



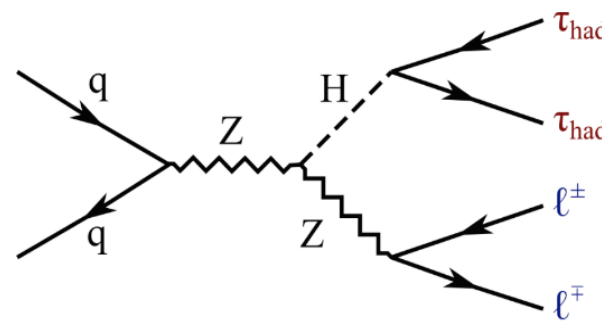
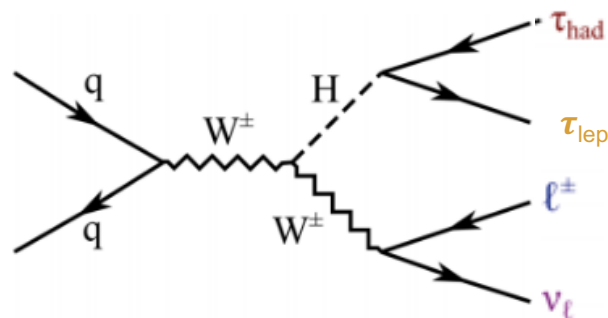
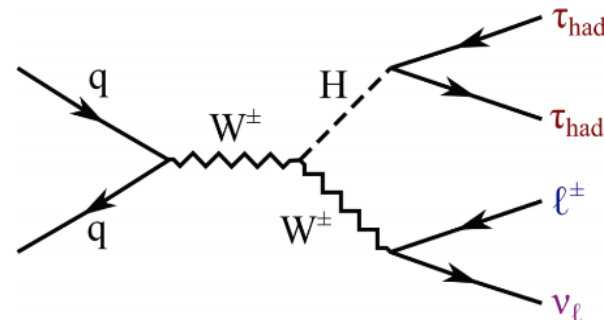
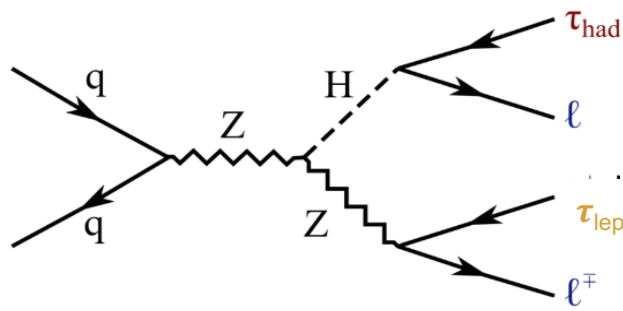
# Solutions and Improvement for $VH \rightarrow \tau\tau$ Run 2 Analysis

Savannah Thais, Yale University  
USLUA Lightning Round, 11/03/2017

# Analysis Introduction

## BASICS

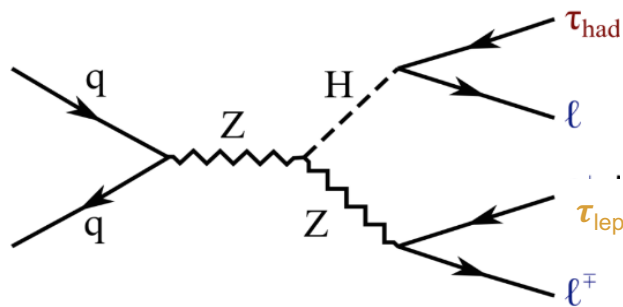
- Associated production (VH): **W or Z radiates a Higgs**
- The **Higgs decays to 2 taus**
- 4 analysis categories
- All final states have 3-4 objects:
  - ▷ 2 taus and 1-2 light leptons
- In ATLAS Software:
  - ▷ Taus are difficult to trigger on and reconstruct cleanly
  - ▷ Light lepton triggers and IDs are highly efficient



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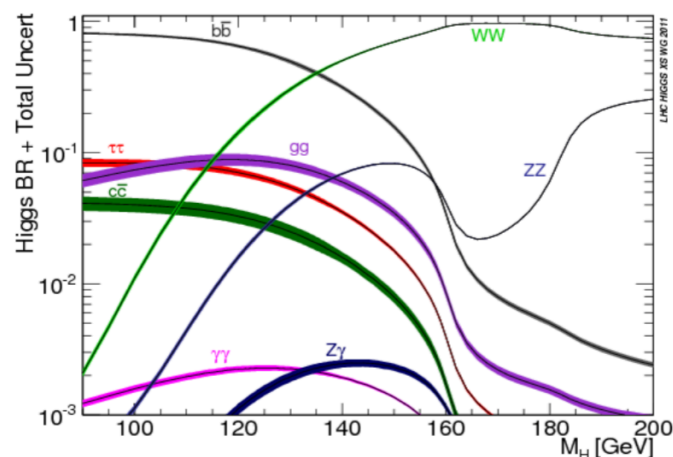
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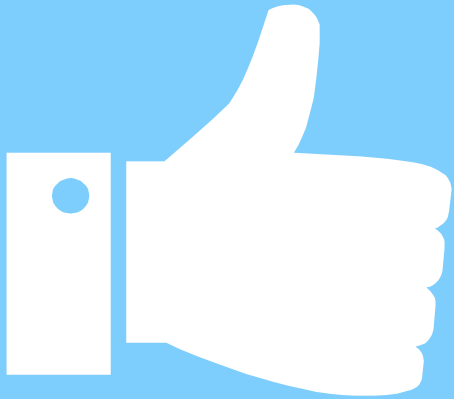
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## MOTIVATION

- $H \rightarrow \tau\tau$  has a high branching fraction
- Object requirements on 3-4 objects → reduced multi-jet backgrounds
- Increased luminosity → VH is a more viable production mode
- Increased pileup → more difficulty measuring other  $H \rightarrow \tau\tau$  production modes





Very promising  
channel to observe  
fermionic Higgs decay!

# Analysis Procedure

## Select Events

Select appropriate events for each of our 4 analysis categories

## Estimate Backgrounds

Calculate background contributions to selected event distributions (major source of uncertainty)

## Reconstruct Mass Spectrum

Construct the di-tau mass spectrum accounting for missing mass from neutrinos

## Fit Mass Spectrum

Fit the di-tau mass spectrum, compare to SM predictions, obtain final results

# Analysis Procedure

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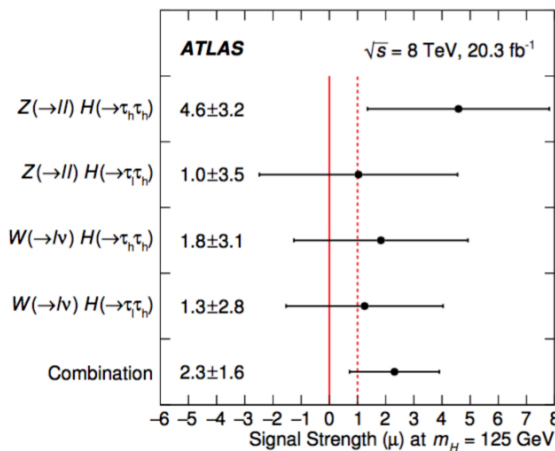
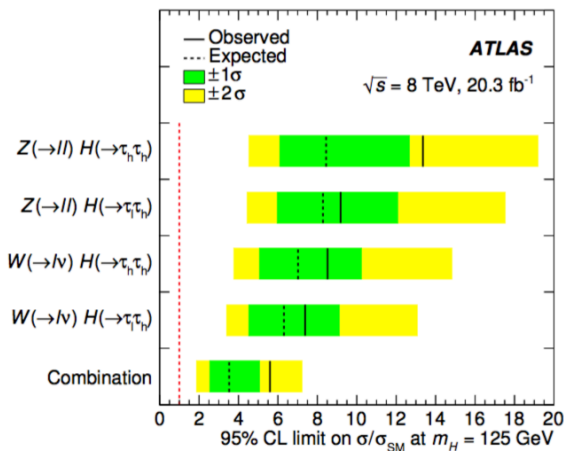
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Run 1 combined signal strength:  $\mu = 2.3 \pm 1.6$

# Event Selection

All categories must have at least 3 identified leptons including at least 1 light lepton

$$W \rightarrow \mu\nu/e\nu, H \rightarrow \tau_{\text{lep}}\tau_{\text{had}}$$

- Exactly one isolated muon and electron
- Exactly one  $\tau_{\text{had}}$  passing medium BDT ID
- $p_T(\tau_{\text{had}}) > 25 \text{ GeV}$
- Same-charge e and  $\mu$ , opposite charge  $\tau_{\text{had}}$
- Events with b-tagged jets with  $p_T > 30 \text{ GeV}$  are vetoed
- $|p_T(\tau_{\text{had}})| + |p_T(\mu)| + |p_T(e)| > 80 \text{ GeV}$
- $\Delta R(\tau_{\text{had}}, \tau_{\text{lep}}) < 3.2$

$$W \rightarrow \mu\nu/e\nu, H \rightarrow \tau_{\text{had}}\tau_{\text{had}}$$

- Exactly one isolated muon or electron
- Exactly two opposite charge  $\tau_{\text{had}}$  passing medium BDT ID
- $p_T(\tau_{\text{had}}) > 20 \text{ GeV}$
- $|p_T(\tau_{\text{had}1})| + |p_T(\tau_{\text{had}2})| > 100 \text{ GeV}$
- $m_T(l, E_T^{\text{miss}}) > 20 \text{ GeV}$
- $0.8 < \Delta R(\tau_{\text{had}1}, \tau_{\text{had}2}) < 2.8$
- Events with b-tagged jets with  $p_T > 30 \text{ GeV}$  are vetoed

$$Z \rightarrow \mu\mu/ee, H \rightarrow \tau_{\text{lep}}\tau_{\text{had}}$$

- Exactly three electrons or muons
- One opposite-charge and same-flavor lepton pair with invariant mass  $80 < m_{ll} < 100 \text{ GeV}$
- Exactly one  $\tau_{\text{had}}$  passing medium BDT ID with opposite charge to the lepton assigned to the Higgs
- $p_T(\tau_{\text{had}}) > 20 \text{ GeV}$
- $|p_T(\tau_{\text{had}})| + |p_T(\tau_{\text{lep}})| > 60 \text{ GeV}$

$$Z \rightarrow \mu\mu/ee, H \rightarrow \tau_{\text{had}}\tau_{\text{had}}$$

- Exactly two electrons or muons of opposite charge
- Exactly two opposite charge  $\tau_{\text{had}}$  passing medium BDT ID
- $p_T(\tau_{\text{had}}) > 20 \text{ GeV}$
- $60 < m_{ll} < 120 \text{ GeV}$
- $|p_T(\tau_{\text{had}1})| + |p_T(\tau_{\text{had}2})| > 88 \text{ GeV}$

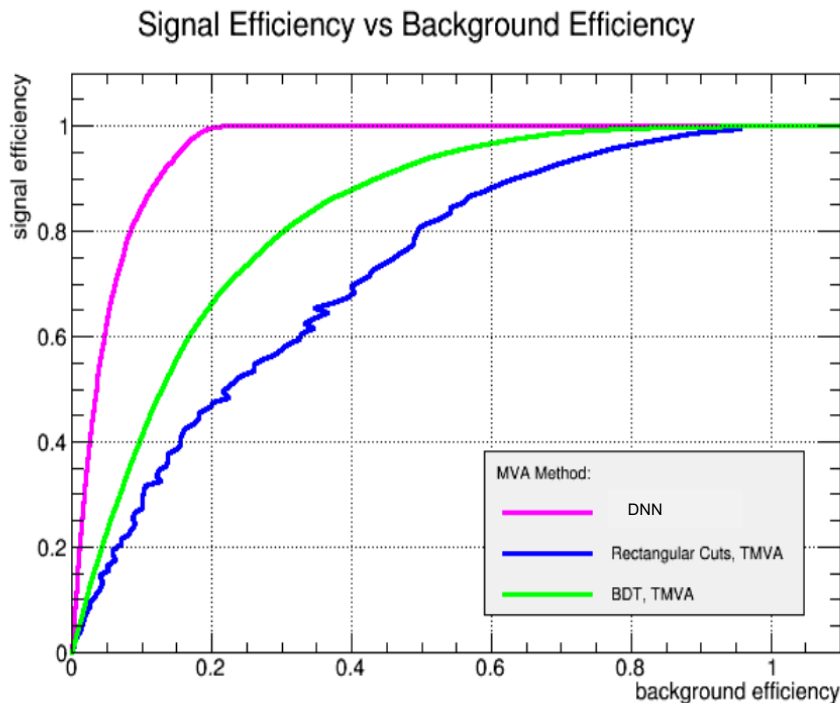
# Event Selection Improvements

- Could improve event selection efficiency with **Machine Learning**
  - ▷ Either an individual algorithm for each analysis category
  - ▷ Or algorithm with multiple classification outputs
- Can train algorithm using same variables from Run 1 event selection
  - ▷ Particle  $p_T$ , triggers, number of leptons, lepton charge, lepton quality
  - ▷ Or additional variables that were not appropriate for cuts



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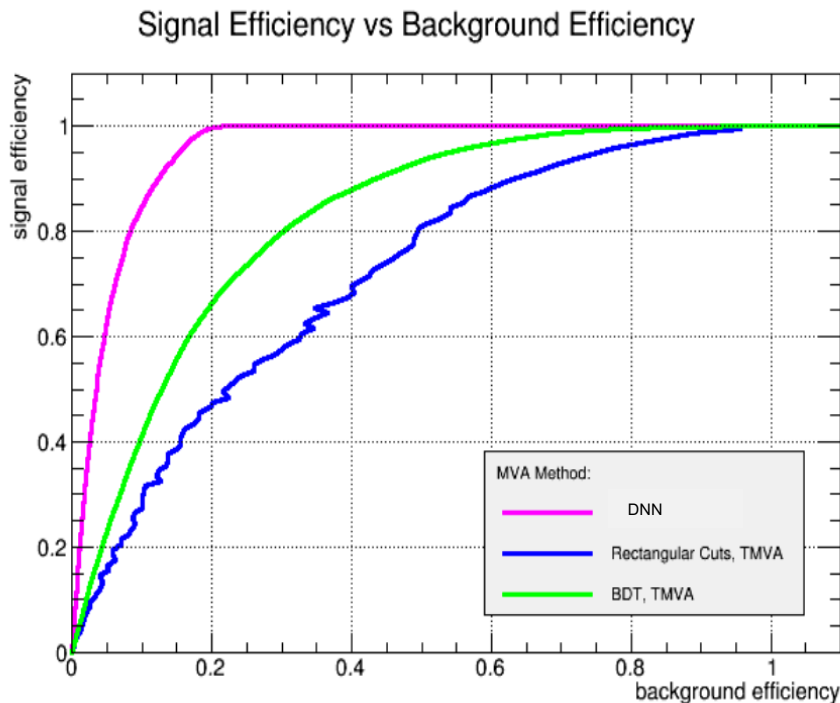
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Improving background rejection  
would reduce dependency on fake  
rate measurements!

# Background Estimation

This analysis has two types of backgrounds:

1. Irreducible backgrounds from diboson,  $Z \rightarrow \tau\tau$ , and  $t\bar{t}$  (contributions measured in MC)
2. Backgrounds from non-prompt leptons/taus and objects faking leptons/taus (contributions measured in data)

# Background Estimation

Backgrounds from non-prompt leptons/taus and objects faking leptons/taus

Calculate this background contribution using **fake rate** measured in data

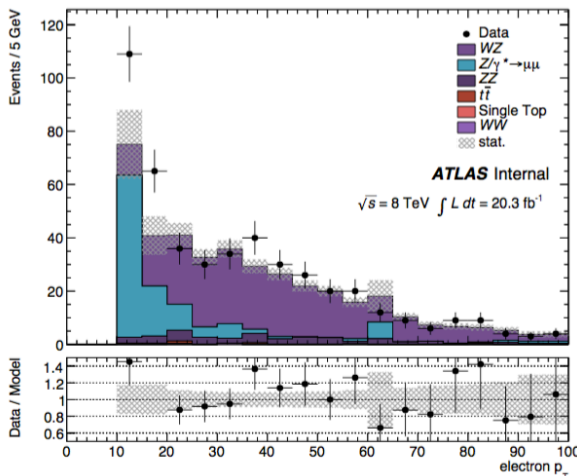
1. Select a region with kinematics similar to Signal Region (SR) but enriched in objects failing ID criteria (**anti-selected objects**)
2. Measure the frequency at which object candidates in this region pass the object selection criteria (**fake rate,  $r$** )
3. Use  $r$  calculate the scaling factor between events in fake enriched region to events in SR (**fake factor,  $f=r/(1-r)$** )
4. **Apply  $f$  as an additional bin weighting** in SR to account for fake/non-prompt background contribution to final results

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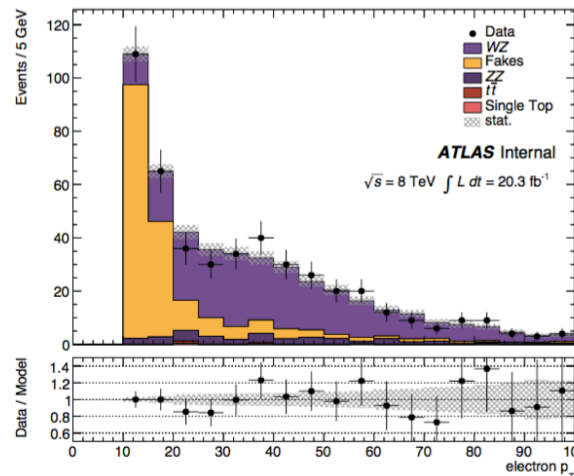
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(a) MC estimate



(b) FF estimate

Electron  
fake rate  
closure test



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- Large systematic uncertainty in Run 1
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- ATLAS has new data-driven electron ID which reduces non-prompt selection rate
- Further improved image based ID under construction
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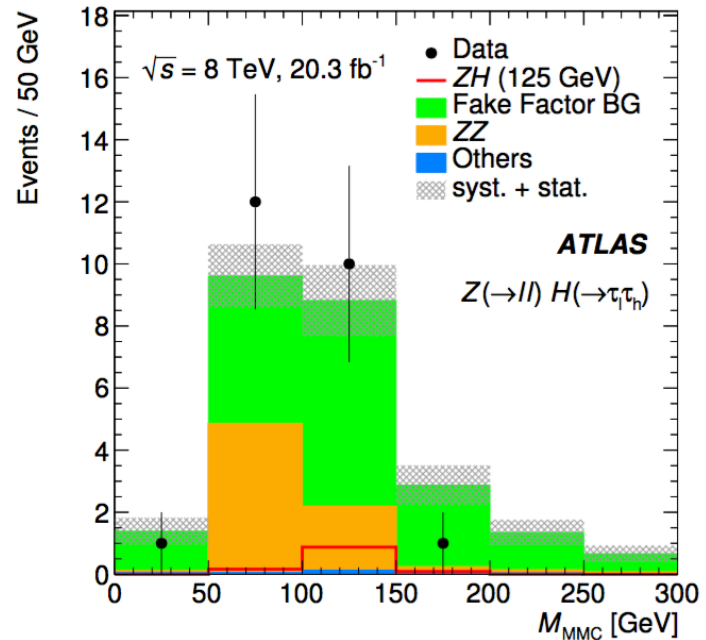
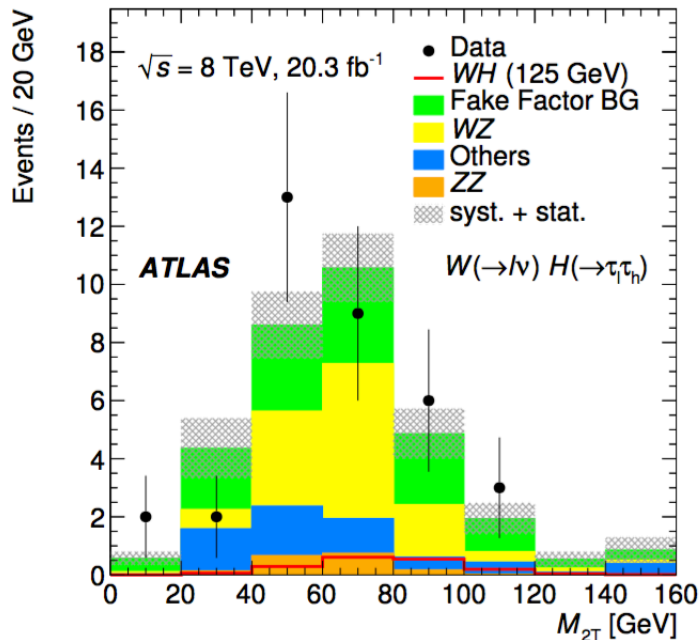
## Muons

- Fake rate was unusable in Run 1 due to trigger/ID inconsistencies
- Now using isolation as selection criteria rather than ID



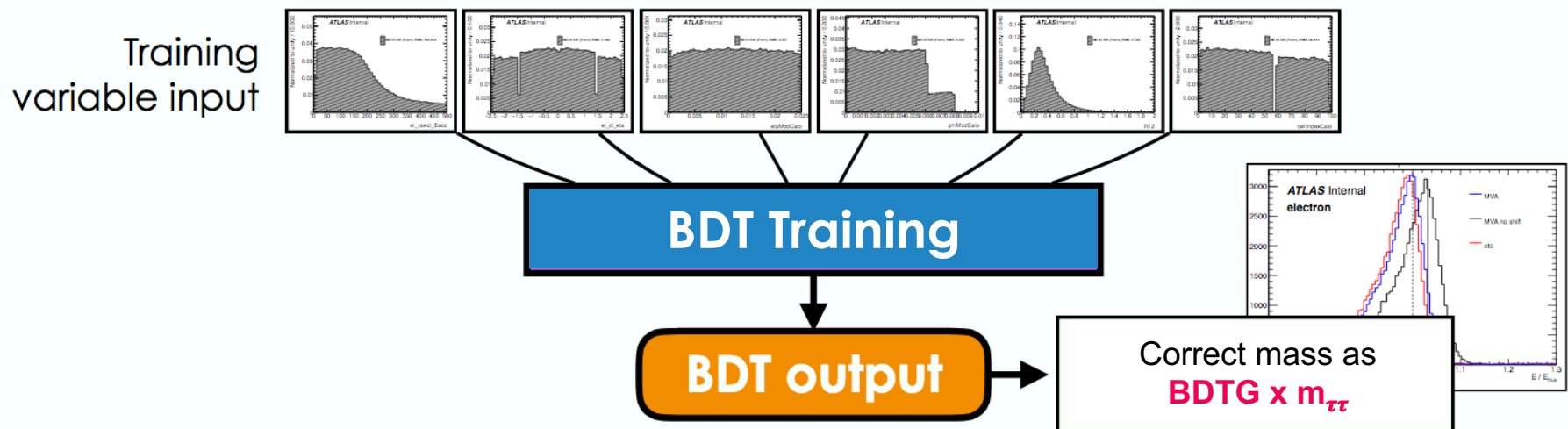
# Mass Reconstruction

- When constructing final di-tau mass spectrum must account for missing mass from neutrinos
- Done separately for ZH (neutrinos only from tau decays) and WH (additional neutrino from W decay)
  - ▷ Technique for WH only gives lower bound on di-tau mass
- This procedure is imprecise → introduces additional uncertainty



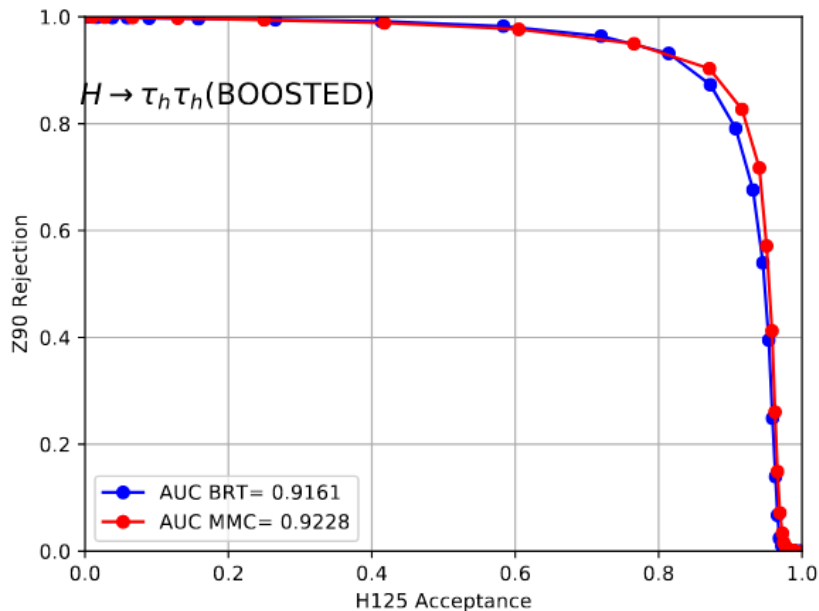
# Mass Reconstruction Improvements

- Can use **Boosted Decision Trees** (BDTs) to improve the missing mass calculation:
  - ▷ Train BDT to **produce mass correction scale factor** using similar input variables as current techniques ( $p_T$ , visible mass, angular separation)
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Same procedure has been successful in other applications:

- ▷ Electron energy re-calibration in E/Gamma
- ▷  $H \rightarrow \tau\tau$  analysis ([BRTs](#))



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- Even more improvements are possible: improving uncertainty calculations, mass spectrum fitting, inclusion of additional analysis categories, and more....
- **Exciting results to come!**

Thanks!

**Any questions?**

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