : e.g.  $W^+ \rightarrow c\bar{b}$ ,  $W^- \rightarrow l^-\bar{\nu}_l \Rightarrow b\bar{b}c\bar{b}$  in the final state, c fakes a b
    - Hadronic  $t\bar{t}$ :
      - e.g.  $W^+ \rightarrow c\bar{s}$ ,  $W^- \rightarrow \bar{c}s \Rightarrow b\bar{b}c\bar{c}$  in the final state, where the c's fake b's
      - or (CKM suppressed)  $W^+ \rightarrow c\bar{b}$ ,  $W^- \rightarrow \bar{c}b \Rightarrow b\bar{b}b\bar{b}$  in the final state
- Other processes ( $ZZ \rightarrow 4b$ , etc.) are expected to have much smaller contributions, as we select the Higgs candidate masses to be close to  $m_H = 125$  GeV



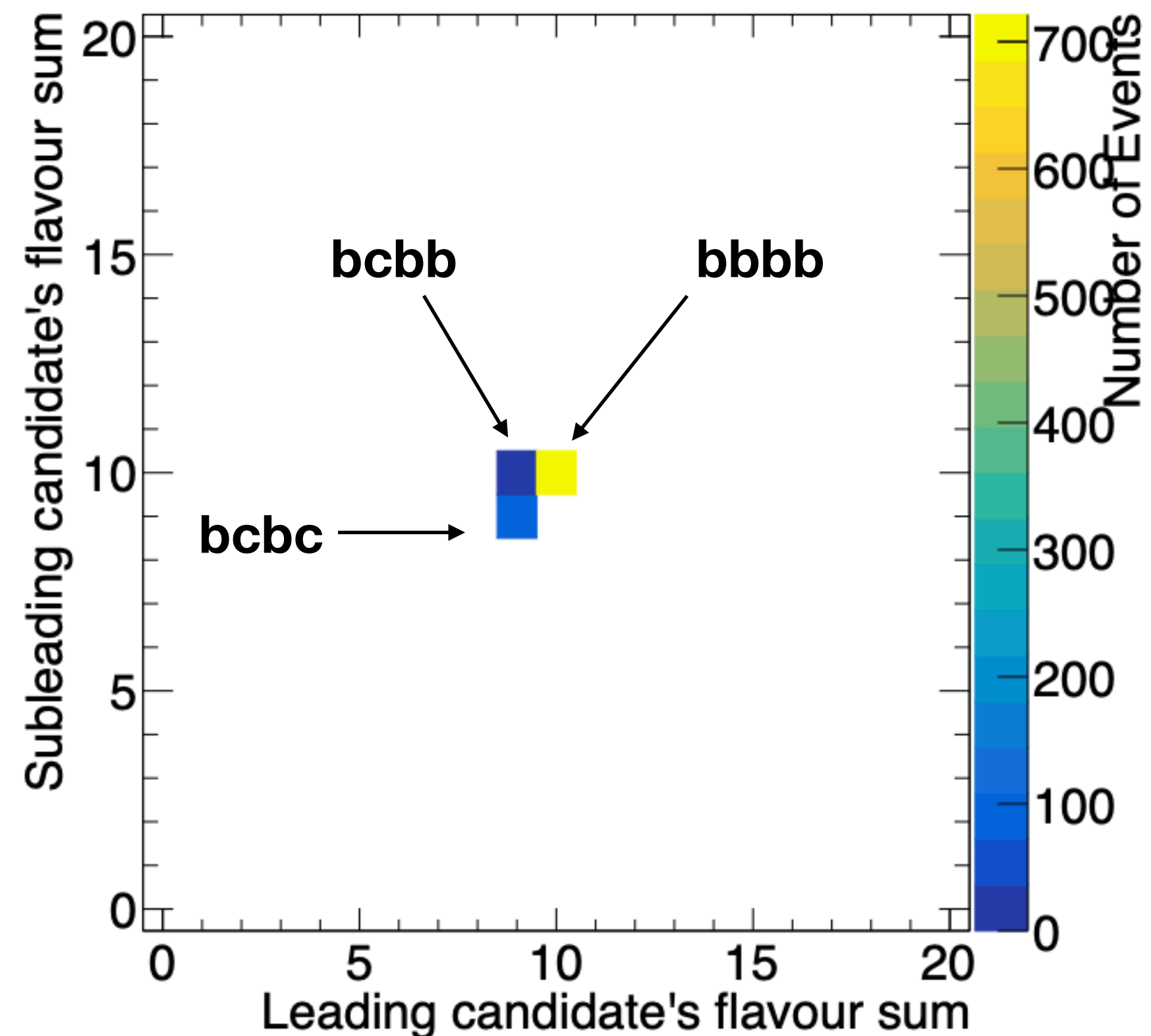
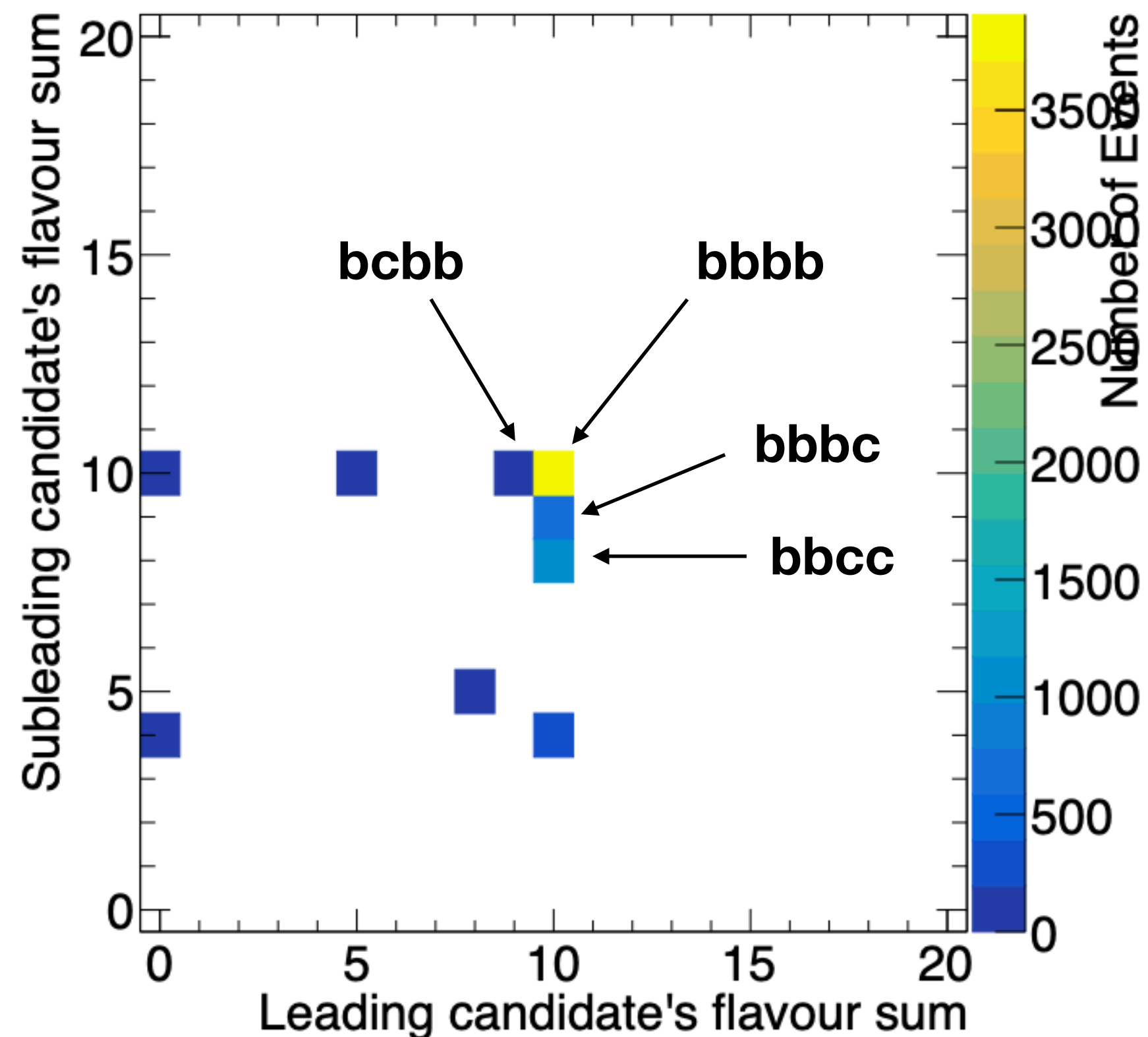
# The Analysis: Background Composition

## JZ4W

Flavor: 0 = light, 4=c, 5=b, 15= $\tau$   
(e.g. 10,10 is bbbb)

### Two-tag

### Four-tag



Some plots and a paper, thanks to David Wardrope

This slice makes biggest contribution (by far) to total background

Resulting from combination of acceptance and cross-section

# Resolved Analysis: Selection and Pairing

- Require 4 b-tagged jets ( $R=0.4$  Anti- $k_t$ ) with  $p_T > 40$  GeV,  $|\eta| < 2.5$

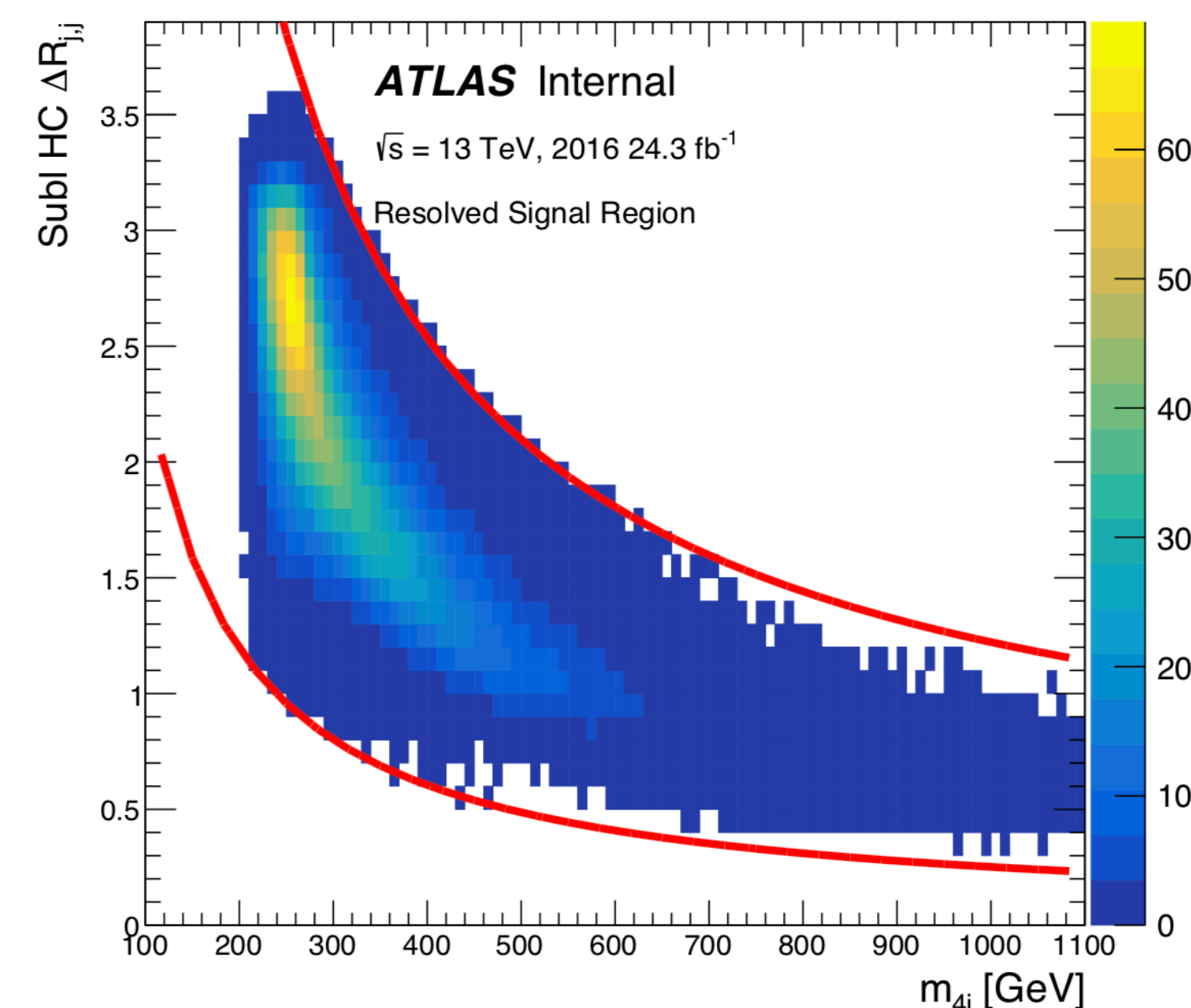
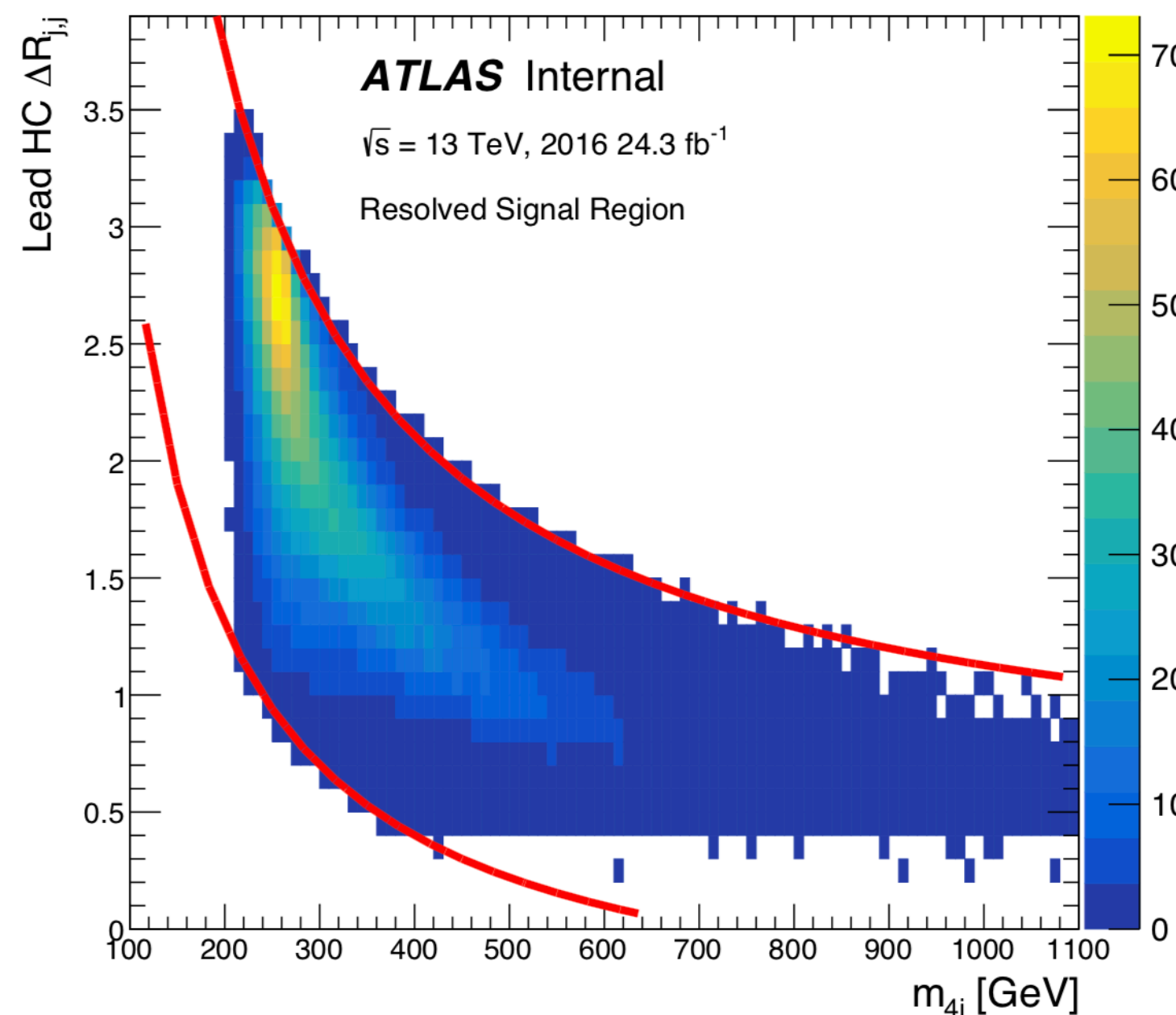
- Need to then pair them up! 3 possibilities

- Not all pairings are consistent with  $HH \rightarrow 4b$

- Angle between the decay products of the Higgs depends on  $m_{4j}$  ( $m_{HH}$ )

- Requirements on the right efficiently reject pairings in which one b-tagged jet is not consistent with coming from a Higgs boson decay

- Pairings which pass this selection are considered “valid”



2016 Multijet after full selection (15/16 analysis). Red lines show bounds on  $\Delta R_{jj}$

$m_{4j} < 1250$  GeV

$$\frac{360 \text{ GeV}}{m_{4j}} - 0.5 < \Delta R_{jj,\text{lead}} < \frac{653 \text{ GeV}}{m_{4j}} + 0.475$$

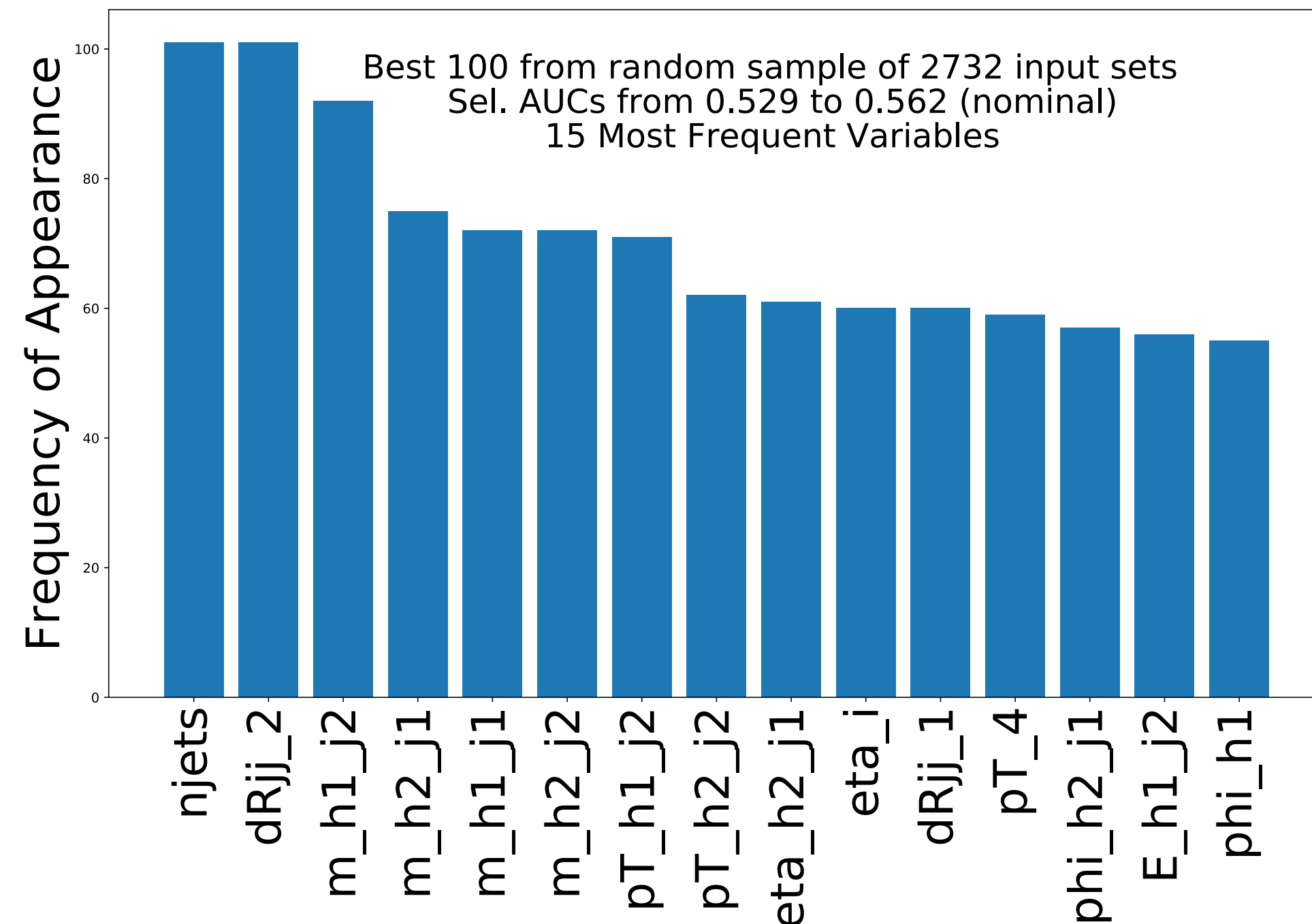
$$\frac{235 \text{ GeV}}{m_{4j}} < \Delta R_{jj,\text{subl}} < \frac{875 \text{ GeV}}{m_{4j}} + 0.35$$

$m_{4j} > 1250$  GeV

$$0 < \Delta R_{jj,\text{lead}} < 1$$

$$0 < \Delta R_{jj,\text{subl}} < 1$$

# Reweighting BDT: Optimization



Frequency of variable appearance in best 100 input sets (of ~3000 sampled). More frequent => likely more important

- Optimization:

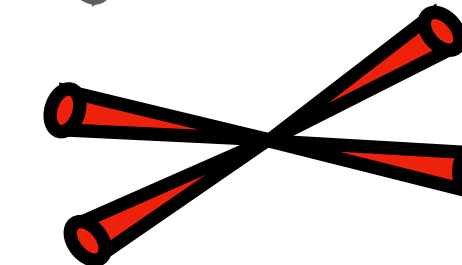
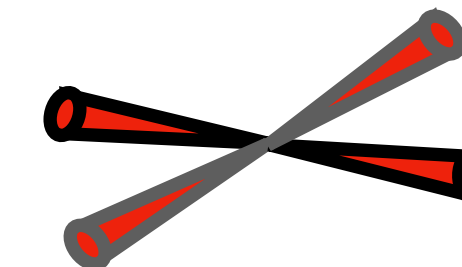
- **Focus:** input variable set. A lot of options!
- **Method:** Random search through possible input sets

$$\sum_{i=1}^{37} \binom{37}{i} = 137,438,953,471$$

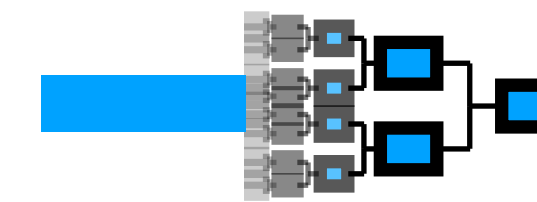
Number of possible input sets given ~37 relevant variables

Metric (Classifier):

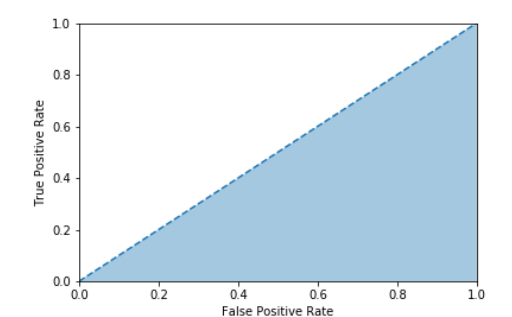
RW 2 tag



4 tag



ROC AUC





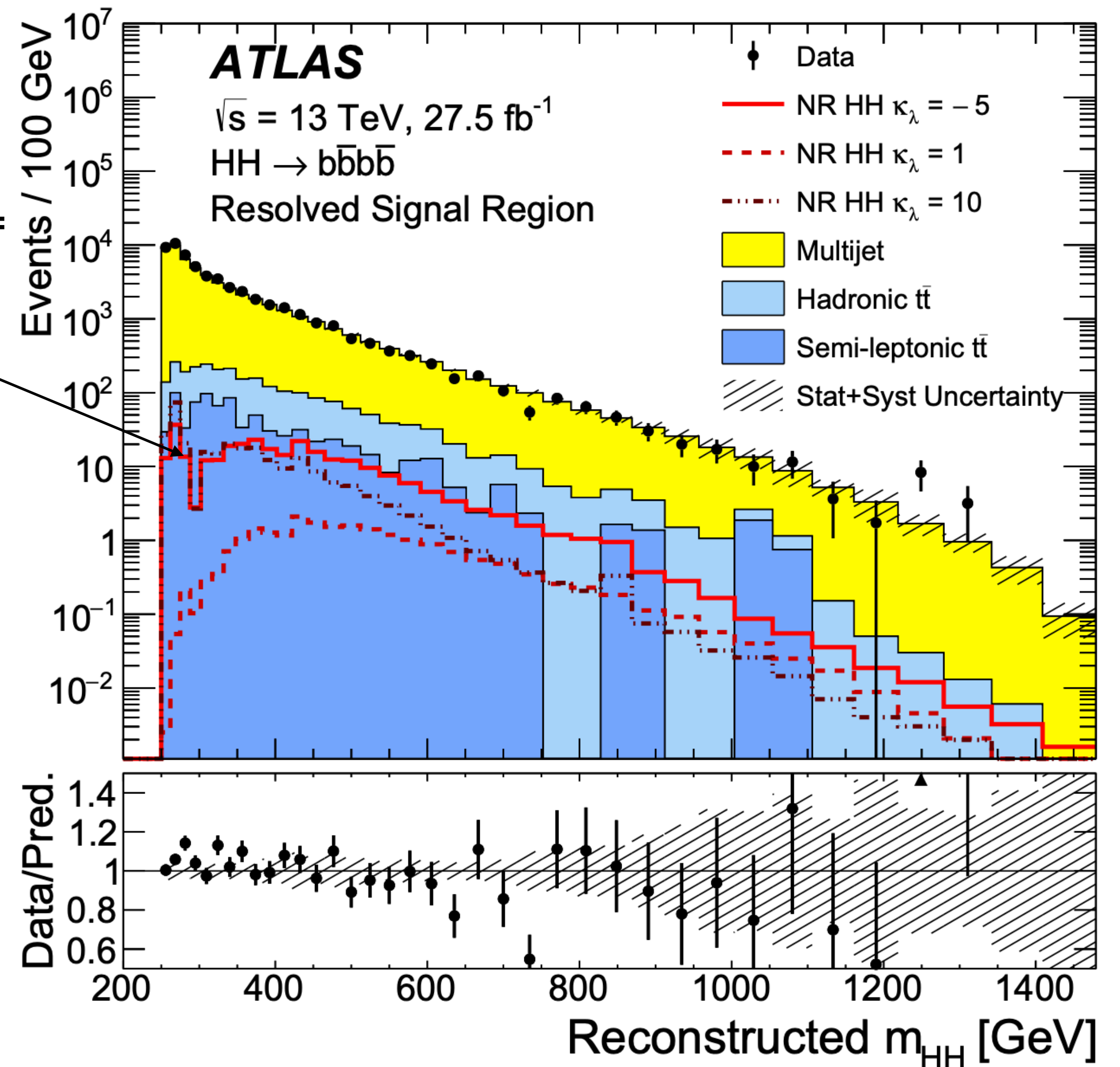
# Non-resonant HH: Beyond the Standard Model

- $\kappa_\lambda$  samples generated by computing the  $m_{HH}$  spectrum for each value of  $\kappa_\lambda$  at the **generator level** (no detector, just physics)

- Binned ratios to the Standard Model value  $m_{HH}$  spectrum are then computed and used to reweight events from a full detector simulation of NLO SM HH samples

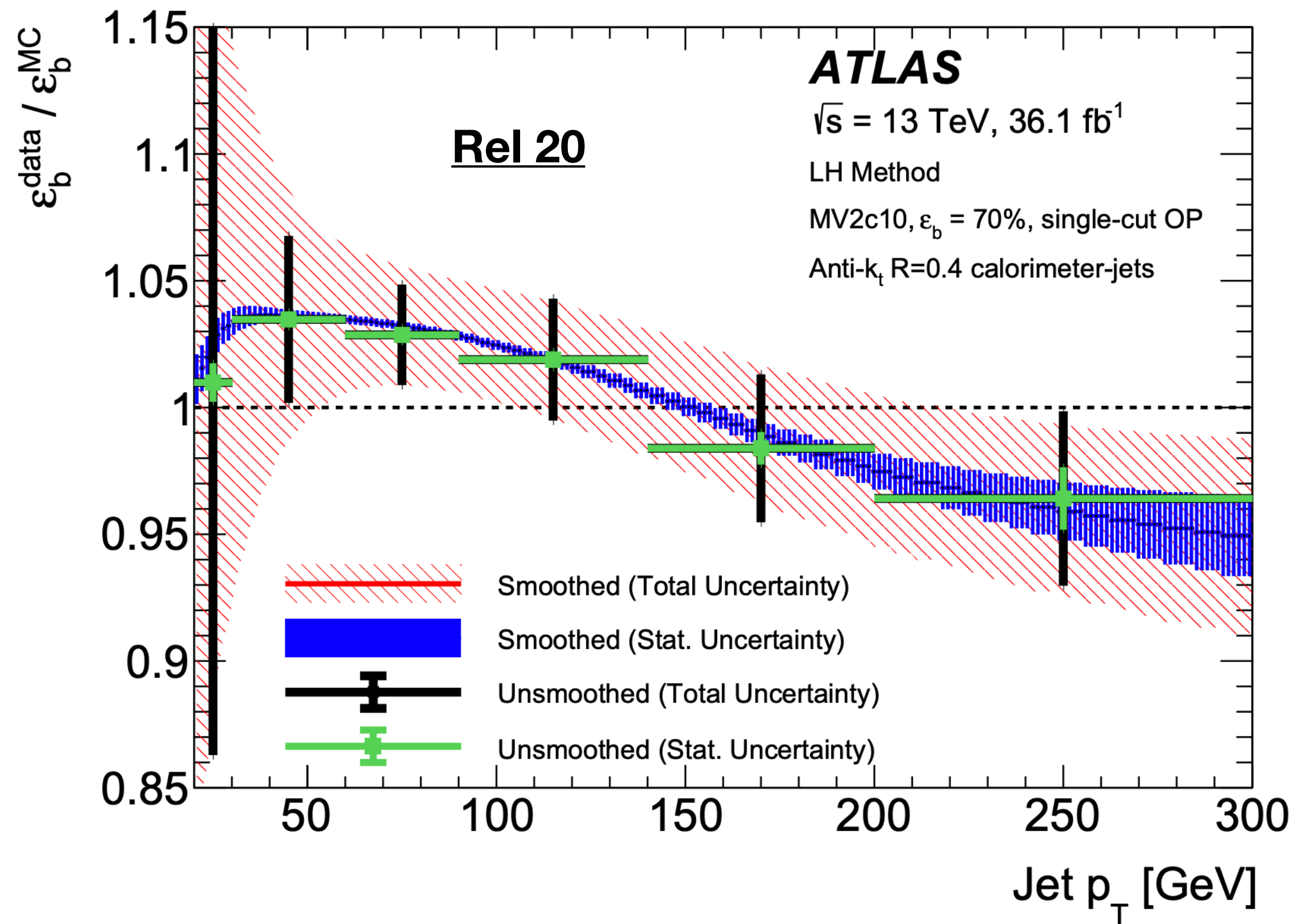
- Thus, statistical fluctuations translate across the samples, resulting in the dip seen on right

Fluctuation in  $\kappa_\lambda = -5$  and  $10$  purely statistical

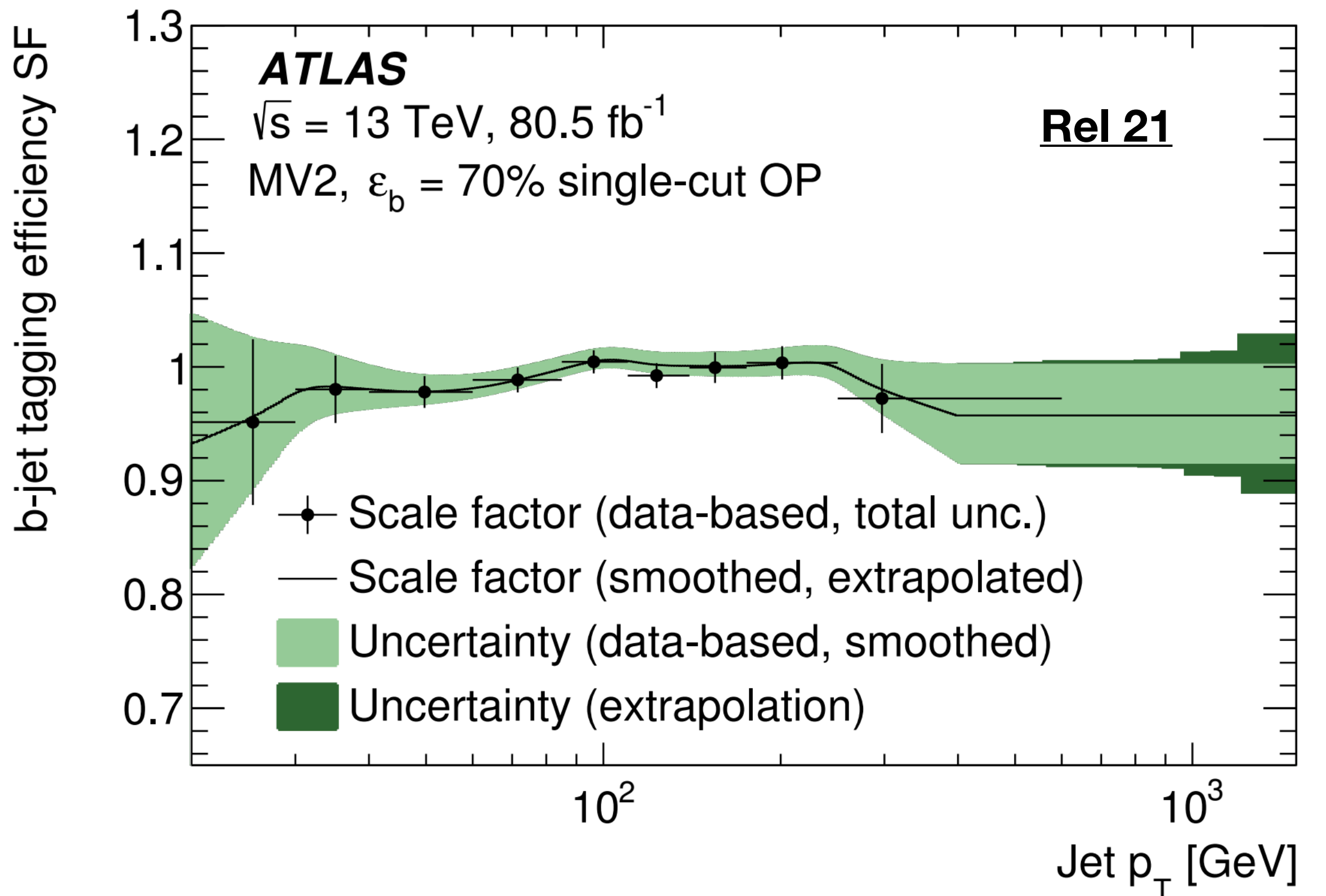




# b-tagging SF's



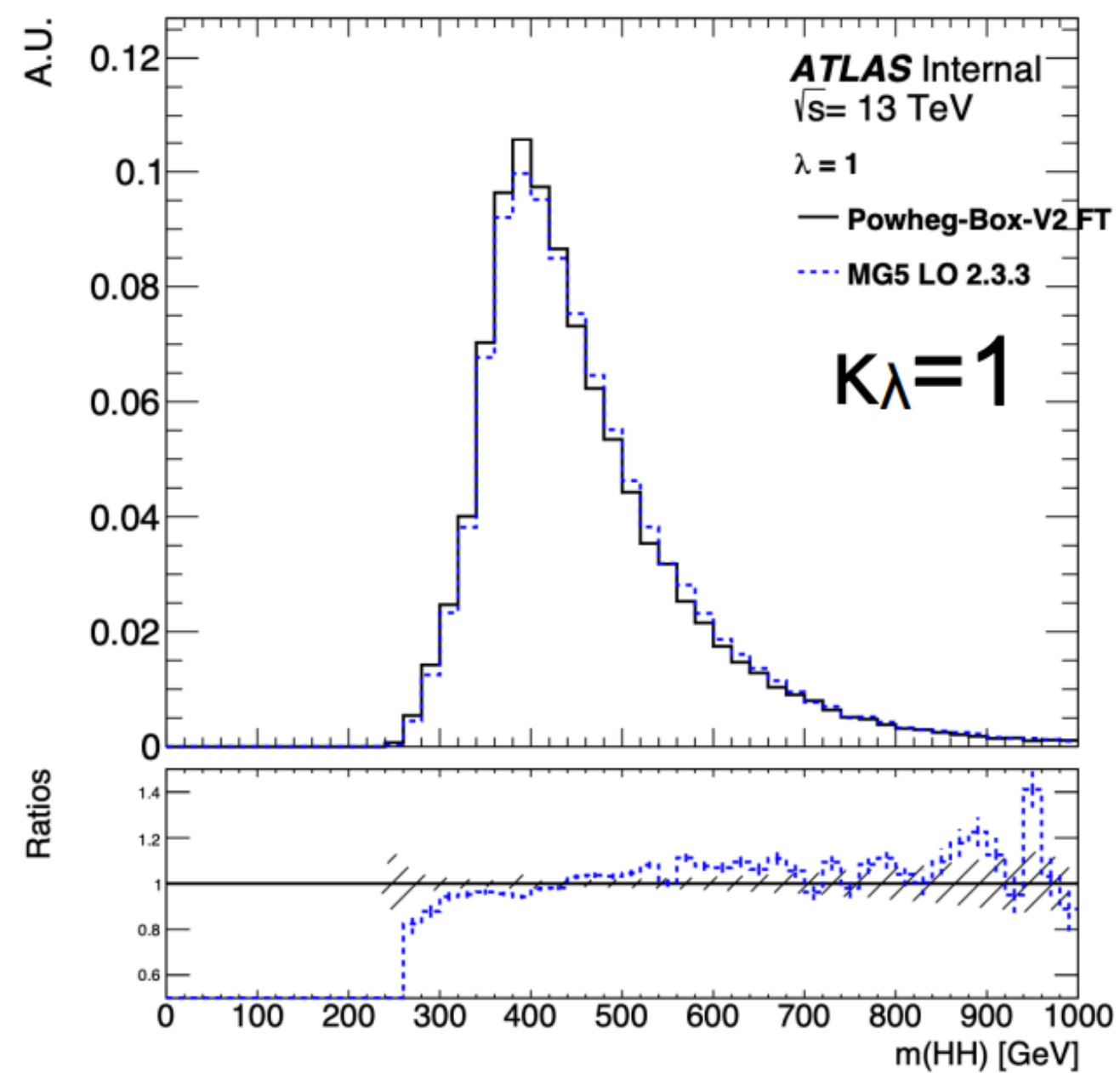
$1.03^4 = 1.12$



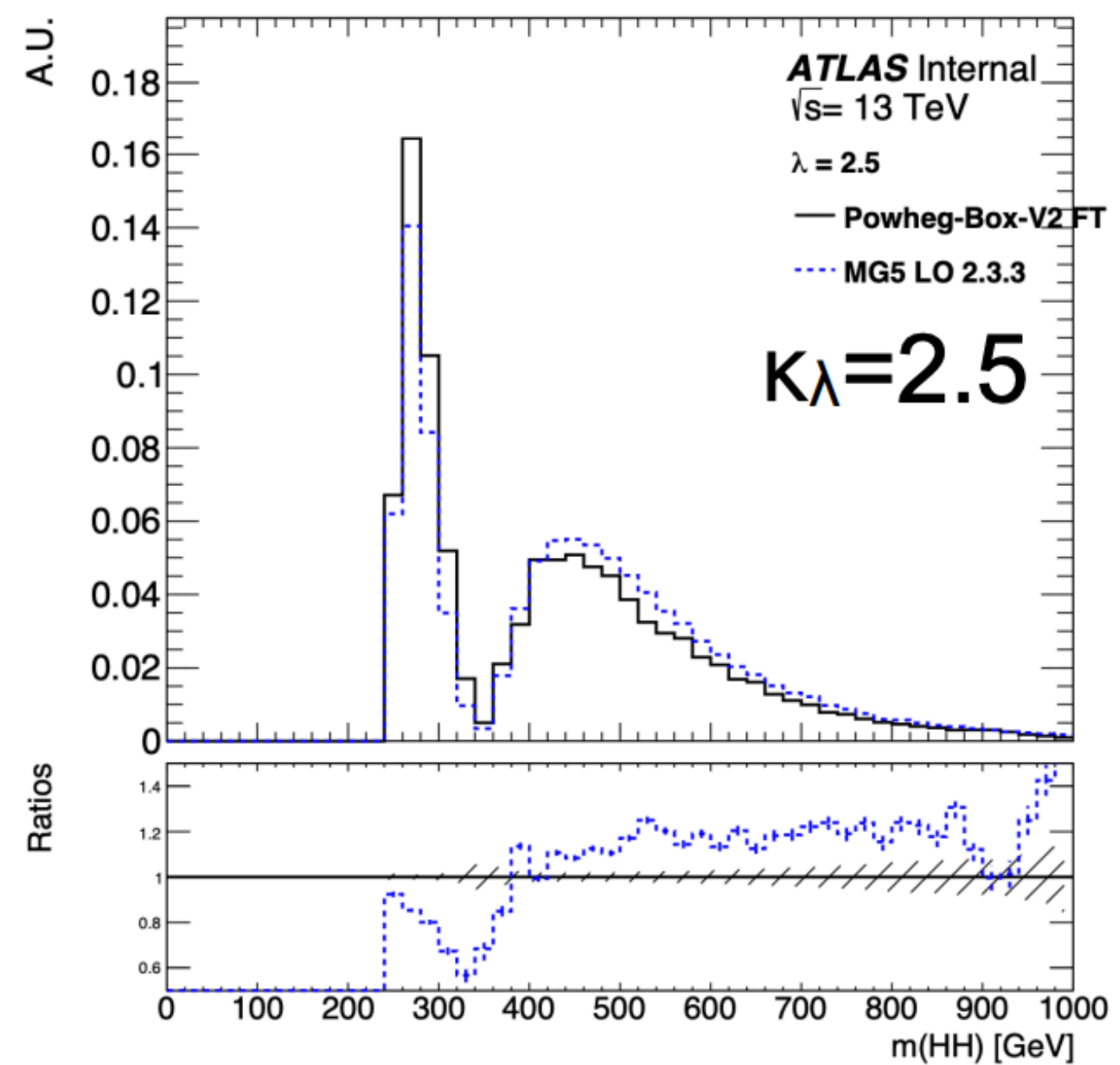
$0.97^4 = 0.89$

Consistent with ~20-25% difference in yields

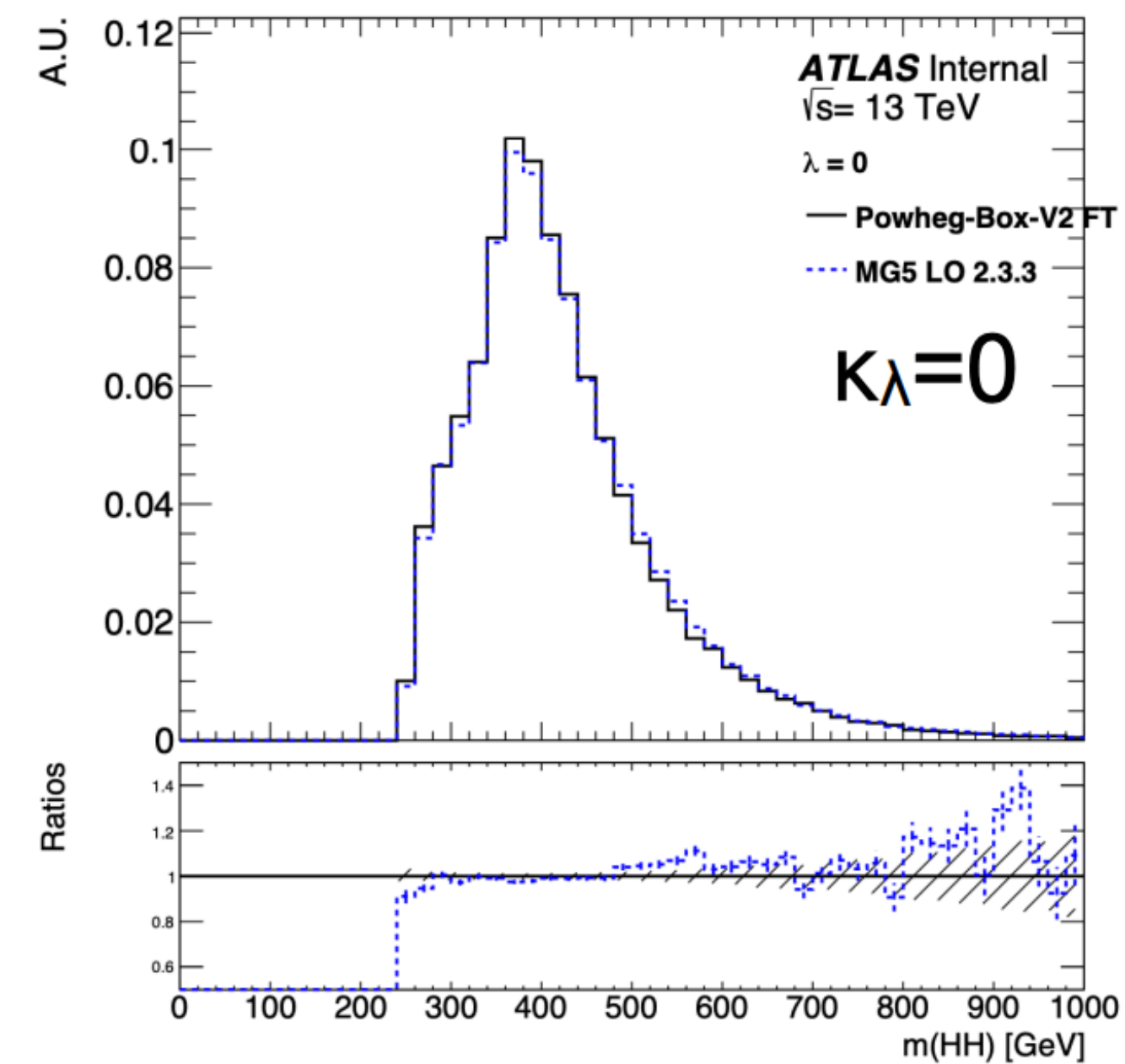
# More $\kappa_\lambda$ variations



SM



Close to max  
 interference of the  
 triangle and the  
 box diagrams



Box diagram  
 only

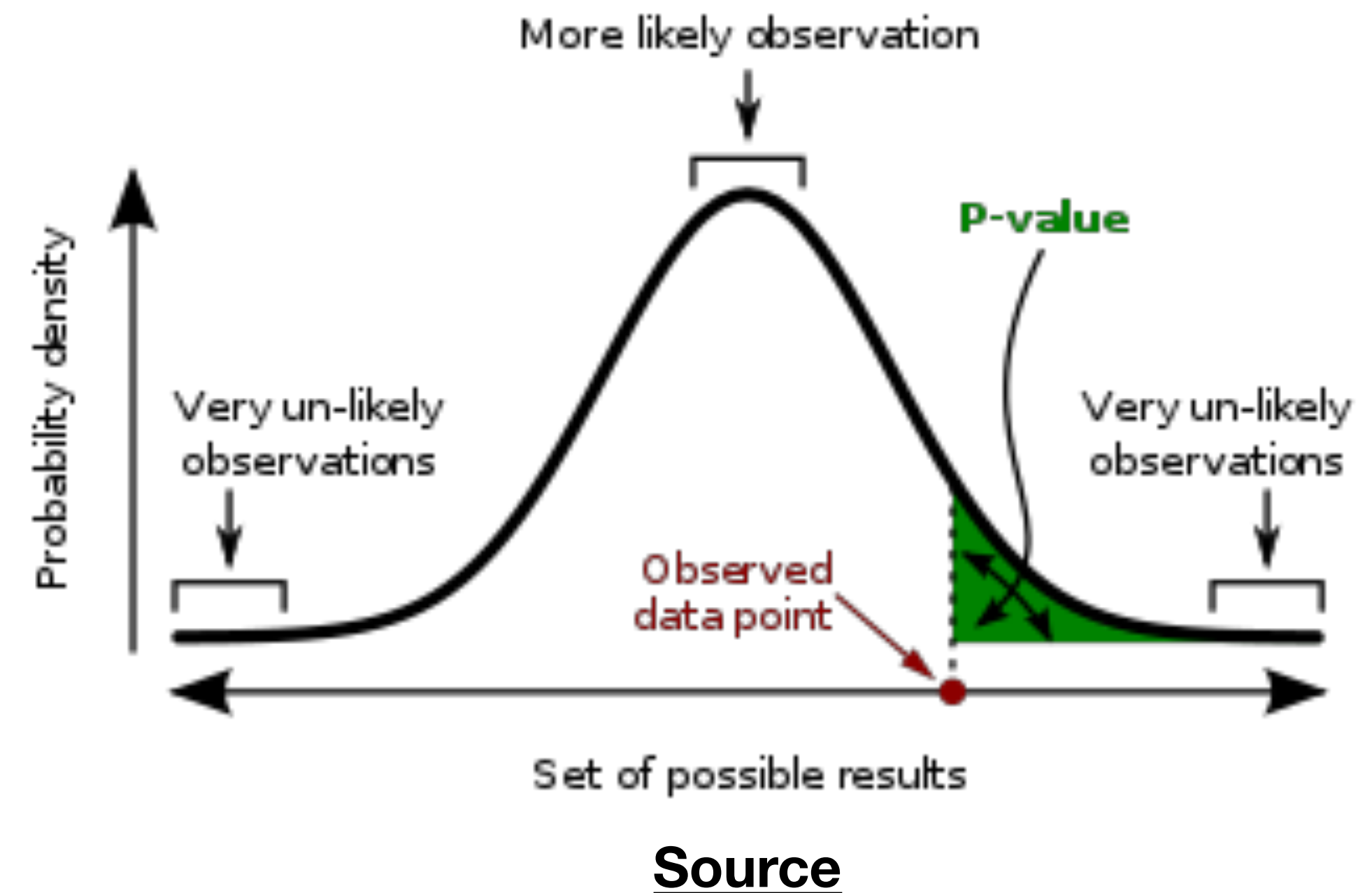
Source (Xiaohu Sun)

# Limit Setting Overview: Significance

- Null hypothesis  $H_0$  (background only), alternative hypothesis,  $H_1$  (signal + background)
- Quantify agreement with  $H$  by computing a probability of finding data with equal or greater incompatibility with  $H$  ( $p$ -value)
- Particle physics defines significance

$$Z = \Phi^{-1}(1 - p)$$

where  $\Phi^{-1}$  is the inverse of the cumulative distribution for the standard Gaussian



**Standard for Discovery:  $Z=5$ ,  $p = 2.87 \times 10^{-7}$**   
**Standard for exclusion:  $p=0.05$  (95% CL),  $Z=1.64$**

See, e.g., Cowan, et al



# Limit Setting Overview: Binned Analyses

- We use a binned analysis (histograms)

- We measure some variable  $x$  (e.g.  $m_{\text{HH}}$ ) and create a histogram

$$\mathbf{n} = (n_1, \dots, n_N)$$

- Then the expectation value in each bin can be written

$$E[n_i] = \mu s_i + b_i$$

with  $s_i$  corresponding mean number of entries in each bin from signal,  $b_i$  from background, and  $\mu$  as the signal strength

$$s_i = s_{\text{tot}} \int_{\text{bin } i} f_s(x; \boldsymbol{\theta}_s) dx$$

$$b_i = b_{\text{tot}} \int_{\text{bin } i} f_b(x; \boldsymbol{\theta}_b) dx$$

**A way of representing  $s_i$  and  $b_i$ , where  $f_{s(b)}$  corresponds to the probability density functions of the variable  $x$  with nuisance parameters (systematics, e.g.)  $\theta$ , which can impact the shape**

See, e.g., Cowan, et al



# Limit Setting Overview: Likelihood

- Most searches are based on **likelihood ratios**
- Likelihood is defined on right. This is the product of the Poisson probabilities for all bins
- The second contribution ( $u_k$ ) is from measurements to constrain nuisance parameters (see  $\mathbf{m}$  on right)
- Likelihood ratios are then defined as on right for a given value of the signal strength,  $\mu$ . The hats denote maximum likelihood (ML) parameters (values that maximize the likelihood function)

$$L(\mu, \boldsymbol{\theta}) = \prod_{j=1}^N \frac{(\mu s_j + b_j)^{n_j}}{n_j!} e^{-(\mu s_j + b_j)} \prod_{k=1}^M \frac{u_k^{m_k}}{m_k!} e^{-u_k}$$

$$\mathbf{m} = (m_1, \dots, m_n)$$

$$E[m_i] = u_i(\boldsymbol{\theta})$$

**Histogram for constraints on nuisance parameters. The  $u_i$  are calculable from  $\boldsymbol{\theta}$ .**

ML parameter for  
given  $\mu$

↓

$$\lambda(\mu) = \frac{L(\mu, \hat{\boldsymbol{\theta}})}{L(\hat{\mu}, \hat{\boldsymbol{\theta}})}$$

↑  
Maximized likelihood

See, e.g., Cowan, et al

# Limit Setting Overview: Test Statistics

- p-value calculation is based on some **test statistic** in which the deviation from hypothesis H is measured

- We use  $CL_s = \frac{CL_{s+b}}{CL_b} = \frac{P_{s+b}(q \leq q_{obs})}{P_b(q \leq q_{obs})}$  for test statistic q (ratio of probabilities to produce a value of q less than observed). Cross sections excluded if  $CL_s \leq 0.05$

- For 4b we use the statistics shown on right
  - Limit setting takes into account that, for resonances on top of background,  $\mu < 0$  is unphysical
  - For upper limits, data with  $\hat{\mu} > \mu$  would not be less compatible with  $\mu$  than the data obtained ( $\mu$  is “below” the limit)

$$q_0 = \begin{cases} -2 \ln \frac{L(0, \hat{\theta}(0))}{L(\hat{\mu}, \hat{\theta})} & \hat{\mu} > 0 \\ 0 & \hat{\mu} < 0 \end{cases}$$

**Test statistic used for searches  
(compatibility with background only)**

$$\tilde{q}_\mu = \begin{cases} -2 \ln \frac{L(\mu, \hat{\theta}(\mu))}{L(0, \hat{\theta}(0))} & \hat{\mu} < 0 \\ -2 \ln \frac{L(\mu, \hat{\theta}(\mu))}{L(\hat{\mu}, \hat{\theta})} & 0 \leq \hat{\mu} < \mu \\ 0 & \hat{\mu} > \mu \end{cases}$$

**Test statistic used for upper limit setting**

See, e.g., Cowan, et al

# Limit Setting Overview: Asymptotic Approx

- Limits are calculated in the **asymptotic approximation**
  - Likelihood ratios can be written in a simple form as on right, where  $N$  is the data sample size,  $\sigma$  is taken from the covariance matrix of estimators of the parameters
  - Assuming  $\hat{\mu}$  is Gaussian distributed and ignoring the  $1/\sqrt{N}$  term, the ratio as on right follows a non-central chi-squared distribution
    - We can then calculate significances numerically
    - Note: ignoring  $1/\sqrt{N}$  term is a good approximation even for  $N \sim 10$

$$-2 \ln \lambda(\mu) = \frac{(\mu - \hat{\mu})^2}{\sigma^2} + \mathcal{O}(1/\sqrt{N})$$

**Asymptotic form of likelihood ratios**

$$\tilde{q}_\mu = \begin{cases} \frac{\mu^2}{\sigma^2} - \frac{2\mu\hat{\mu}}{\sigma^2} & \hat{\mu} < 0, \\ \frac{(\mu - \hat{\mu})^2}{\sigma^2} & 0 \leq \hat{\mu} \leq \mu \\ 0 & \hat{\mu} > \mu. \end{cases}$$

$$Z_\mu = \begin{cases} \sqrt{\tilde{q}_\mu} & 0 < \tilde{q}_\mu \leq \mu^2/\sigma^2 \\ \frac{\tilde{q}_\mu + \mu^2/\sigma^2}{2\mu/\sigma} & \tilde{q}_\mu > \mu^2/\sigma^2. \end{cases}$$

**Asymptotic form of upper limit test statistic and significance**

See, e.g., Cowan, et al

# Counting Experiment Significance

$$L(\mu) = \frac{(\mu s + b)^n}{n!} e^{-(\mu s + b)}$$

Regard  $b$  as known. Data is then just  $n$ .

$$q_0 = \begin{cases} -2 \ln \frac{L(0)}{L(\hat{\mu})} & \hat{\mu} \geq 0, \\ 0 & \hat{\mu} < 0, \end{cases}$$

Test statistic for discovery

$$Z_0 = \sqrt{q_0} = \begin{cases} \sqrt{2 \left( n \ln \frac{n}{b} + b - n \right)} & \hat{\mu} \geq 0, \\ 0 & \hat{\mu} < 0. \end{cases}$$

Asymptotic approximation for significance

$$\text{med}[Z_0|1] = \sqrt{q_{0,A}} = \sqrt{2 \left( (s + b) \ln(1 + s/b) - s \right)}$$

Assume nominal signal hypothesis ( $\mu = 1$ ). Replace  $n$  by its Asimov value (expectation)

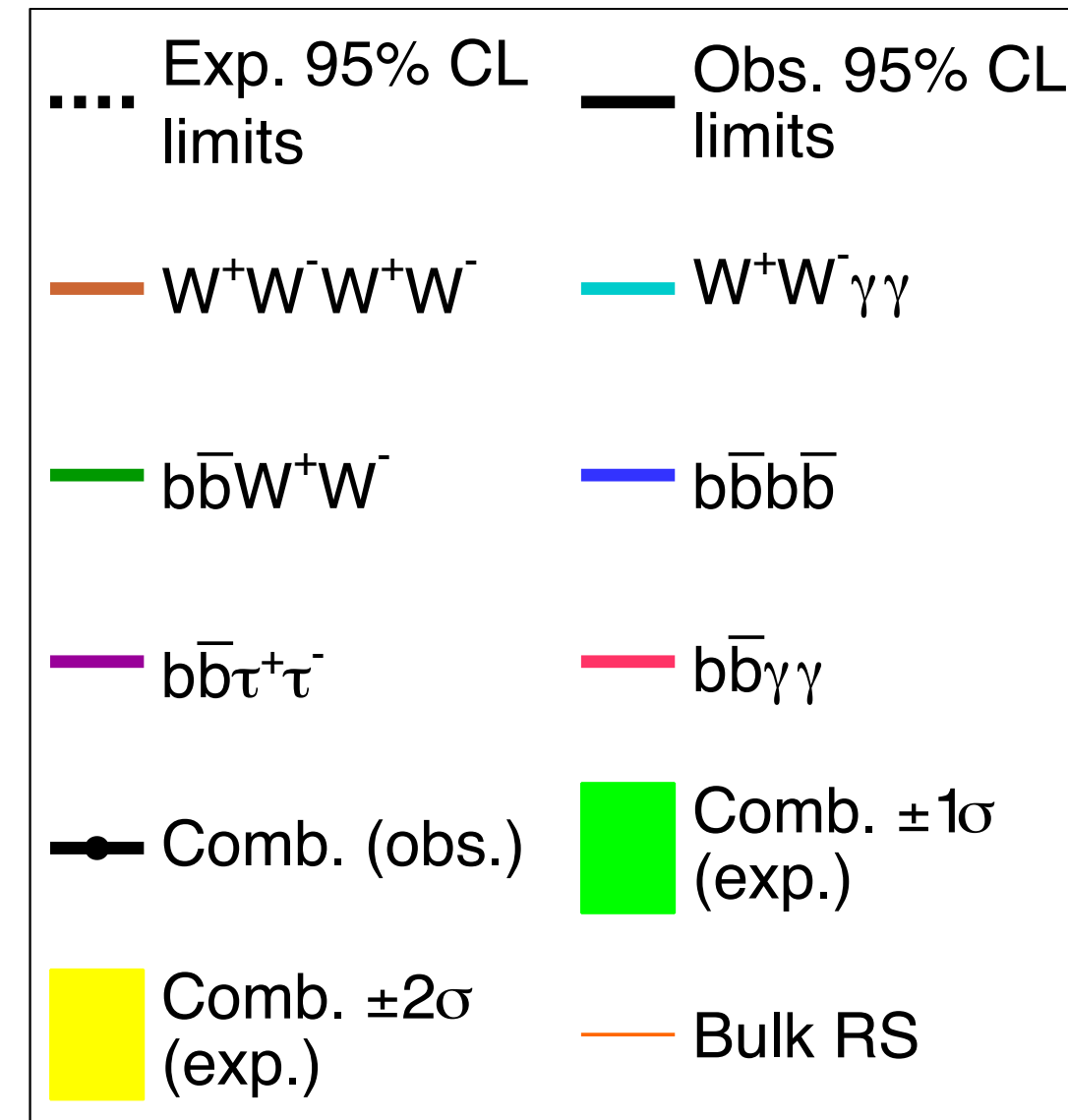
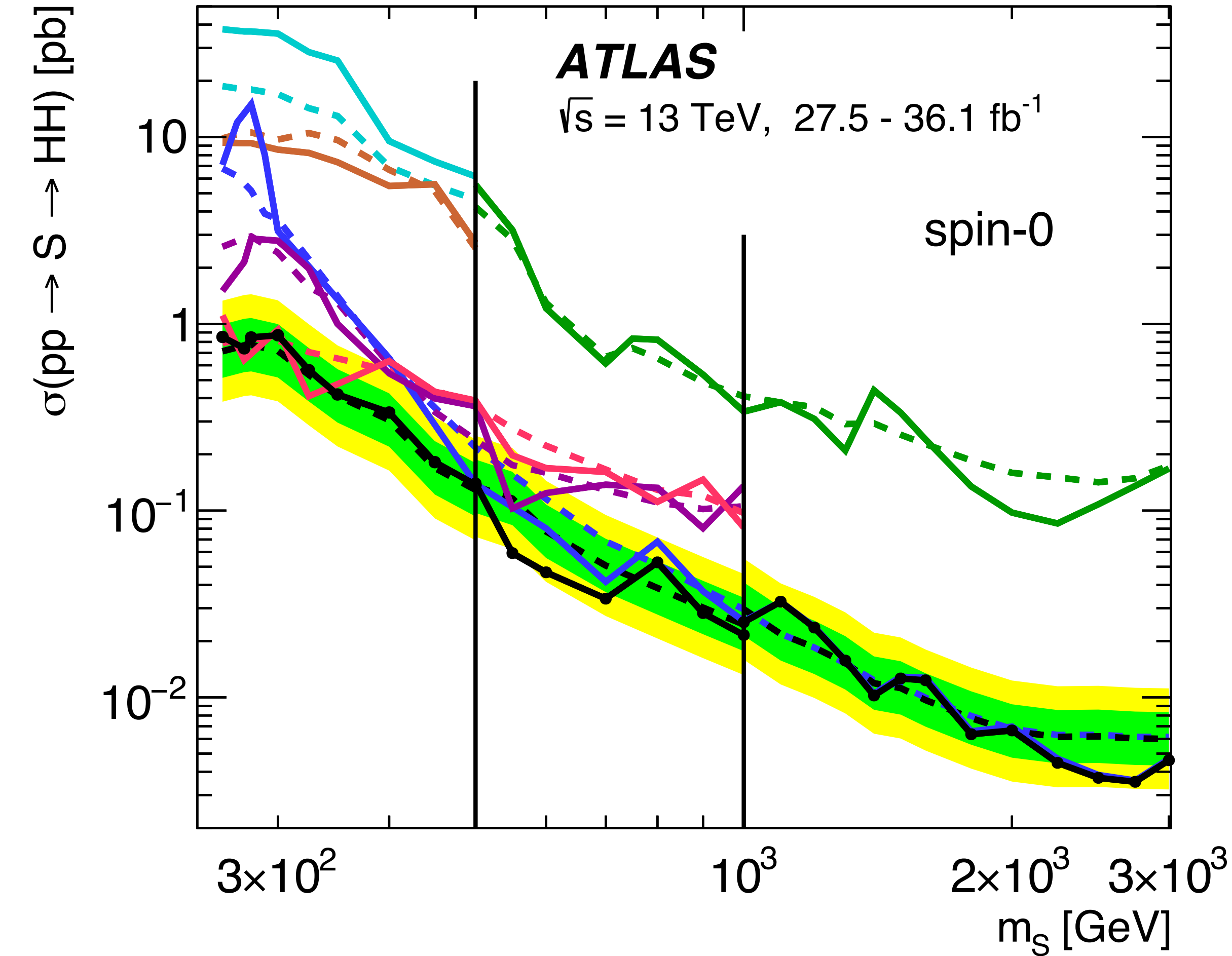
$$\text{med}[Z_0|1] = \frac{s}{\sqrt{b}} (1 + \mathcal{O}(s/b))$$

Expand log in  $s/b$

See, e.g., Cowan, et al

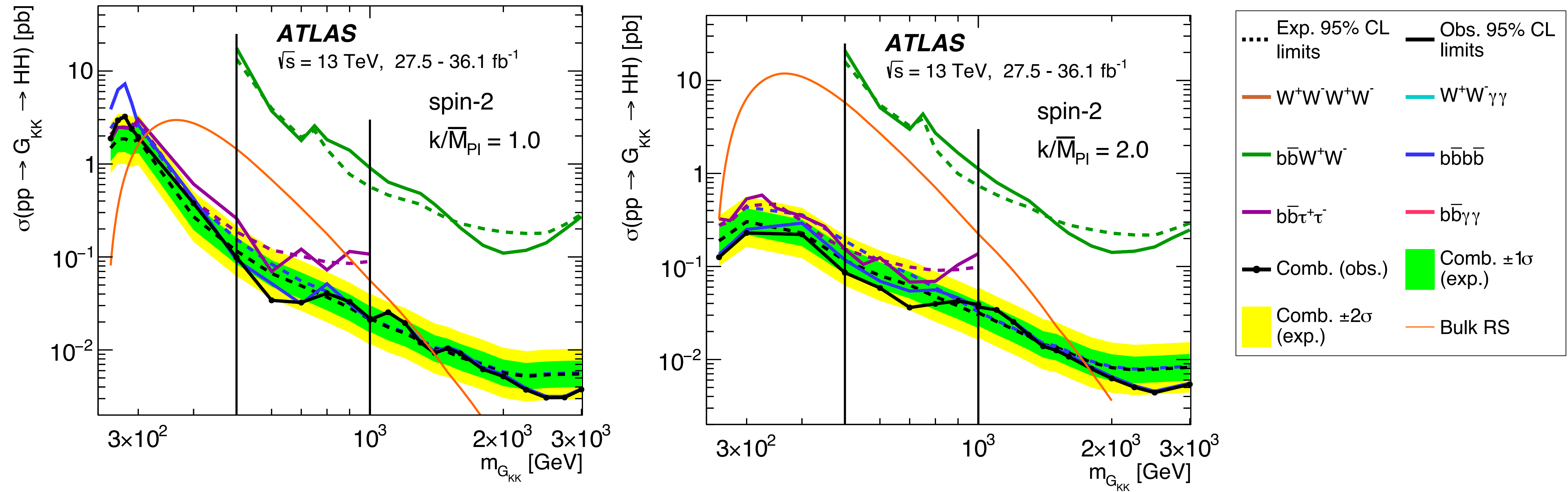


# Combination (Spin 0)



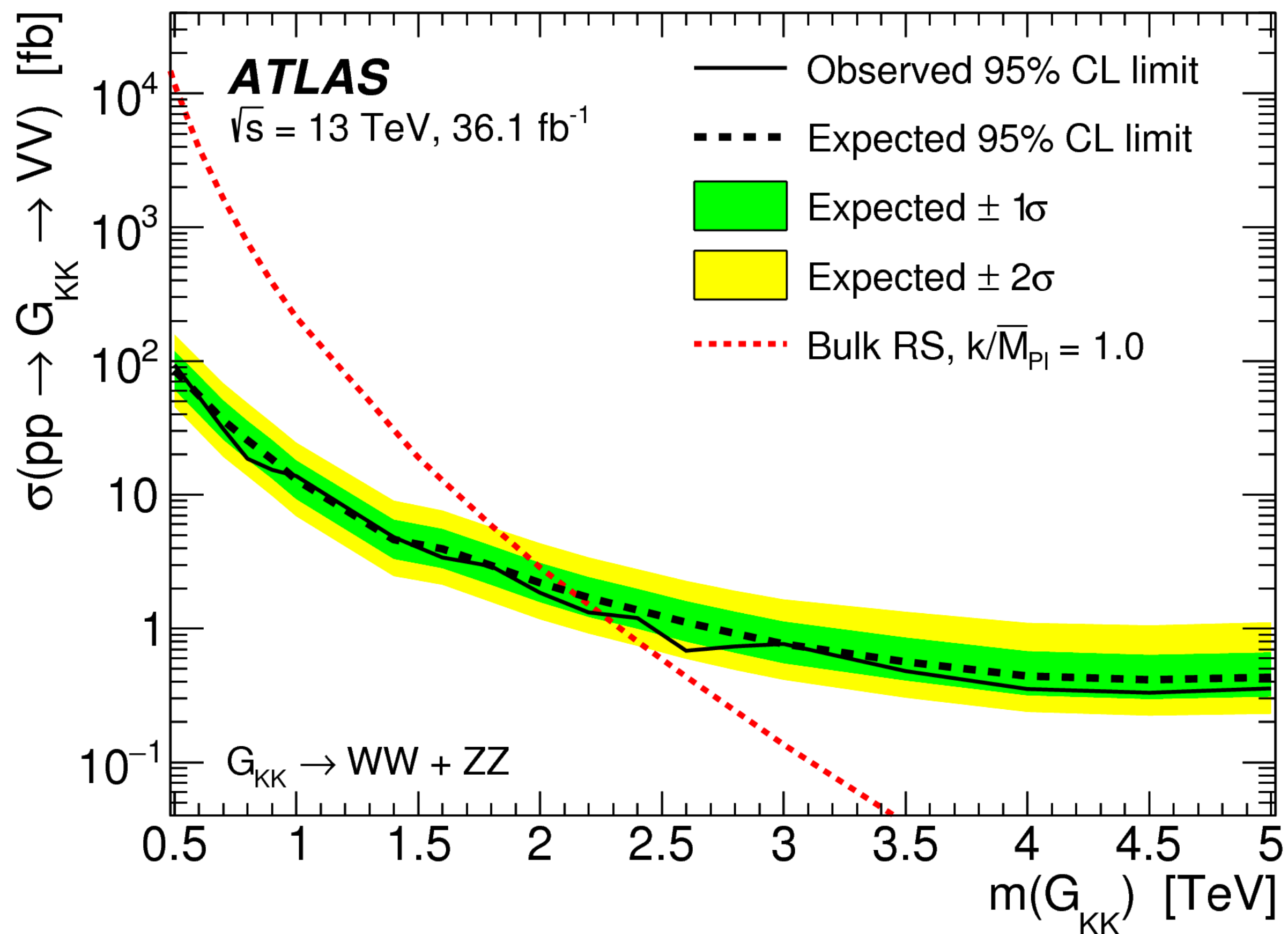
- Combined scalar limits. 4b dominates towards higher mass ( $> 400 \text{ GeV}$ )

# Combination (Spin 2)



- Combined spin 2 limits. Again, 4b dominates

# c=1.0 Graviton Exclusion



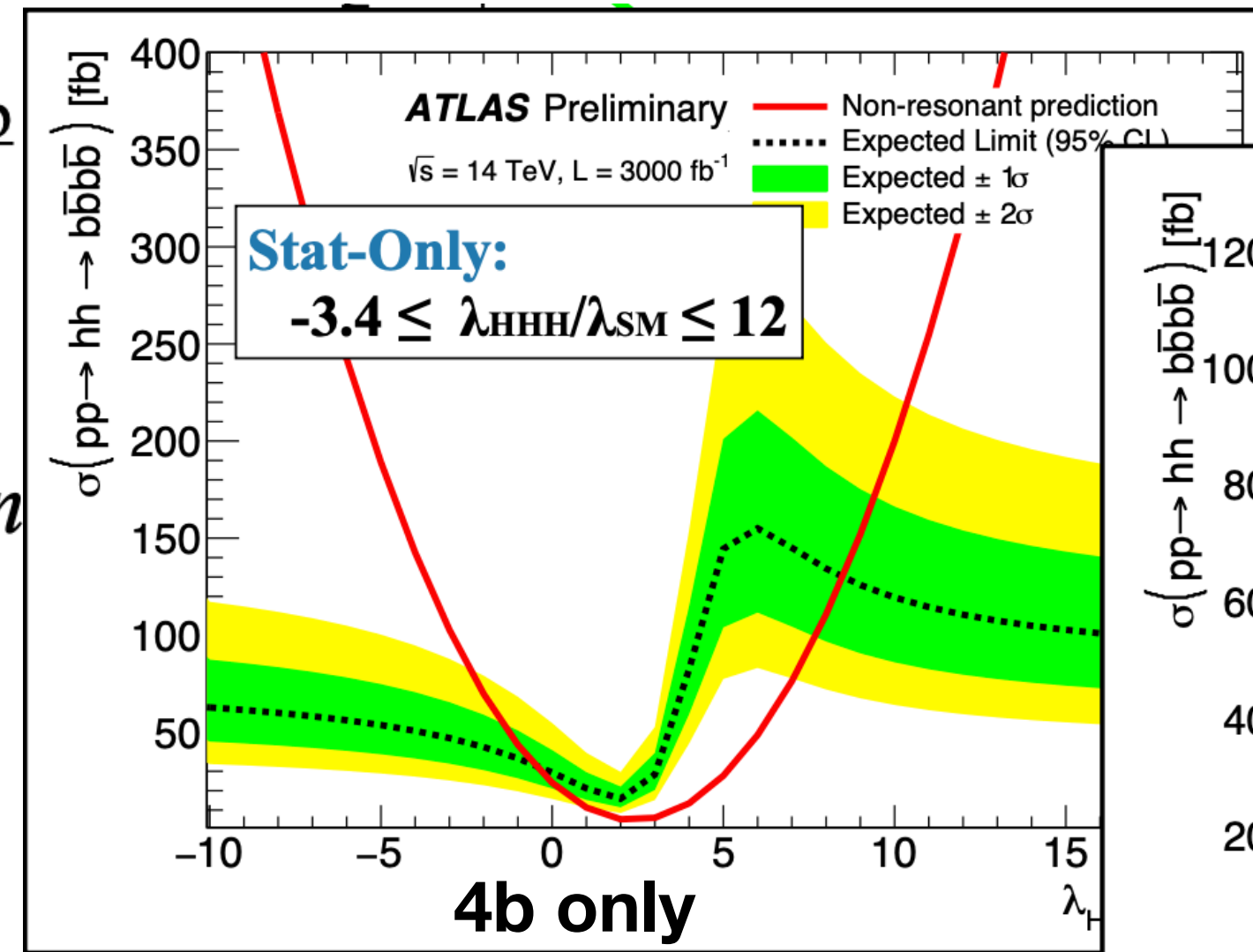
Source

- Strong limits set on  $c=1.0$  RS KK graviton by bosonic+leptonic final state searches
- Excludes the model over most of the 4b mass range
- Exclusion here from  $\sim 500$  to  $\sim 2300$  GeV
- 4b mass range from  $\sim 300$  to  $\sim 3000$  GeV

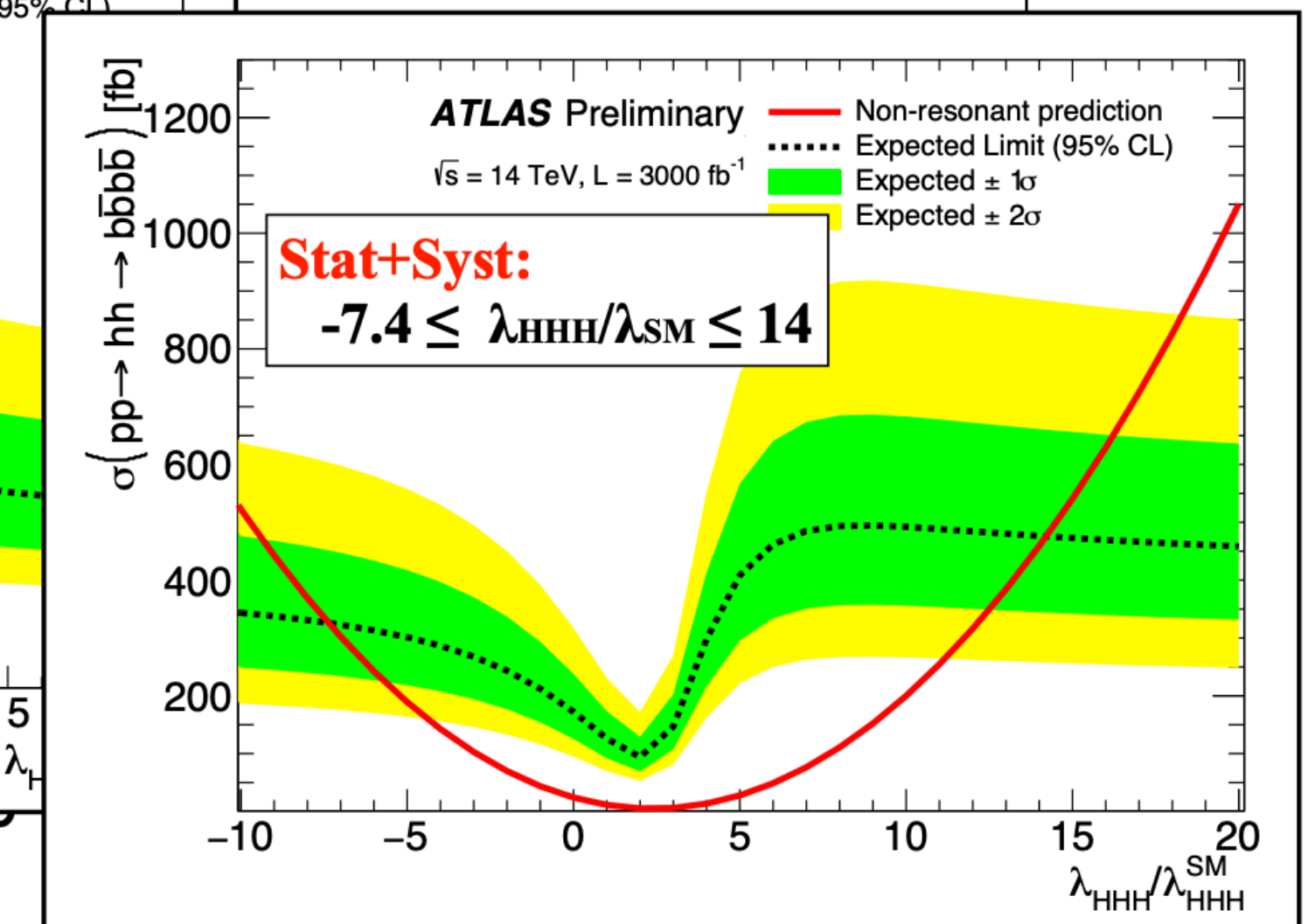
# HL-LHC Projections

95% CL limits on  $\mu_{HH}$

channel	14 TeV, 3000/fb	
	CMS stat.-only (stat+sys)	ATLAS stat.-only (stat+sys)
bbbb	2.9 (7.0)	2.0 (11.5)
bb $\gamma\gamma$	1.3 (1.3)	- (2.6)
bb $\tau\tau$	3.9 (5.2)	- (4.3)
bbWW	4.6 (5.8)	-



75 GeV jet  $E_T$  thresholds



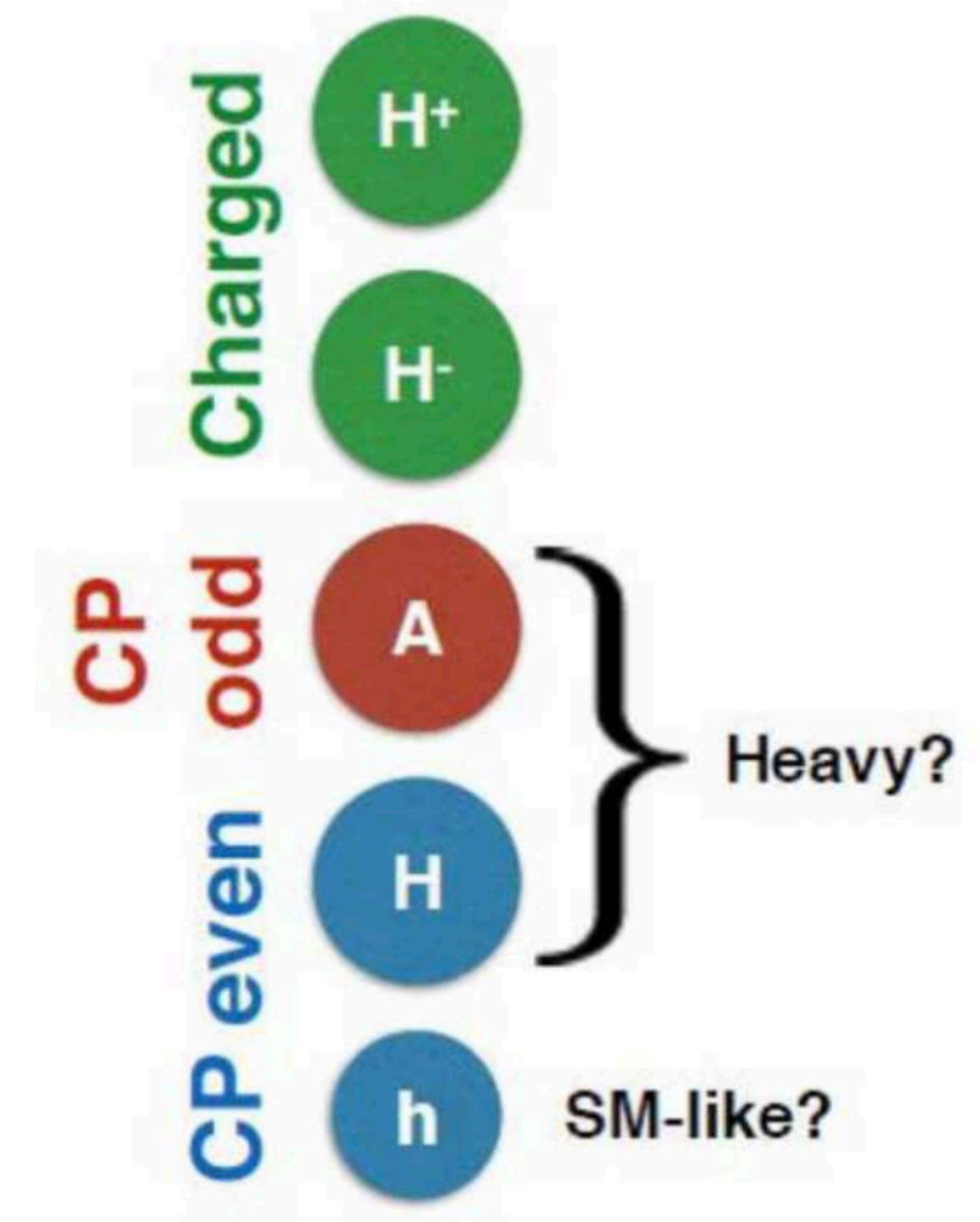
Source

- Projections shown with current analysis/systematics model
- At the end of the HL-LHC, we will start to be sensitive to larger deviations from the standard model
  - Estimated  $\sim 30\%$  precision on  $\lambda_{HHH}$  after combining channels/experiments
- As always, however, the goal is to beat the projection - with new methods, we will hopefully be able to push further



# 2HDM

- Describes a class of theories with two Higgs doublets instead of one
- This results in a total of 5 physical Higgses (mass eigenstates):
  - Recall: for 1 Higgs doublet, we had 4 degrees of freedom, 3 of which are “eaten” by giving the W and Z masses
  - For 2 Higgs doublets, we then have 8 degrees of freedom, 3 of which, again, are “eaten”
- Under some assumptions (real VEVs, e.g.) these are: two CP even scalars (h, H) one CP odd scalar (A), and two charged scalars ( $H^\pm$ )



Source

Overview

# 2HDM continued

- Parameters then include the 4 masses of the physical Higgs bosons as well as angles  $\alpha$  and  $\beta$ , where

$$\Phi_i = \frac{1}{\sqrt{2}} \begin{pmatrix} \sqrt{2}w_i^+ \\ (h_i + v_i) + iz_i \end{pmatrix}$$

- $\alpha$  describes the mixing between the two CP even scalars (h and H)

- $\tan \beta = \frac{v_2}{v_1}$ , the ratio of the VEVs of the two doublets

- Additionally, we have a parameter  $v = \sqrt{v_1^2 + v_2^2}$ , which is set to be 246 GeV, if one of the scalars is the SM Higgs

## Mass Eigenstates

**Neutral Goldstone and CP Odd Higgs:**  $\begin{pmatrix} \zeta \\ A \end{pmatrix} = \begin{pmatrix} \cos \beta & \sin \beta \\ -\sin \beta & \cos \beta \end{pmatrix} \begin{pmatrix} z_1 \\ z_2 \end{pmatrix}$

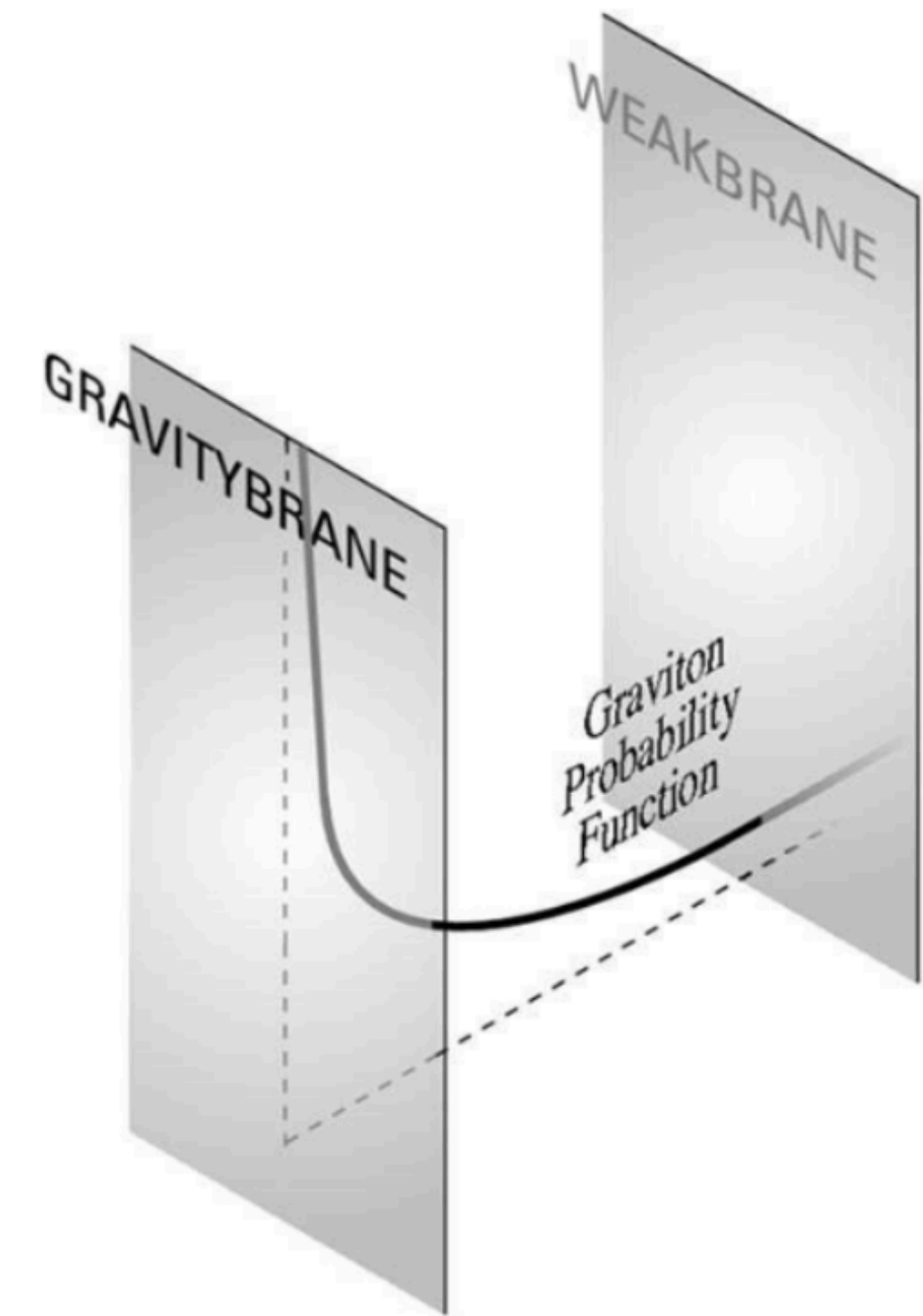
**CP Even Higgses:**  $\begin{pmatrix} H \\ h \end{pmatrix} = \begin{pmatrix} \cos \alpha & \sin \alpha \\ -\sin \alpha & \cos \alpha \end{pmatrix} \begin{pmatrix} h_1 \\ h_2 \end{pmatrix}$

**Charged Goldstone and Charged Higgs:**  $\begin{pmatrix} \omega^\pm \\ H^\pm \end{pmatrix} = \begin{pmatrix} \cos \beta & \sin \beta \\ -\sin \beta & \cos \beta \end{pmatrix} \begin{pmatrix} w_1^\pm \\ w_2^\pm \end{pmatrix}$

Source

# Randall Sundrum Model

- Idea: we live in 3+1 dimensions
- The Randall Sundrum model postulates a warped fifth dimension which contains
  - A 3+1 dimensional “gravitybrane” (where gravity is strong - also called the Planckbrane, scale  $\sim M_{\text{Pl}}$ )
  - A 3+1 dimensional “weakbrane” (where the Standard Model lives - also called the TeVbrane, TeV scale)
  - This warping solves the **hierarchy problem** (why the weak force is so much stronger than gravity) as it generates a large ratio of energy scales
    - In particular  $\text{TeV}/M_{\text{Pl}} \sim e^{-k\pi R}$  gives the ratio of scales, where  $k$  is the curvature scale and  $R$  is the proper size of the extra dimension. For the right scale,  $kR \approx 11$



**Schematic of the Randall Sundrum model [ref]**

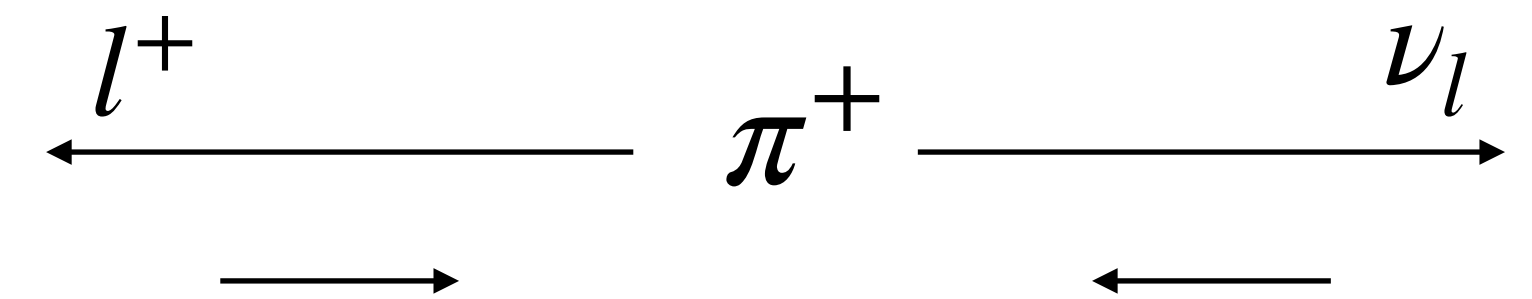
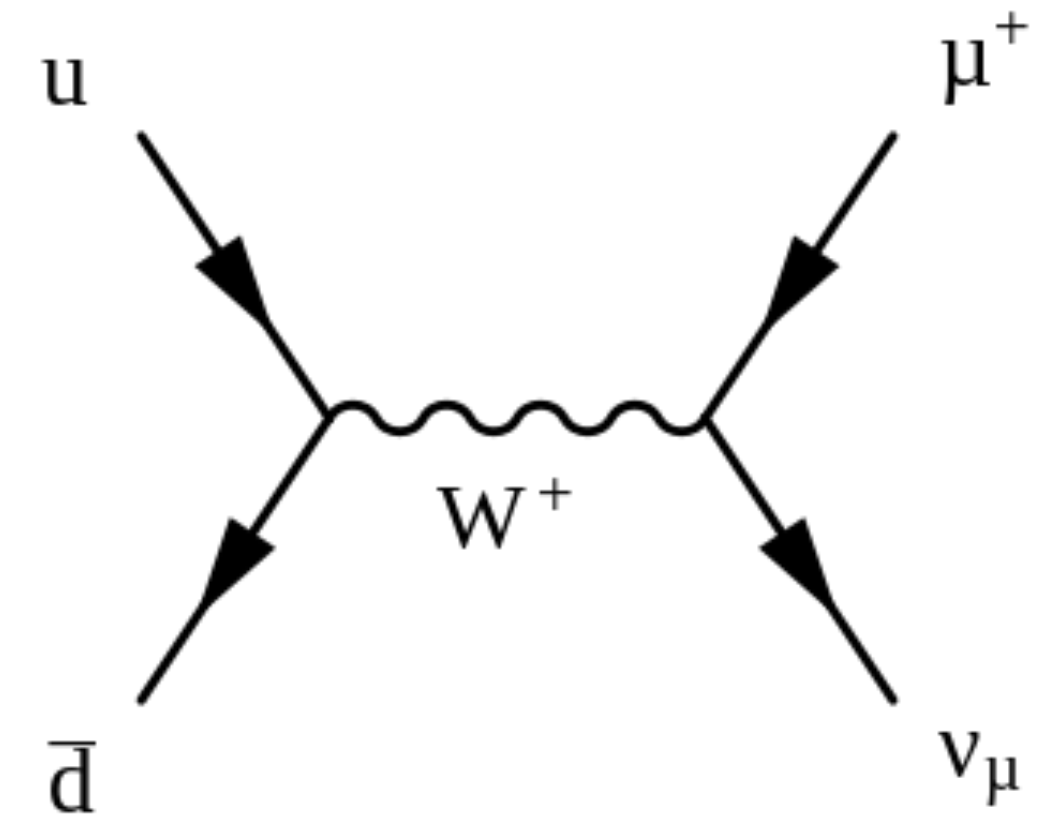
# RS and Gravitons

- Kaluza-Klein theory (very roughly) provides a prescription for 5D theories by decomposing them in terms of their 4D parts, plus some extras
- Why do we care about branes and warped extra dimensions?
  - Masses and couplings of Kaluza-Klein modes in this theory are of TeV scale - perfect for the LHC!
  - Idea is that the large Planck scale (weak gravity) arises from the small overlap of the graviton wave function in the fifth dimension with our brane
  - However, all other scales are TeV scale, which we can regard as fundamental to the theory
  - Theory predicts SM couplings - can search with HH!



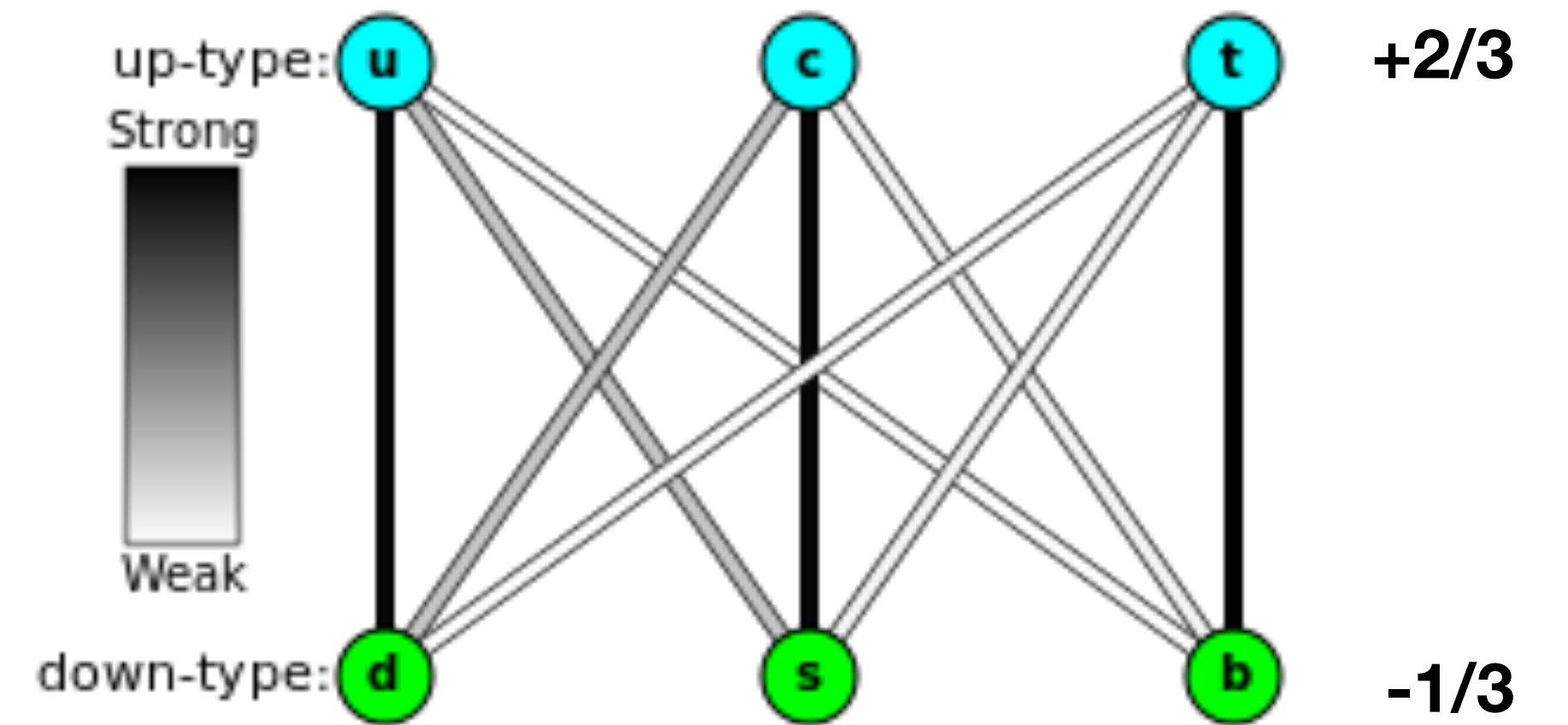
# Misc: Pion Decay

- Pion is spin 0
- $l^+$  and  $\nu_l$  are spin 1/2
- Weak decay!  $W$  couples to left handed particles, right handed anti-particles
  - $\nu_l$  is left-handed
- Angular momentum conservation  $\Rightarrow l^+$  is also left handed
- Violates weak interaction preference that  $l^+$  is right handed! Also, helicity conservation (helicity before = 0, helicity after = -1)
  - $\Rightarrow$  Helicity suppression! If massless, this is prohibited, so decay rate must be proportional to mass
  - $\Rightarrow \pi^\pm$  decays more often to muons than electrons



# Misc: CKM Matrix

- Describes mixing between quark mass eigenstates
  - For e.g.,  $W$  decay, widths are proportional to the square of the CKM element
- For us:
  - $W^+ \rightarrow c\bar{b} \propto |V_{cb}|^2 \approx 0.0018$
  - $W^+ \rightarrow c\bar{s} \propto |V_{cs}|^2 \approx 0.994$
  - So much more likely to get c, s from top decay in our 4b final state
    - bbcc, rate of c's faking b's is ~10%

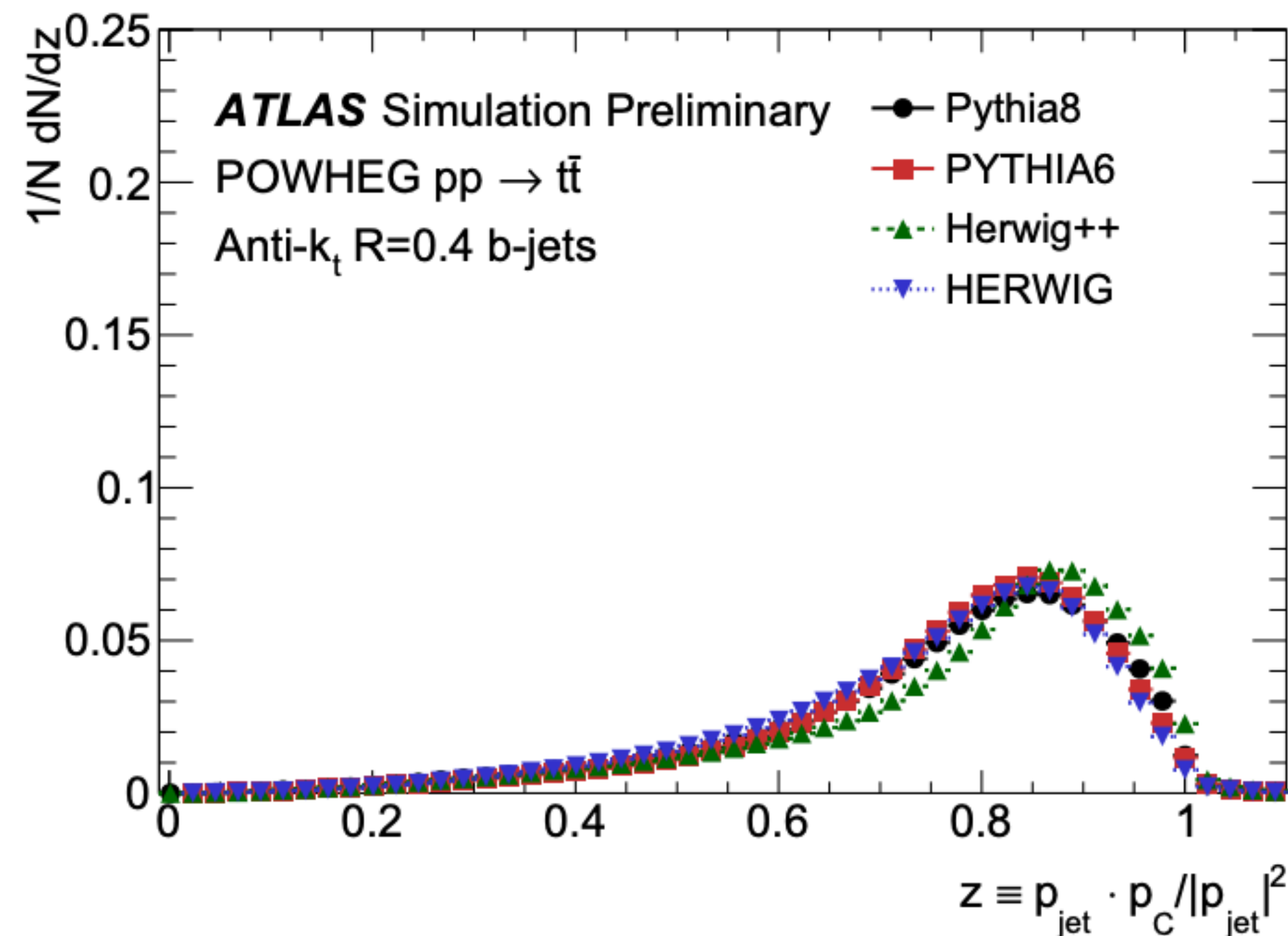


$$\begin{pmatrix} |V_{ud}| & |V_{us}| & |V_{ub}| \\ |V_{cd}| & |V_{cs}| & |V_{cb}| \\ |V_{td}| & |V_{ts}| & |V_{tb}| \end{pmatrix} \approx \begin{pmatrix} 0.97420 & 0.2243 & 0.00394 \\ 0.218 & 0.9997 & 0.0422 \\ 0.0081 & 0.0394 & 1.019 \end{pmatrix}$$

CKM Values (PDG)

# Misc: More on b-tagging

- Long Lifetimes:
  - b-hadron lifetimes  $\sim 1.5$  ps
  - $c\tau = 1.5 \text{ ps} \cdot 3 \times 10^8 \text{ m/s} = 0.00045 \text{ m} = 0.45 \text{ mm}$
  - $\pi^0$  e.g. has a lifetime of  $8.4 \times 10^{-17} \text{ s} = 8.4 \times 10^{-5} \text{ ps}$ , around 20,000 times shorter!
  - Why? b $\rightarrow$ c CKM suppressed, e.g.
- Large Masses:
  - B meson mass  $\sim 5.2 \text{ GeV}$  ( $B^+ = u\bar{b}$ ,  $B^0 = d\bar{b}$ , e.g.)
  - $\pi^0$  mass  $\sim 134 \text{ MeV} = 0.134 \text{ GeV}$
  - $\Rightarrow$  High multiplicity. b hadrons have an average of 5 charged particles per decay
- Hard fragmentation function:
  - b-hadrons contribute to an average around 75% of the b-jet energy

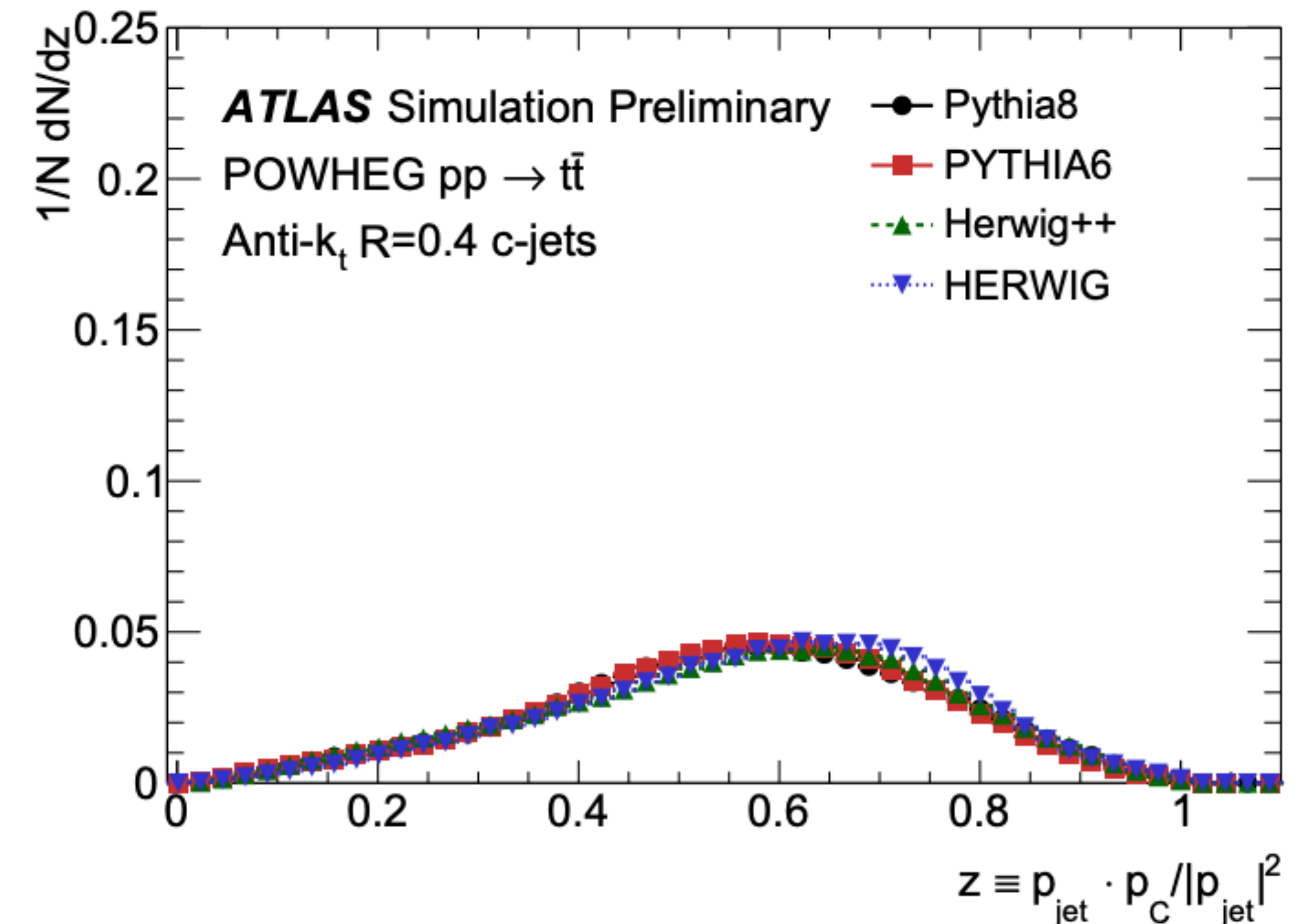


Flavor tagging paper

Flavor tagging introduction

# Misc: b vs c

- c-hadrons ( $D^+ = c\bar{d}$ ,  $D^0 = c\bar{u}$ , e.g.)
  - Lifetime  $\sim 0.5$ -1 ps (factor of 2 smaller than b-hadron)
  - Mass  $\sim 1.9$  GeV ( $\sim 2$ -3x smaller than b-hadron)
  - Fragmentation: c-hadrons carry an average of  $\sim 55\%$  of jet energy



Flavor tagging paper

Flavor tagging introduction



# Misc: b vs c and MV2c10

- MV2c10 is a BDT based tagger
  - Takes as inputs lower level tagging information
    - Impact parameter based
    - Secondary vertex finding
    - Jet properties
- Outputs a b-tagging score, used for selection
  - We use the 70% working point
    - 70% of the real b-jets will be tagged as such
    - ~11% of c-jets will be pass the b-jet selection
    - ~0.33% of light jets will pass

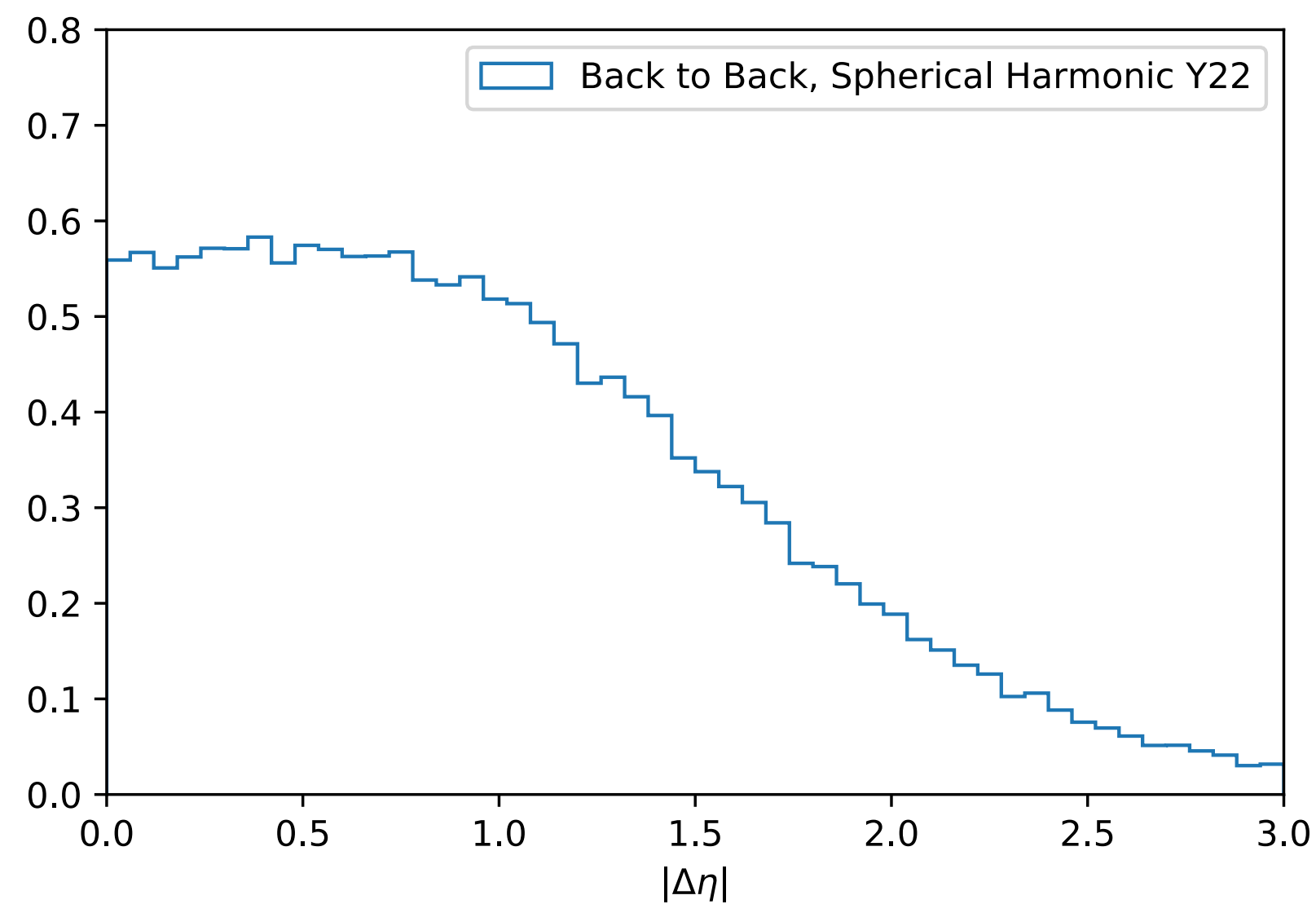
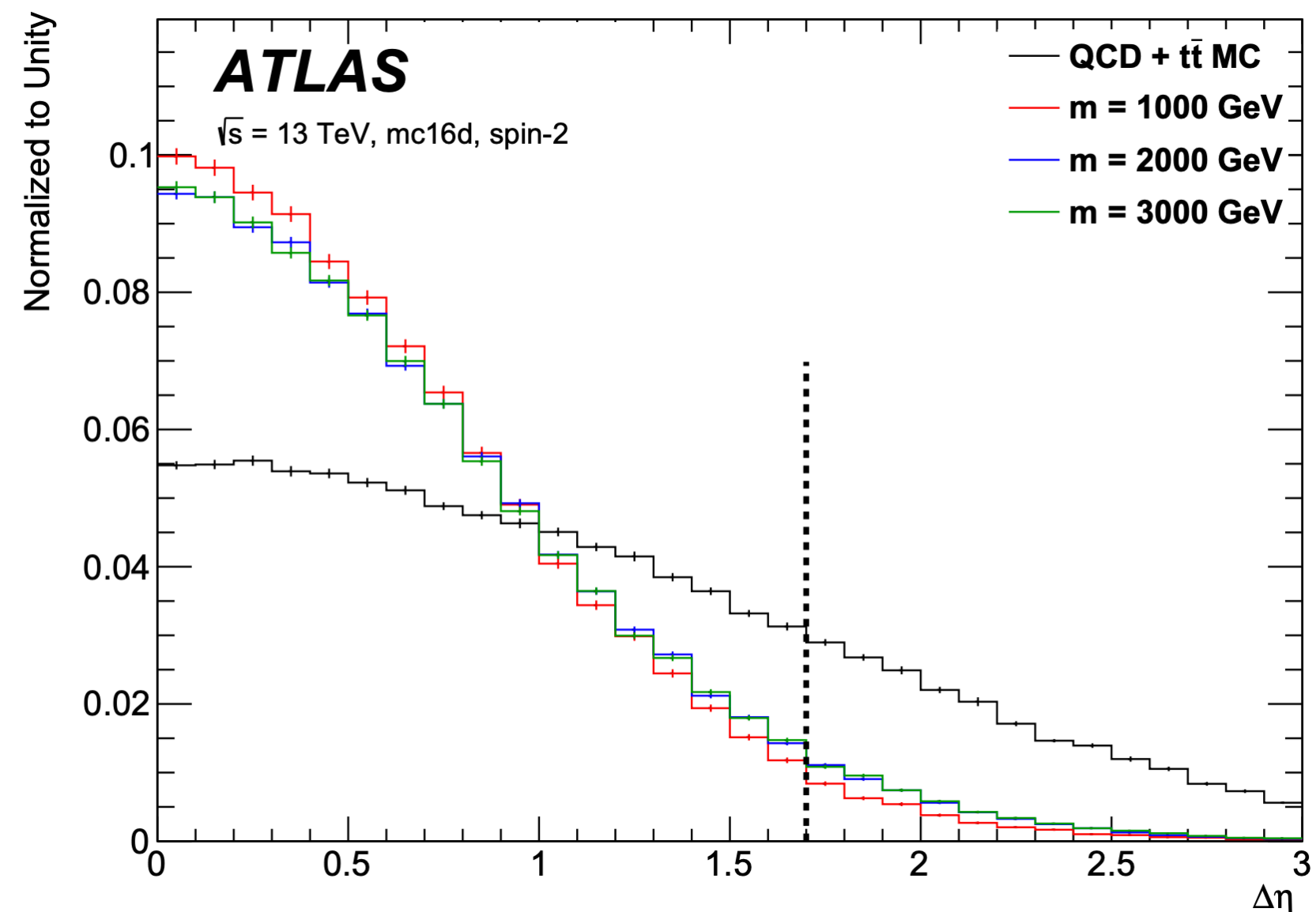
$\epsilon_b$	MV2			
	Selection	Rejection		
		c-jet	$\tau$ -jet	Light-flavour jet
60%	> 0.94	23	140	1200
70%	> 0.83	8.9	36	300
77%	> 0.64	4.9	15	110
85%	> 0.11	2.7	6.1	25

**b-tagging efficiency and rejection  
(1/eff for each category)**

[Flavor tagging paper](#)

[Flavor tagging introduction](#)

# Misc: Angular Distributions



- Very roughly, we would expect spin 0 to be isotropic (proportional to  $|Y_0^0|^2$ ), spin 2 to have some angular dependence (which might go like  $|Y_2^2|^2$ )
- Checking this, we sample from corresponding distributions and look at  $|\Delta\eta|$
- Uniform (on right) matches scalar shape well (see, e.g. green “back to back”) though the shape is quite different for  $m=1000 \text{ GeV}$ 
  - Assumption of at rest production may break down
- Spherical harmonic shape matches spin 2 a bit worse, but we would expect some mixture of other harmonics here. We do see an inflated low  $|\Delta\eta|$ , consistent with observed, relative to the scalar

