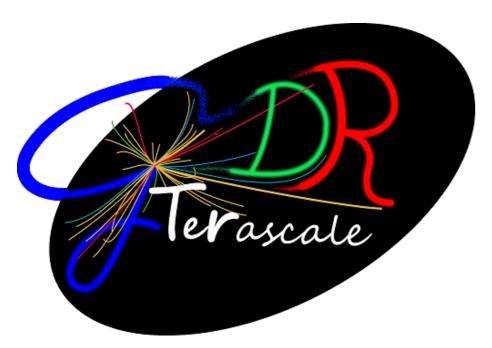




# Evidence for Higgs boson decays to $\tau^+\tau^-$ final states with ATLAS

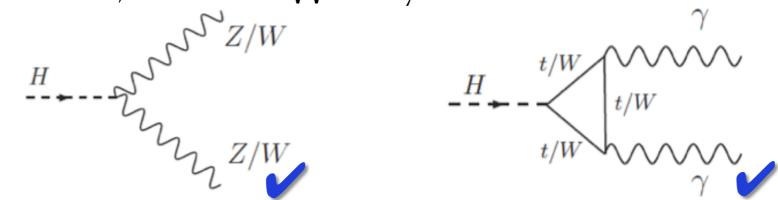


Dimitris Varouchas

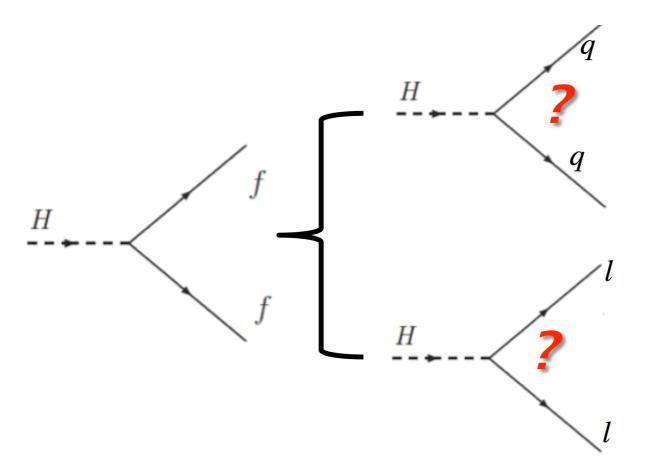
Palaiseau, Ecole Polytechnique, June 3<sup>rd</sup> 2014

#### What did we discover exactly?

Observation via ZZ\*, WW\* and γγ decay modes



- Results strongly favour J<sup>P</sup>=0<sup>+</sup> quantum numbers, consistent with Standard Model predictions
- Is the discovered Higgs boson coupling to fermions?

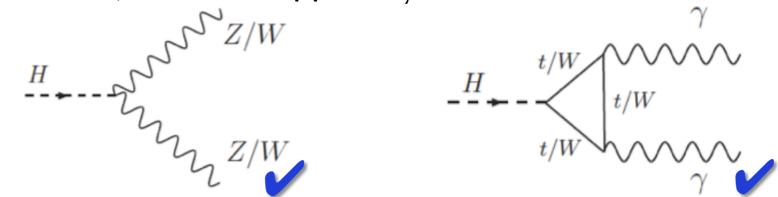


- guarks? Most likely yes, because of the quark loop in gg-fusion/photon decay. Nevertheless a direct measurement to quarks is necessary  $(H \rightarrow bb)$ 

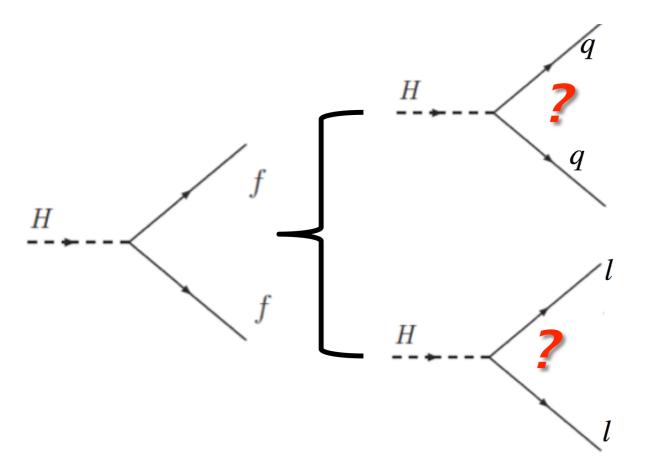
- *leptons?* This is the question that <u>the H→TT analysis is</u> addressing

#### What did we discover exactly?

Observation via ZZ\*, WW\* and γγ decay modes



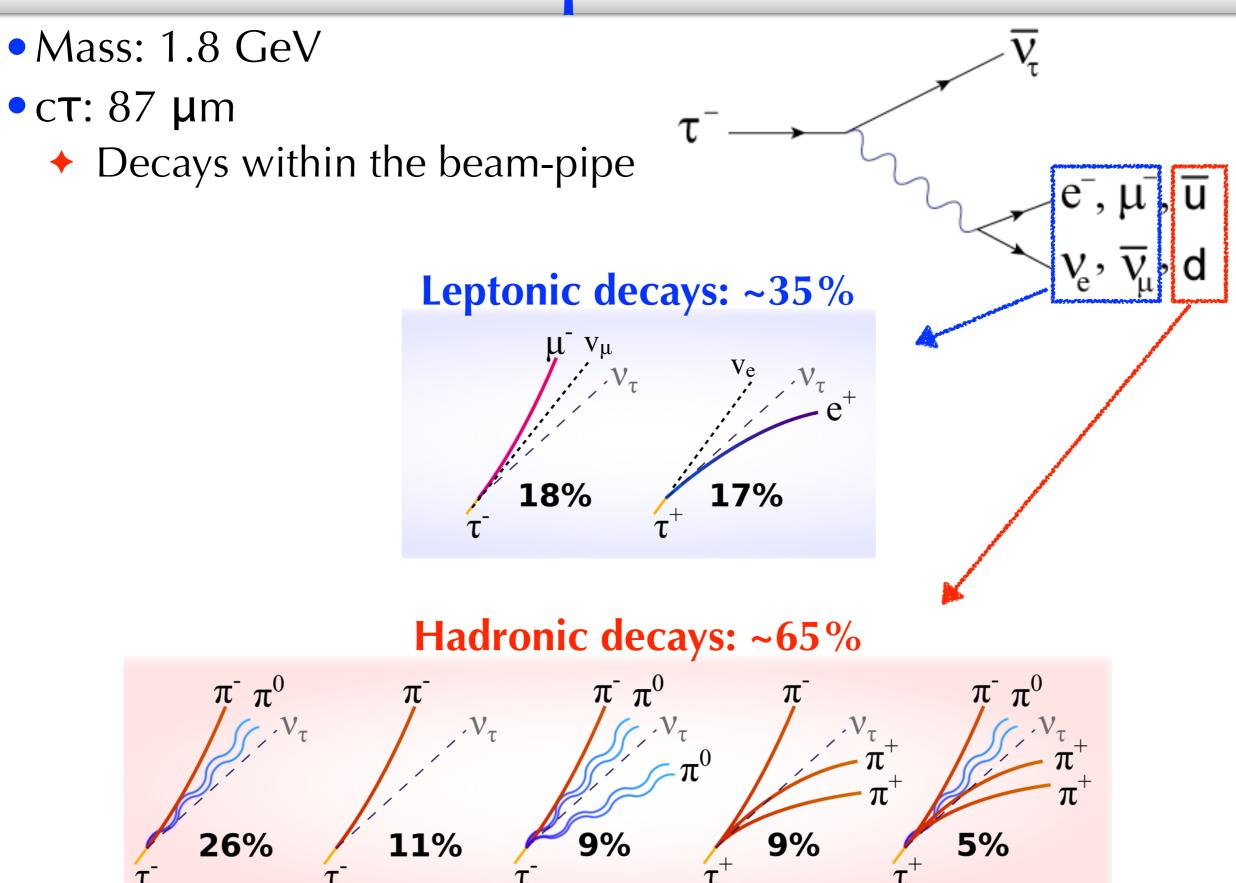
- Results strongly favour J<sup>P</sup>=0<sup>+</sup> quantum numbers, consistent with Standard Model predictions
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- guarks? Most likely yes, because of the quark loop in gg-fusion/photon decay. Nevertheless a direct measurement to quarks is necessary  $(H \rightarrow bb)$ 

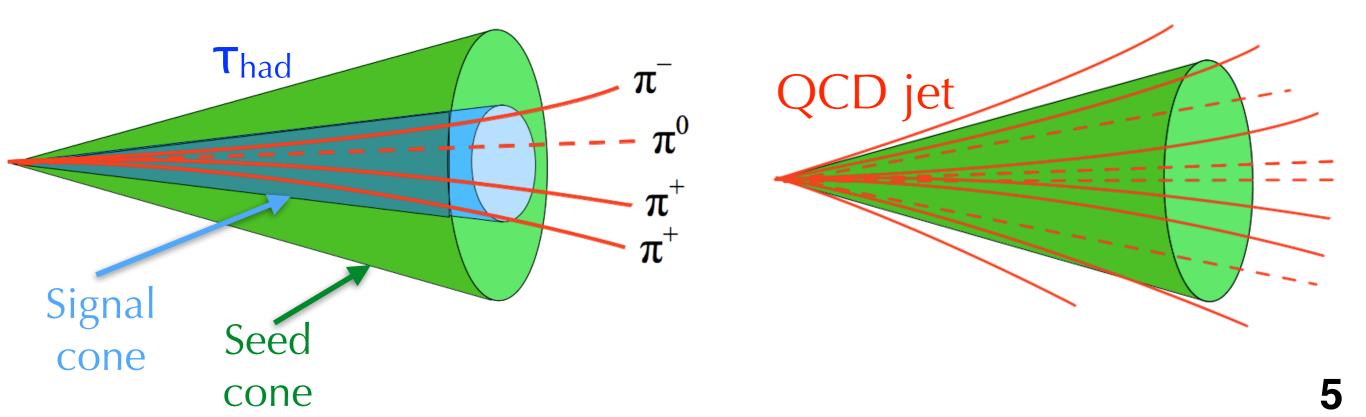
т	ττ	VH(bb)	hh
σ×BR [pb]	~1.4	~0.08	~0.0002

#### Tau lepton trivia



#### Tau (T<sub>had</sub>) reconstruction in ATLAS

- $\tau_{had}$  seed: All jets (cone  $\Delta R < 0.4$  ) that fall within the tracker ( $|\eta| > 2.5$ ,  $p_T > 10$  GeV)
- Classify  $\tau_{had}$ : count number of tracks in signal cone of  $\Delta R$ <0.2 around the jet seed
- $\tau_{had}$  energy: Energy from calo topological clusters in  $\Delta R$ <0.2
- Tau Identification: MVA to separate  $\tau_{had}$  from QCD jets & electrons
- $\tau_{had}$  appears as a narrow jet



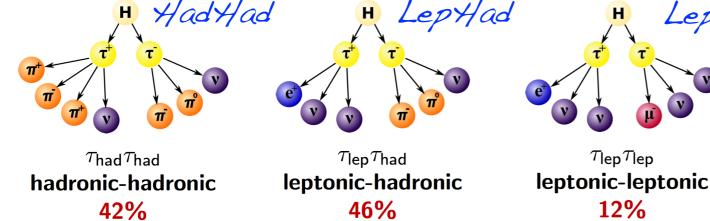
#### $H \rightarrow \tau \tau$ search: Analysis concept

- Does the Higgs boson with  $m_{H} \approx 125.5$  GeV decay to a pair of  $\tau$ -leptons?
- Analysis strategy
  - Achieve maximum sensitivity by performing a multivariate analysis: **Boosted Decision Trees (BDT)**
  - ◆ Analyse full 2012 LHC dataset: 20.3 fb<sup>-1</sup> @ 8 TeV → <u>ATLAS-CONF-2013-108</u>

 $\tau_{\rm lep} \tau_{\rm lep}$ 

12%

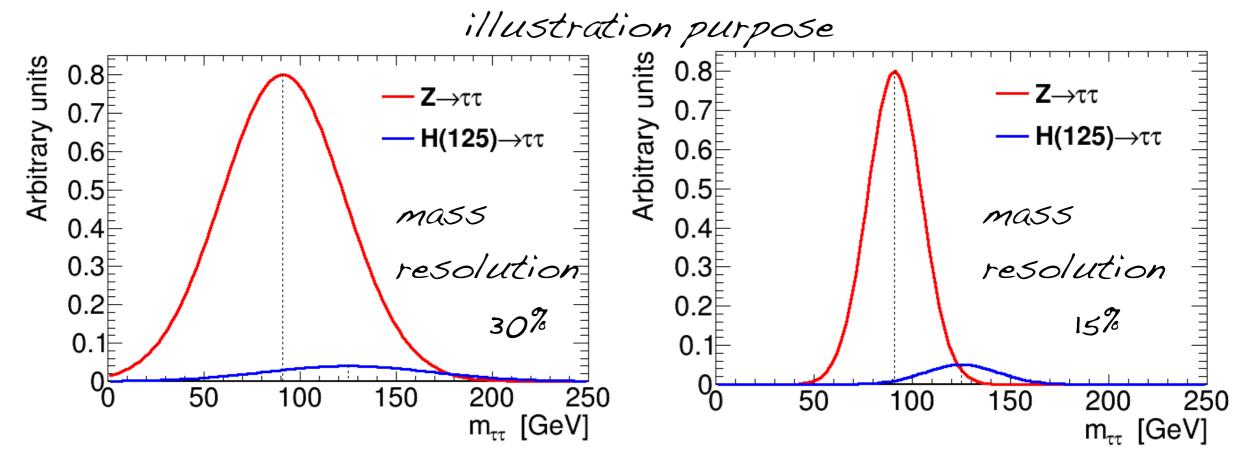
• Perform analysis in 3 channels according to the  $\tau$  lepton decay



- And in 2 categories per channel
  - VBF: 2 jets with leading(sub-leading)  $p_T > 50(30)$  GeV,  $\Delta \eta$ (jj)>3
  - **Boosted:**  $p_T(H) > 100 \text{ GeV}$ ,  $p_T(H)$ :  $\vec{E}_T^{\text{miss}} + \vec{p}_T(\tau_1) + \vec{p}_T(\tau_2)$
- Different **BDT** per channel and per category: **6** BDT's
  - Keep simple selection and let the **BDT separate signal and background**
  - Final discriminant: BDT score

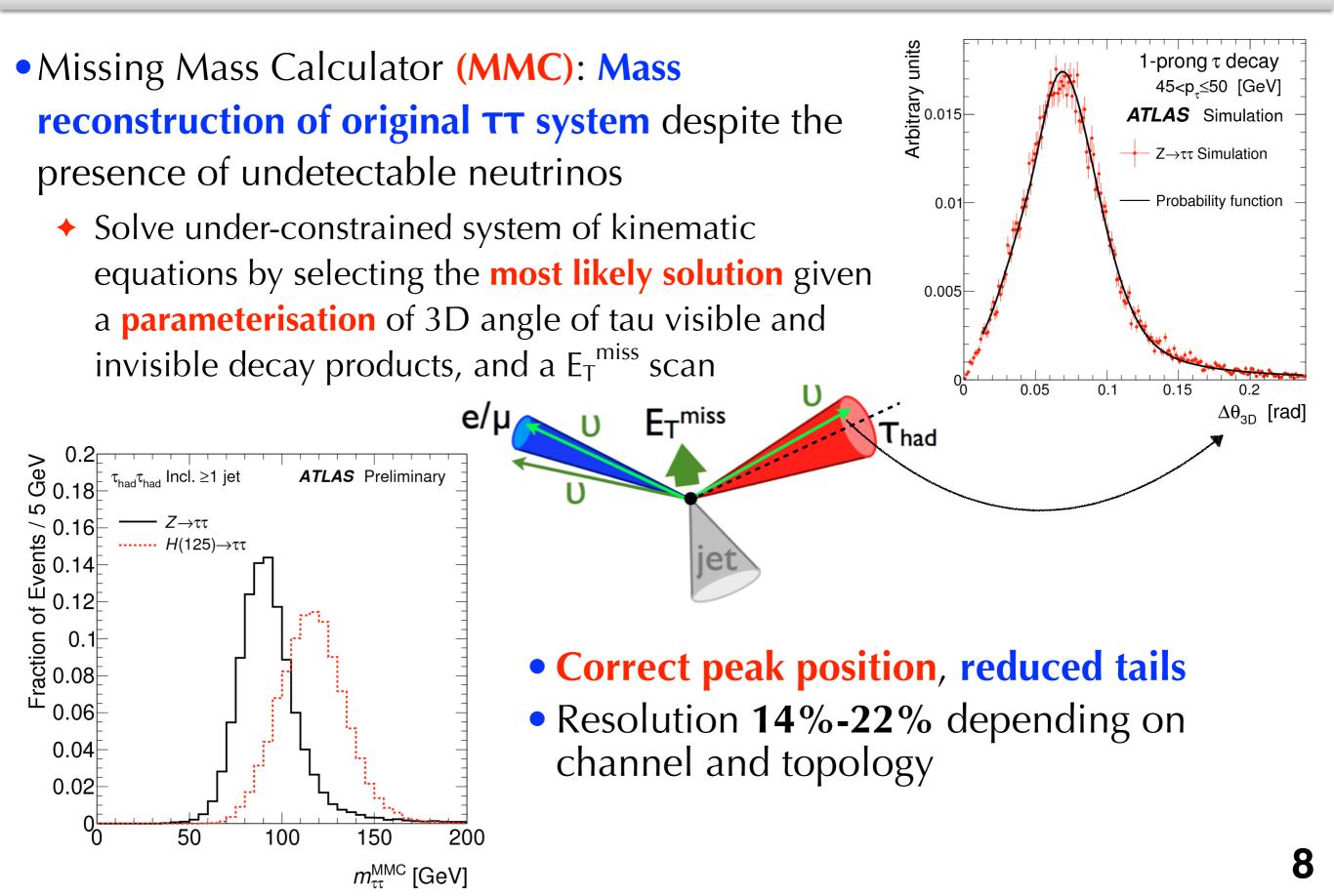
#### DiTau mass reconstruction: MMC

- **Challenge**: Separate the signal from the dominant irreducible  $Z \rightarrow \tau \tau$
- Most efficient way: Precise estimation of the mass of the system di-τ: m<sub>ττ</sub>
  - Challenging task because neutrinos escape detection
    - The only way: Rely on E<sub>T</sub><sup>miss</sup> to get an estimation of the transverse energy of the neutrinos



A good mass reconstruction is **essential** for the  $H \rightarrow \tau \tau$  search

#### DiTau mass reconstruction: MMC



## Estimating the backgrounds

#### Dominant Z→TT

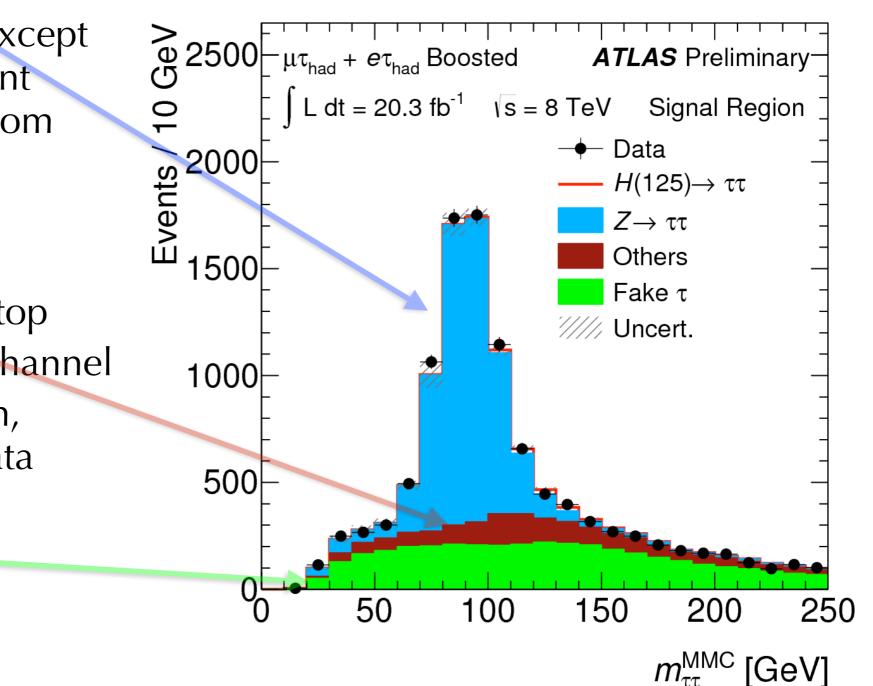
 ◆ Embedded samples: Except for tau decays, all event properties are taken from data Z→µµ events

#### Others –

- Di-boson,  $Z \rightarrow ee/\mu\mu$ , top
- + H→WW for LepLep channel
- Shape from simulation, normalisation from data

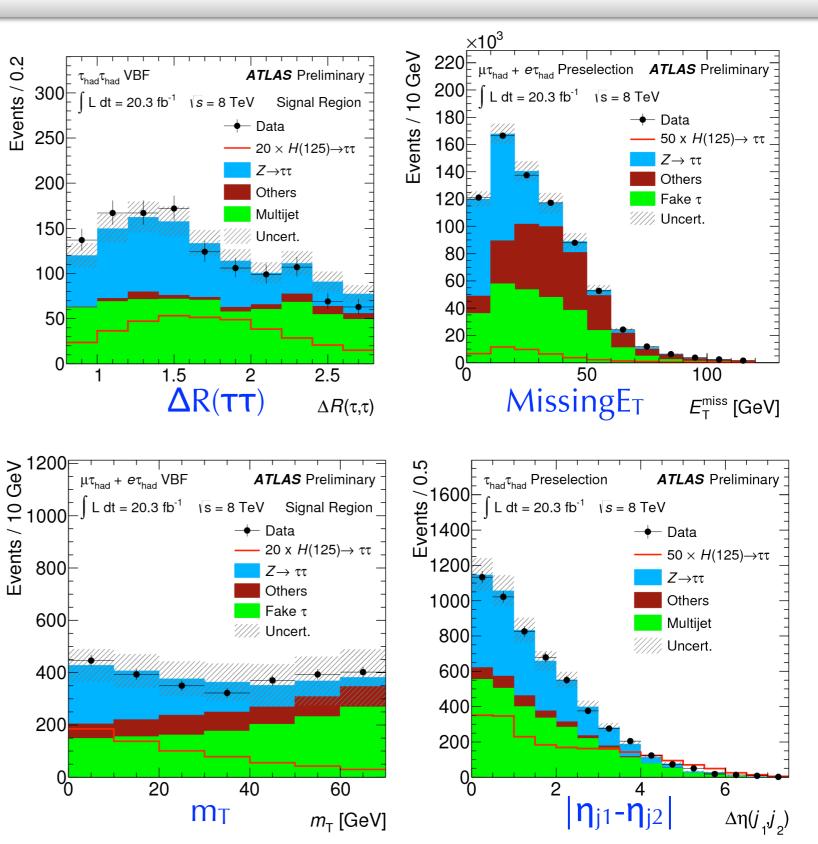
• Fake **T** 

- Multijet, W+jets
- Data-driven methods



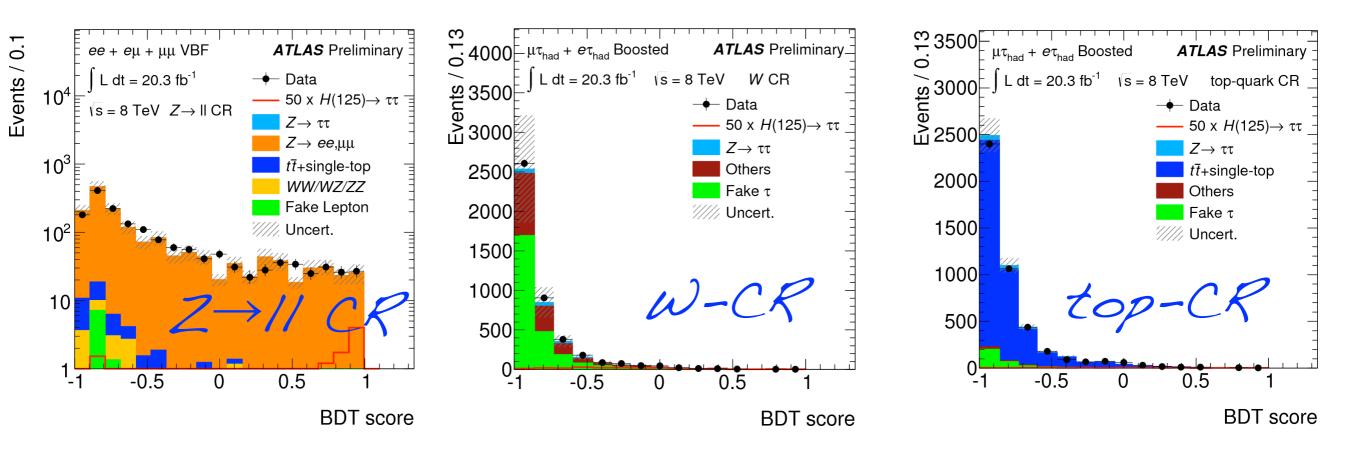
#### Input variables to BDT

- Probe resonance properties
  - $m_{MMC}(\tau \tau), \Delta R(\tau \tau)$
- Explore event topology
  - MissingE<sub>T</sub>, m<sub>T</sub>, object
     centralities, high p<sub>T</sub> objects
     sum
- VBF specific, for the 2 VBF jets:
  - Different hemispheres
     η<sub>j1</sub>×η<sub>j2</sub>
  - ♦ Separation |η<sub>j1</sub>-η<sub>j2</sub>|
  - Invariant mass m<sub>j1j2</sub>



#### Building trust in the background model

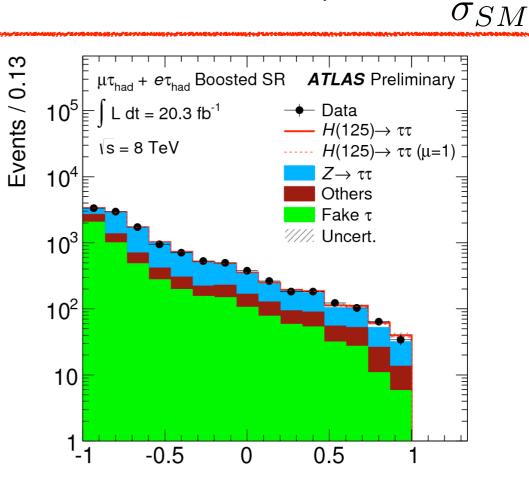
- Checked modelling of all input variables at preselection, signal regions, control regions
- Checked the BDT score in control regions



**Good agreement in all BDT distributions** 

#### Signal extraction using the BDT score

- We fit the **Background** + **µ**×**Signal** model to the data using the BDT score distributions
- Bins in the BDT score are ordered by signal purity. Signal like events populate the highest BDT score bins
- Simultaneous fit in 6 SR and 5 CR with common systematic nuisance parameters



parameter of interest:  $\mu =$ 

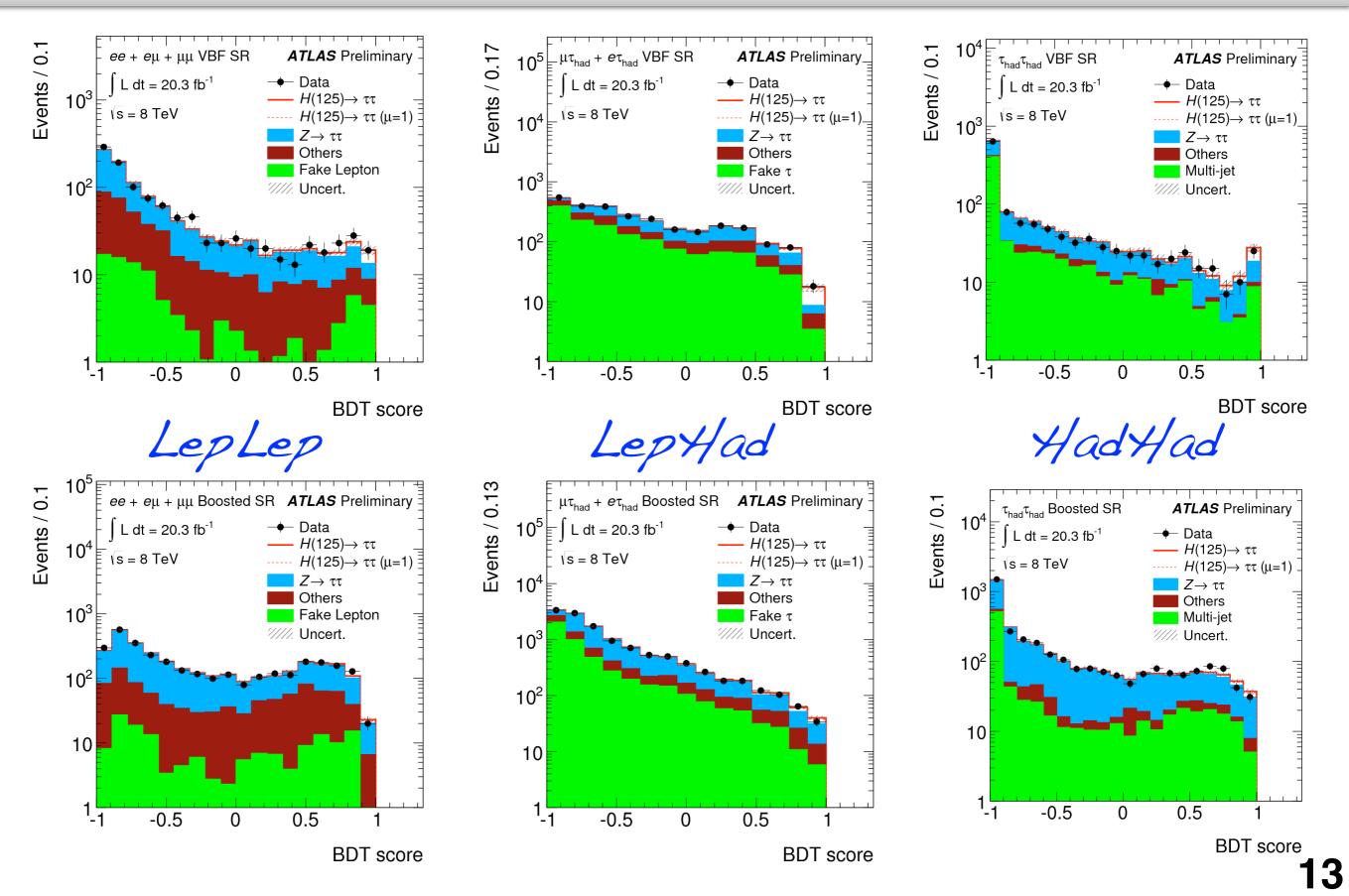
BDT score

 $\sigma_{measured}$ 

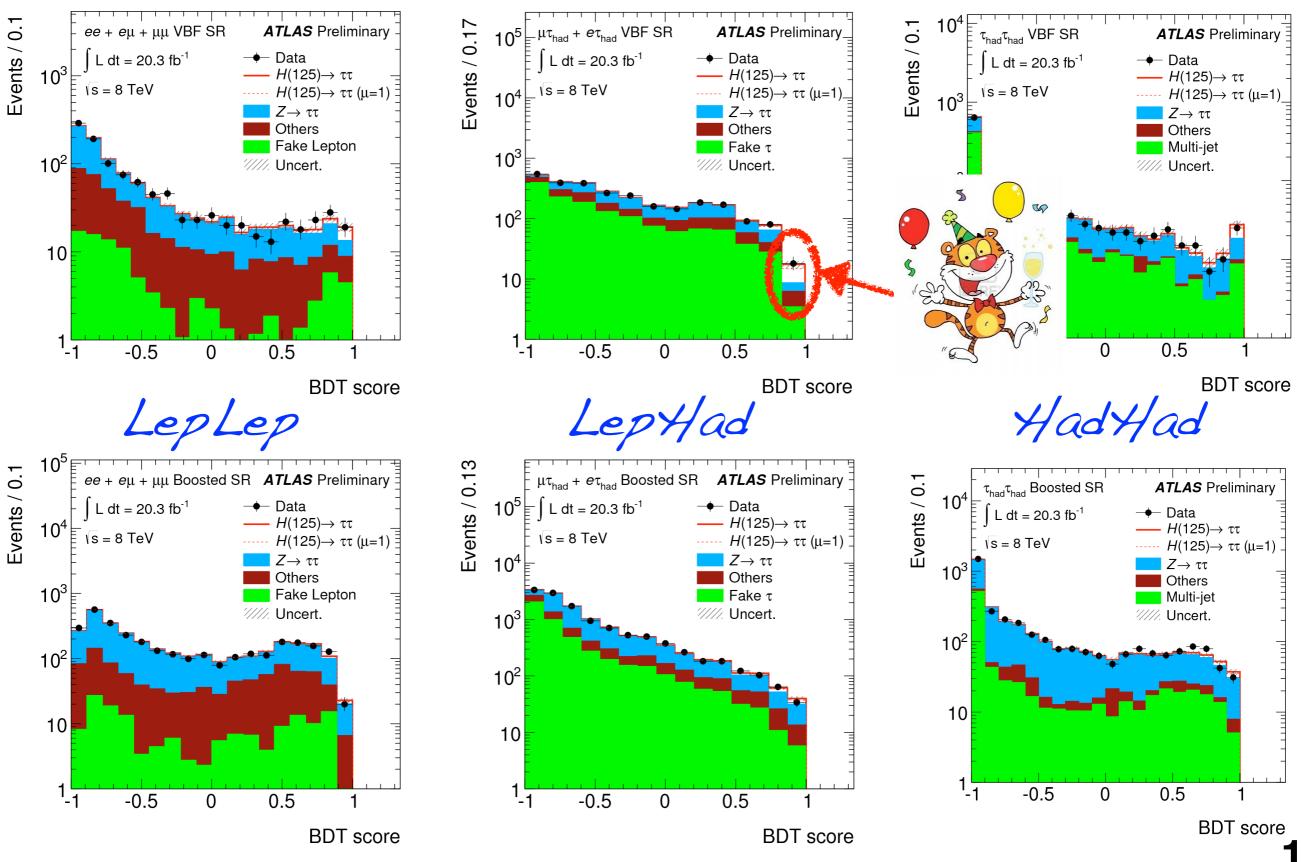
	VBF Category			<b>Boosted Category</b>	Non VBF, Non Boosted	
	SR	CR	SR	CR	CR	
H→τ <sub>lep</sub> τ <sub>lep</sub>	~	✓ Z→II (I bin) & Top (I bin)	>	✓ Z→II (I bin) & Top (I bin)	×	
$H \rightarrow \tau_{lep} \tau_{had}$	~	✓ Z→II (I bin) & Top (I bin)	>	✓ Z→II (I bin) & Top (I bin)	×	
$H \rightarrow \tau_{had} \tau_{had}$	~	×	~	×	$\checkmark$ Δη(τ <sub>1</sub> ,τ <sub>2</sub> ) (shape)	

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#### **BDT scores in Signal Regions**

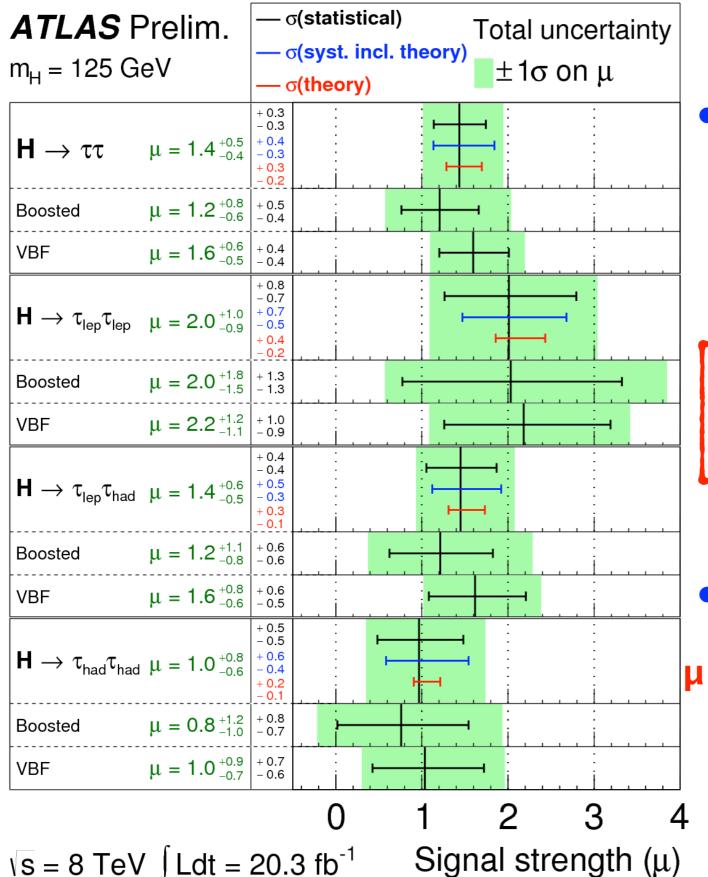


#### **BDT scores in Signal Regions**



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## Signal Strength µ



Measured signal strength

- +  $\mu = 1.4^{+0.5}$ -0.4
- Boosted category:  $\mu = 1.2^{+0.8}$ -0.6
- VBF category: μ = 1.6 +0.6 -0.5

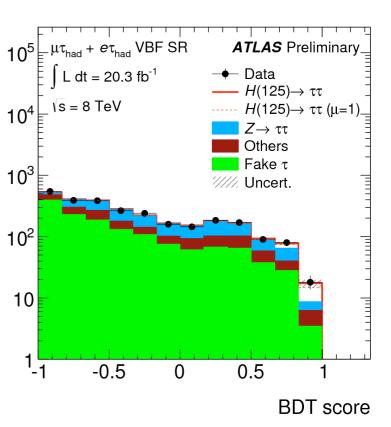
Consistent with SM Higgs boson predictions !

Breakdown of the uncertainties

 $\mu = 1.4 \pm 0.3$ (stat.)  $^{+0.3}_{-0.2}$ (syst.)  $^{+0.3}_{-0.2}$ (theory)

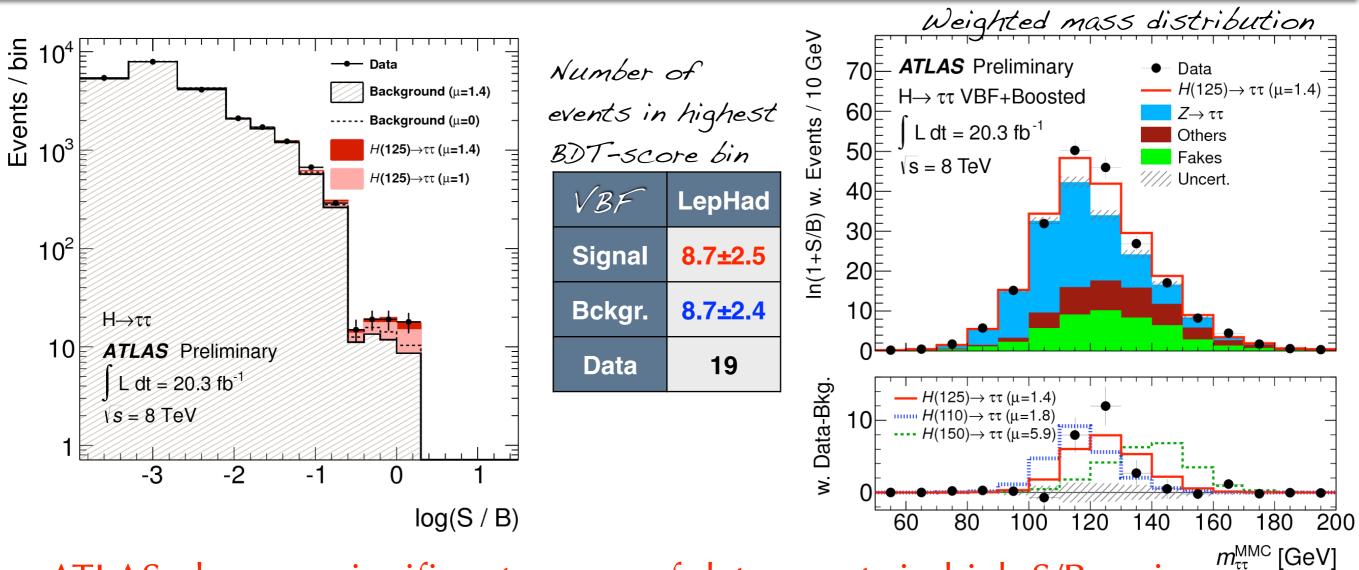
## Leading Uncertainties

Source of Uncertainty	Uncertainty on $\mu$	$\mu = 1.4^{+0.5}$ -0.4
Signal region statistics (data)	0.30	
$Z \rightarrow \ell \ell$ normalization ( $\tau_{\text{lep}} \tau_{\text{had}}$ boosted)	0.13	$\sum_{n=1}^{\infty} 10^5 \mu \tau_{had} + e \tau_{had} \text{VBF SR} AT$
$ggF d\sigma/dp_T^H$	0.12	$\int L dt = 20.3 \text{ fb}^{-1}$
JES $\eta$ calibration	0.12	$10^4 = 10^4 = 10^8 = 8 \text{ TeV}$
Top normalization ( $\tau_{lep} \tau_{had}$ VBF)	0.12	
Top normalization ( $\tau_{lep} \tau_{had}$ boosted)	0.12	
$Z \rightarrow \ell \ell$ normalization ( $\tau_{\text{lep}} \tau_{\text{had}} \text{ VBF}$ )	0.12	10 <sup>2</sup>
QCD scale	0.07	
di- $ au_{had}$ trigger efficiency	0.07	10
Fake backgrounds ( $\tau_{lep}\tau_{lep}$ )	0.07	
$ au_{had}$ identification efficiency	0.06	1 -0.5 0 0.
$Z \rightarrow \tau^+ \tau^-$ normalization $(\tau_{\rm lep} \tau_{\rm had})$	0.06	
$ au_{had}$ energy scale	0.06	



- Leading uncertainty due to **little statics** in the **high BDT score bins** that drive the best fit value
- **Theory uncertainty** ranked high
- Leading experimental uncertainties come from the **background normalisation**

#### H→TT significant excess observed



• ATLAS observes significant excess of data events in high S/B region

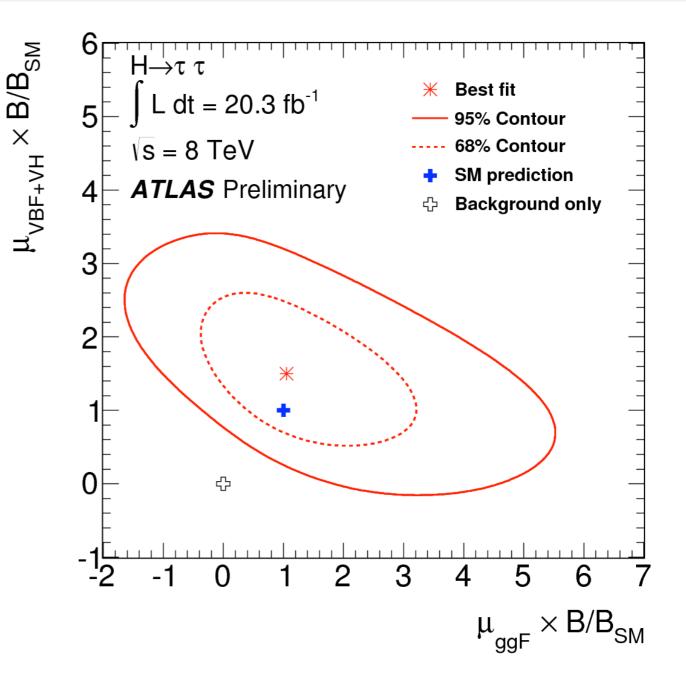
- **Expected** significance @ m<sub>H</sub>=125 GeV : **3.2σ** (Probability: **6.6×10<sup>-4</sup>**)
- **Observed** significance @  $m_H = 125 \text{ GeV} : 4.1\sigma$  (Probability:  $2 \times 10^{-5}$ )
- Excess observed in all three channels

**Observed signal compatible with m<sub>H</sub>=125 GeV** 

• Direct evidence of 4.1 $\sigma$  that the Higgs boson couples to leptons 1

#### Production Mechanisms

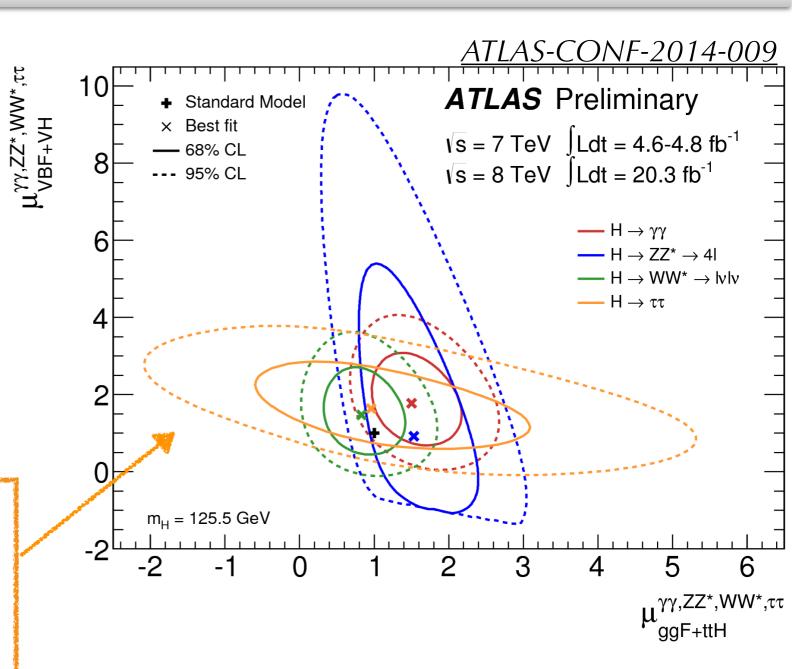
- Best fit sits comfortably away from null hypothesis
- Compatible with Standard Model expectation within the 68% contour



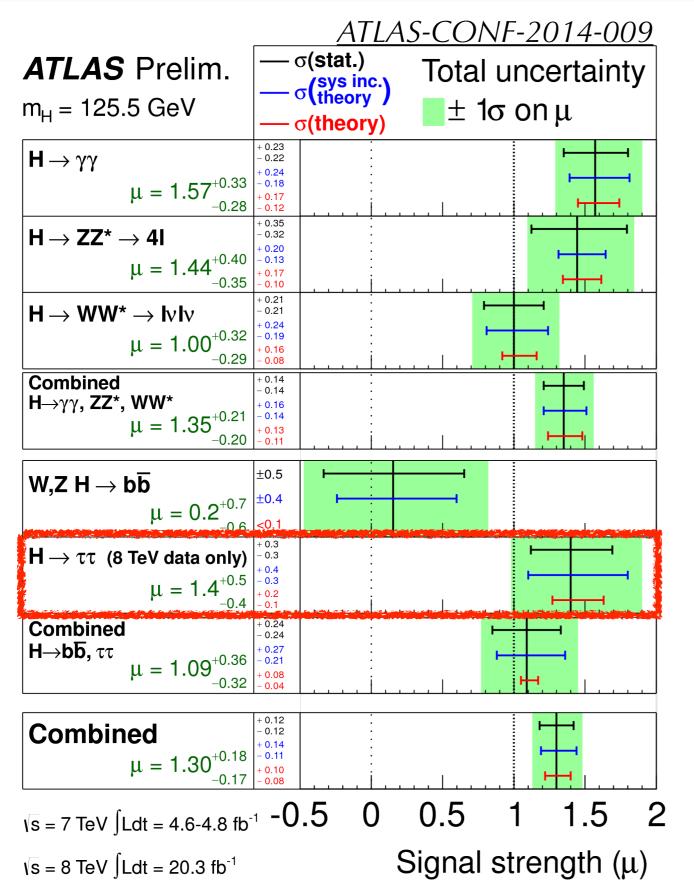
## Production Mechanisms

- Best fit sits comfortably away from null hypothesis
- Compatible with Standard Model expectation within the 68% contour

 H→ττ most sensitive to the VBF mode (good constraint for the ATLAS combination)



## Epilogue



- ATLAS observed 4.1σ evidence for H→TT decays, consistent with SM Higgs boson predictions
- This analysis paves the road for H→TT property measurements during Run II



Muon

BF

Jet

Electror

MTT=127 GeV

BDT=0.99

Run: 204153 Event: 35369265 2012-05-30 20:31:28 UTC

Jet2

Muon

MET

Electron

#### Back-up index

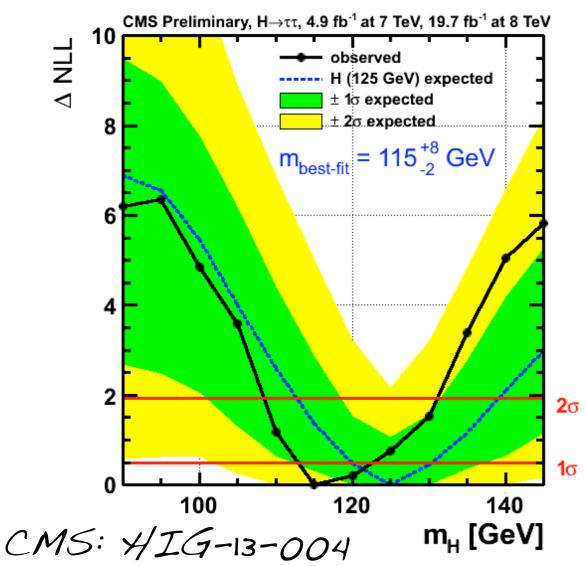
• <u>Tau's</u>



- Η→ττ
  - <u>Backgrounds</u>
  - <u>Categories</u>
  - <u>BDT</u>
  - <u>Fit Model</u>
  - <u>Results Detailed</u>
  - EventYields
  - <u>MMC</u>
- <u>BDT's</u>

• <u>H to other fermions</u>

#### ATLAS Vs CMS



	CMS	ATLAS
obs. p	3.4	4.1
exp. p	3.6	3.2
signal strength µ	0.9 ± 0.3	μ = 1.4

- **Results** of two experiments are **similar**
- Both ATLAS and CMS observe an evidence of the H→TT
- Excess is compatible with SM  $H \rightarrow \tau \tau$ within 1 $\sigma$  for both cases
- Hard to compare in detail, analyses approach differs
- ATLAS uses an MVA, while CMS a cut-based
  - CMS performs a mass measurement:  $m_H = 115 + B_{-2} GeV$
- Other important differences
  - CMS has analysed 2011 dataset as well and includes additional VH channels with V decaying leptonically

## Tau Identification (TauID)

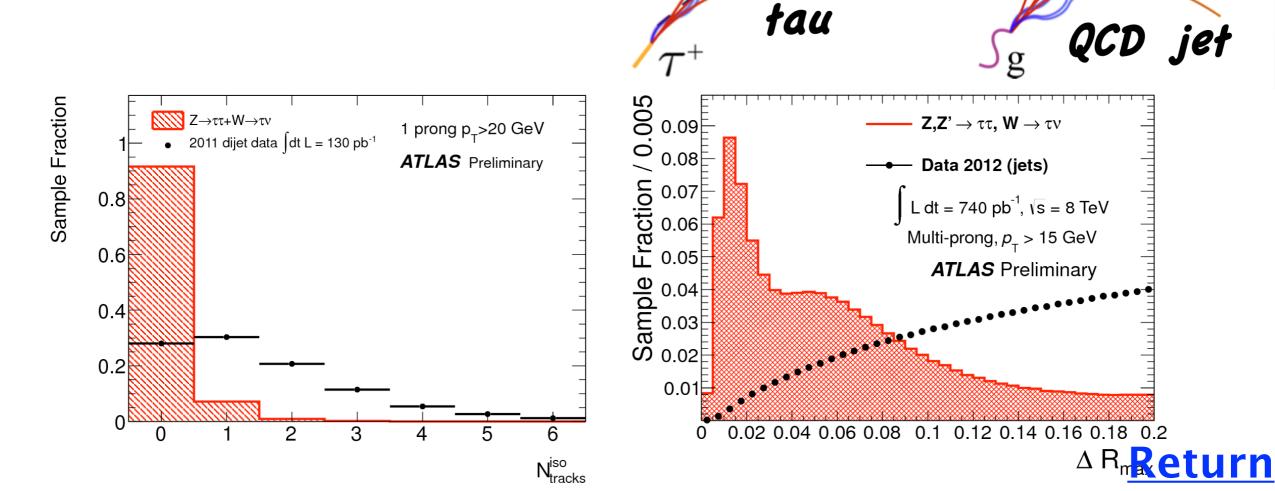
 $\pi^{\pi}\pi^{0}$ 

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#### TauID: Distinguish τ<sub>had</sub> from QCD jets and electrons

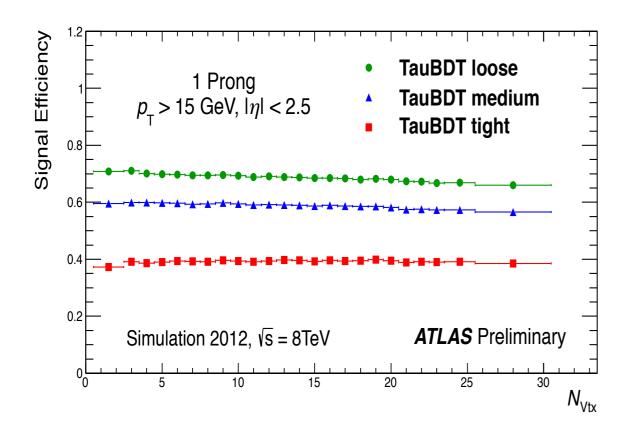
• Use a number of discriminating variables based on tau properties: isolation, energy profiles, fractions of EM & Had energy, angular distances

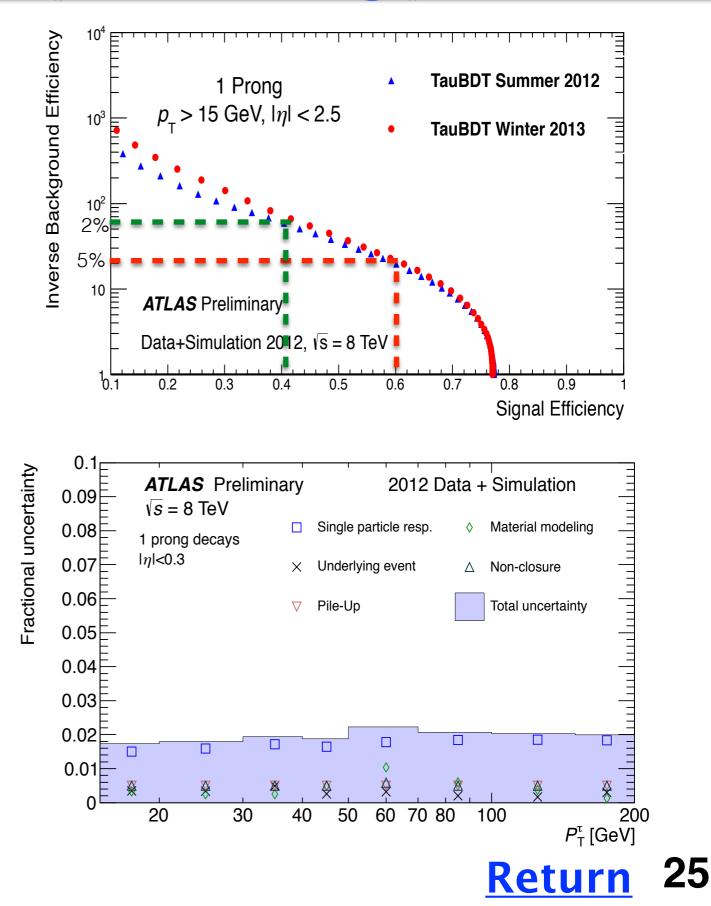
 Combine all variables separately for 1p and 3p tau decays using an MVA discriminator: BDT



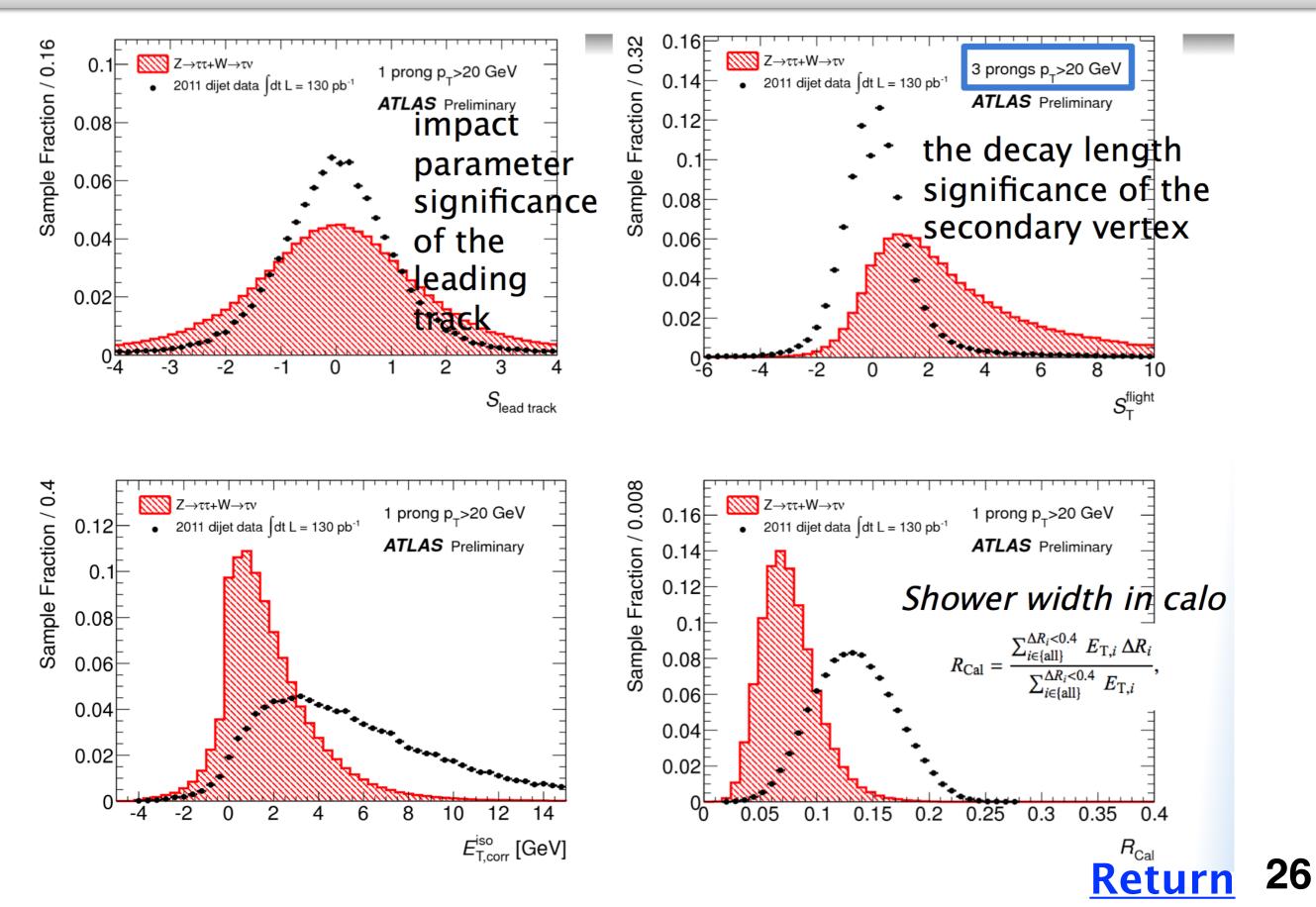
## TauID efficiency, energy scale

- H→TT uses ~60% and ~40% signal efficiency working points
- TauID robust against pile-up
- Overall tau energy scale uncertainty 2-3%
  - Derived from MC and test-beam data
  - Single particle response the largest contribution

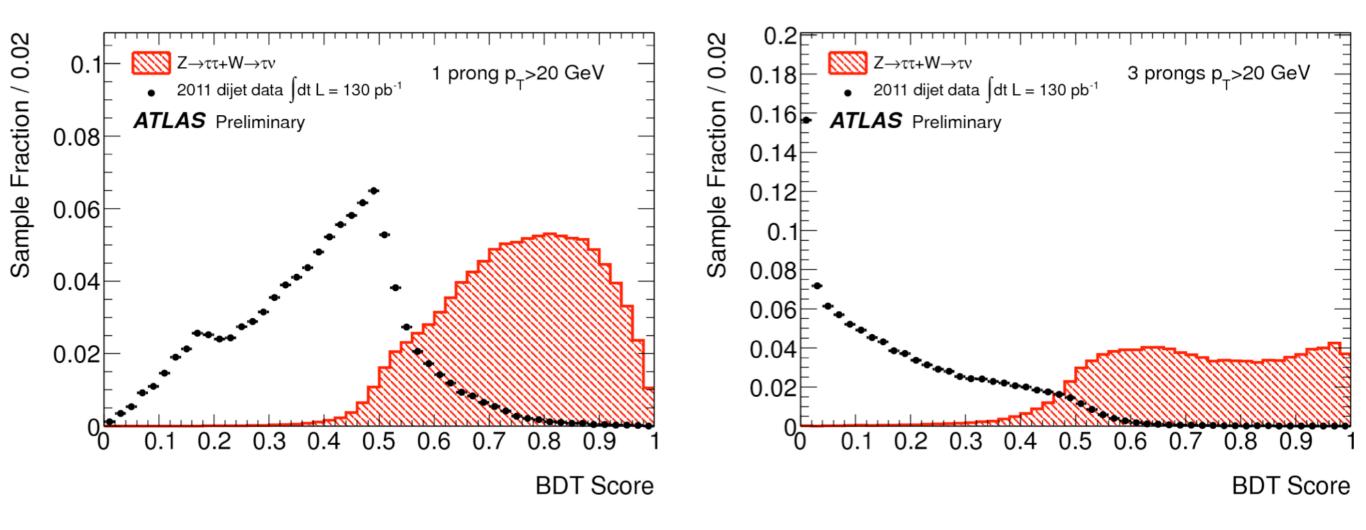




#### TauID variables



#### TauBDT score



#### Return 27

#### TauID efficiency

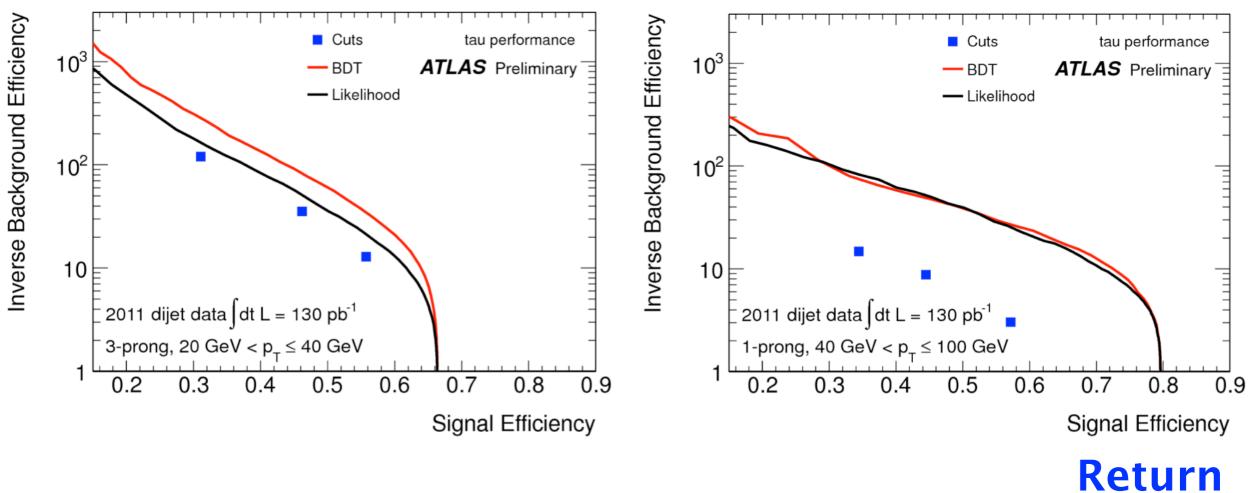
#### Signal efficiency: MC: $Z \rightarrow \tau$ , $W \rightarrow \tau v$

 $\varepsilon_{\text{sig}}^{n-\text{prong}} = \frac{(\text{\# of tau candidates with } n \text{ reconstructed tracks, passing ID})}{(\text{\# of true visible hadronic tau decays with } n \text{ prongs})}$ 

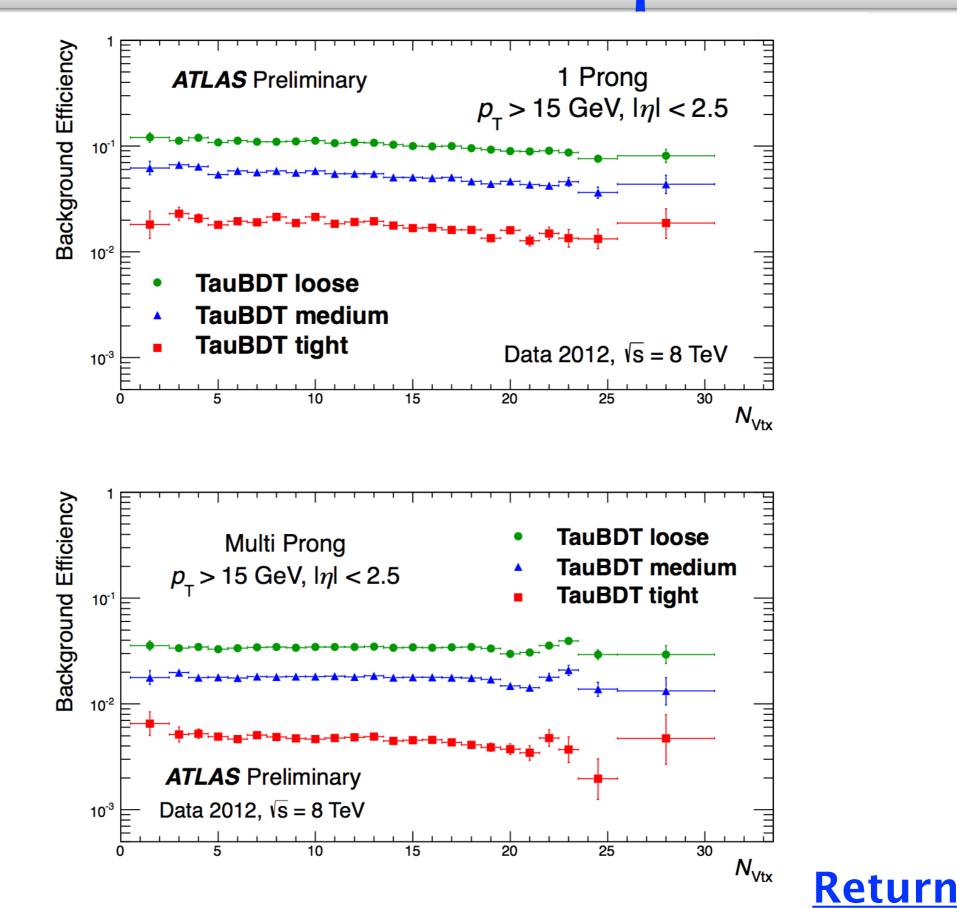
Background efficiency:

#### Data: Dijet sample

 $\varepsilon_{bkg}^{n-prong} = \frac{(\# \text{ of tau candidates with } n \text{ reconstructed tracks, passing ID})}{(\# \text{ of tau candidates with } n \text{ reconstructed tracks})}$ 

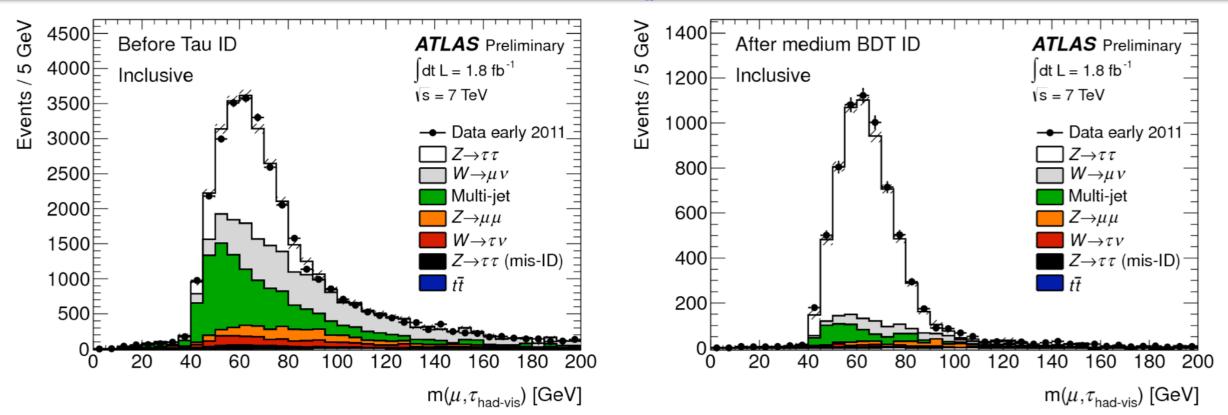


#### TauID Pile-Up



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## TauID Efficiency measurement



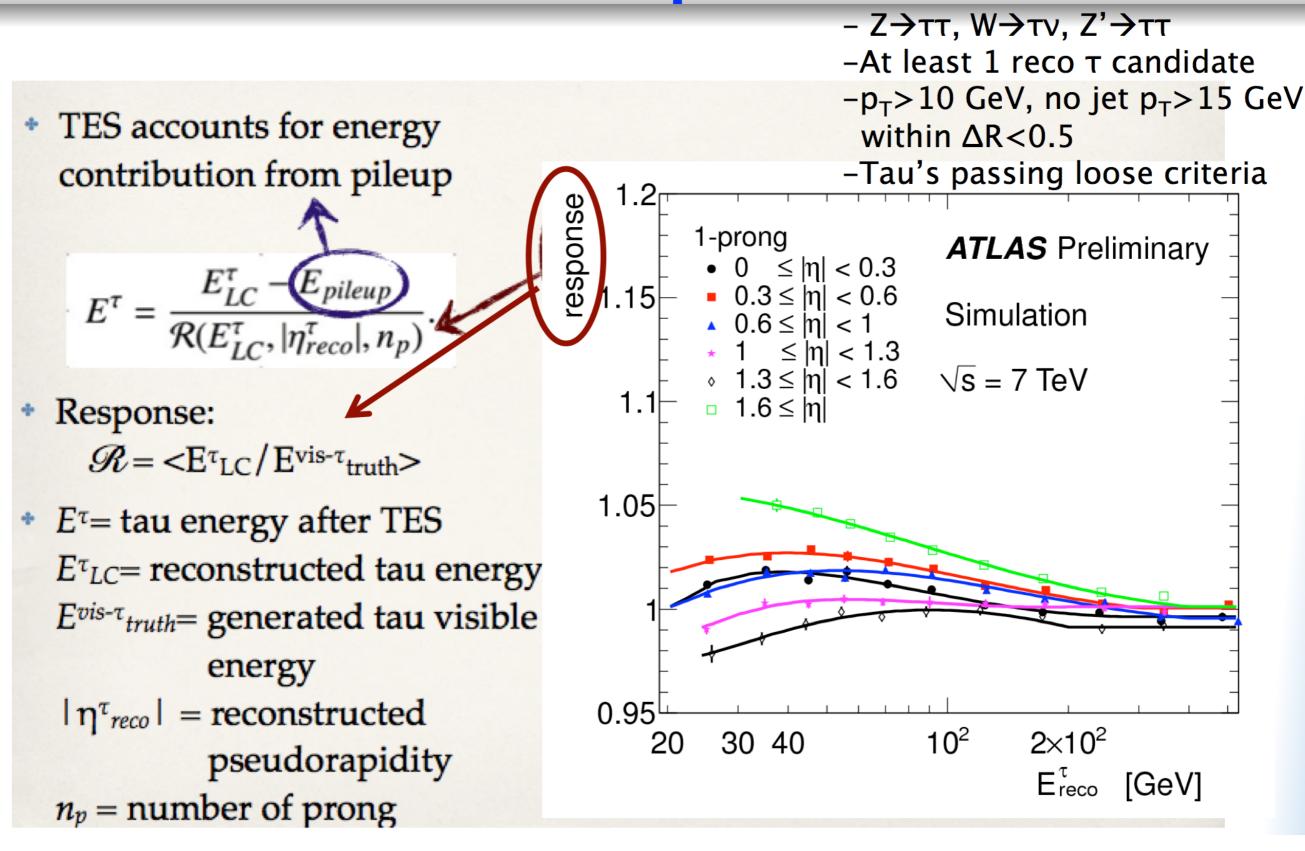
- Use well-known SM processes to test Data-MC agreement, using tag-probe
- $Z \rightarrow \tau_{had} \tau_I$  Use lepton to tag and tau to probe
- $C_{\text{data/MC}}^{\text{id}} = rac{arepsilon_{ ext{Data}}^{ ext{id}}}{arepsilon_{ ext{MC}}^{ ext{id}}}$

Good purity achieved

			Uncertainty contributions (%)				
ID	$\varepsilon_{\rm MC}(\pm {\rm stat})$	$\boldsymbol{\varepsilon}_{\mathrm{Data}}$	$\Delta \varepsilon_{\rm stat}$	$\Delta \varepsilon_{W+jets}$	$\Delta \epsilon_{\rm QCD}$	$\Delta \varepsilon_{\mathrm{exp.}}$	$\Delta \varepsilon_{\text{Total}}$
BDT loose	$0.748 \pm 0.003$	0.822	2.3	0.3	3.9	2.2	5.1
BDT medium	$0.534 \pm 0.003$	0.574	2.5	0.3	4.2	2.2	5.4
BDT tight	$0.282 \pm 0.003$	0.297	2.9	0.3	4.3	2.2	5.8
LLH loose	$0.833 \pm 0.002$	0.936	2.0	0.3	3.3	2.2	4.5
LLH medium	$0.607 \pm 0.003$	0.669	2.3	0.3	3.9	2.2	5.1
LLH tight	$0.332 \pm 0.003$	0.358	2.8	0.3	4.3	2.2	5.6

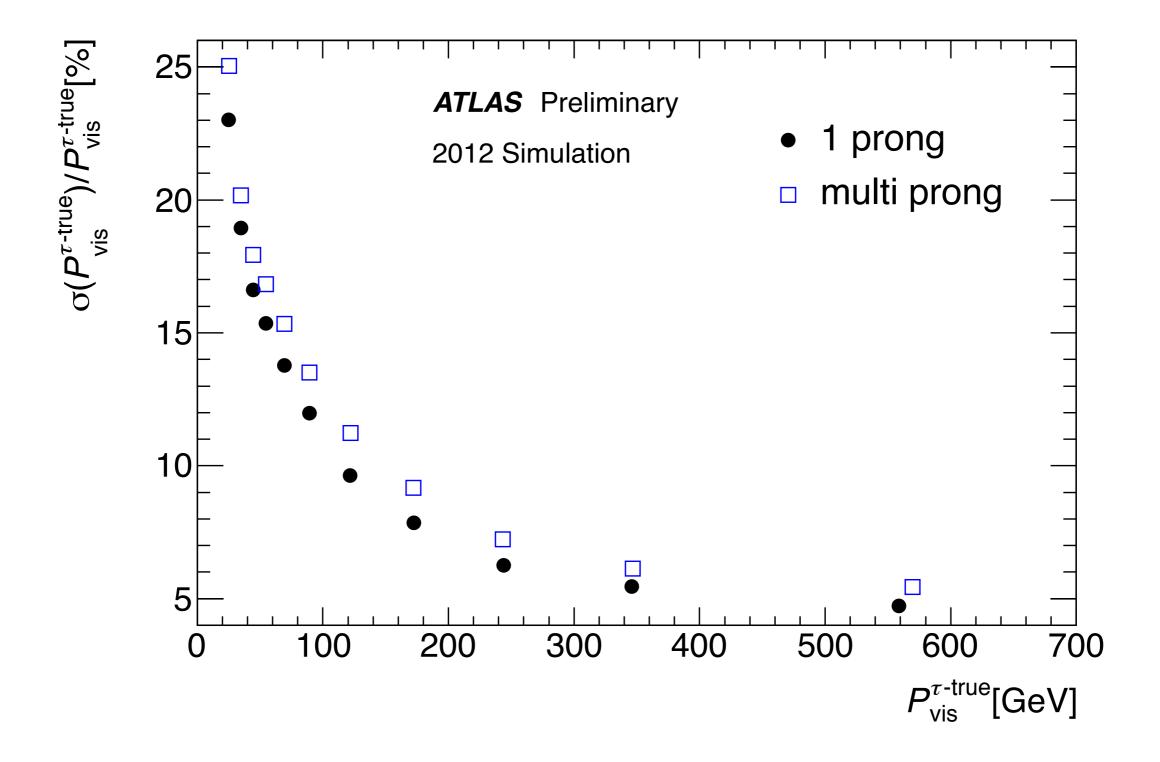
Return

#### TES response



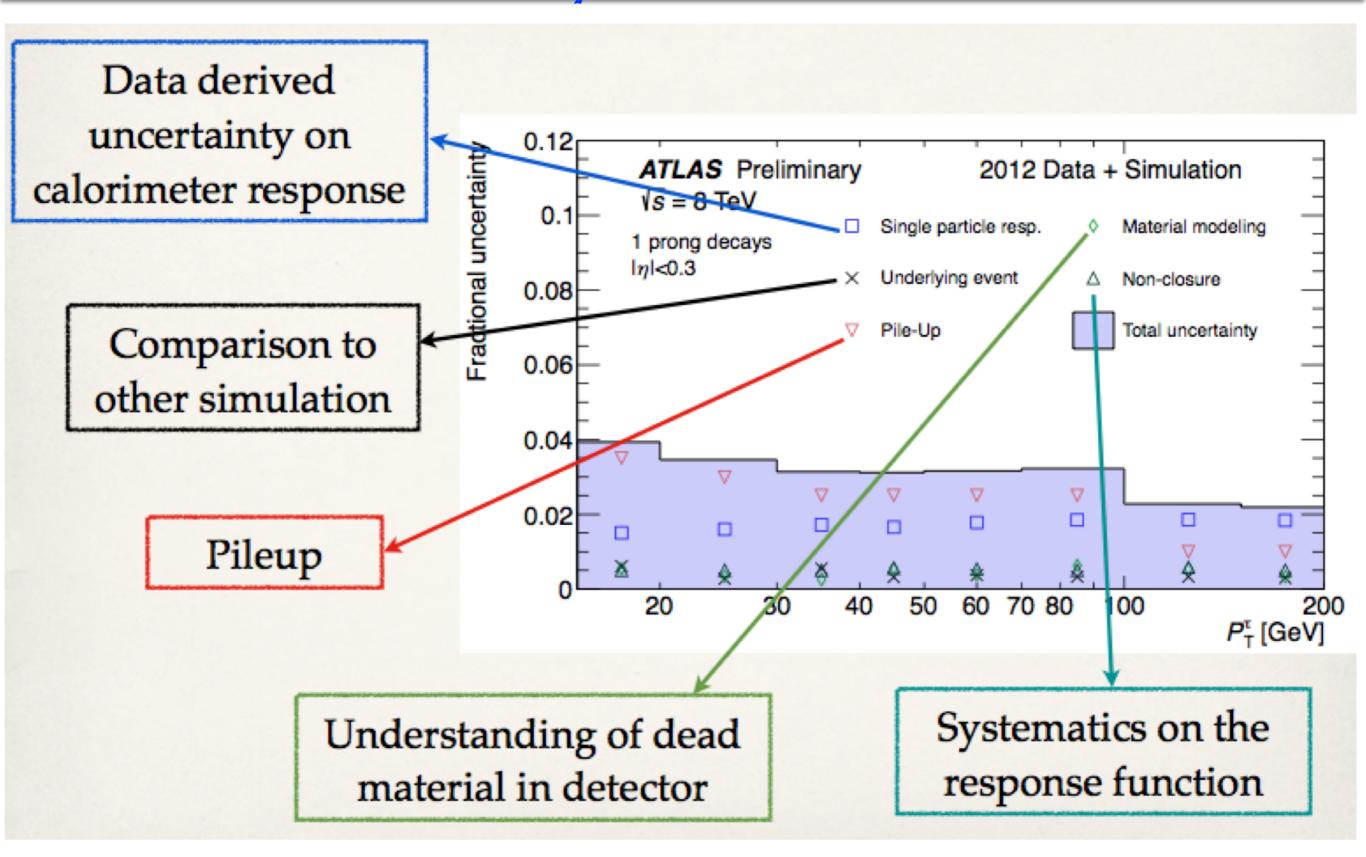
<u>Return</u> 31

## Tau energy resolution



#### Return 32

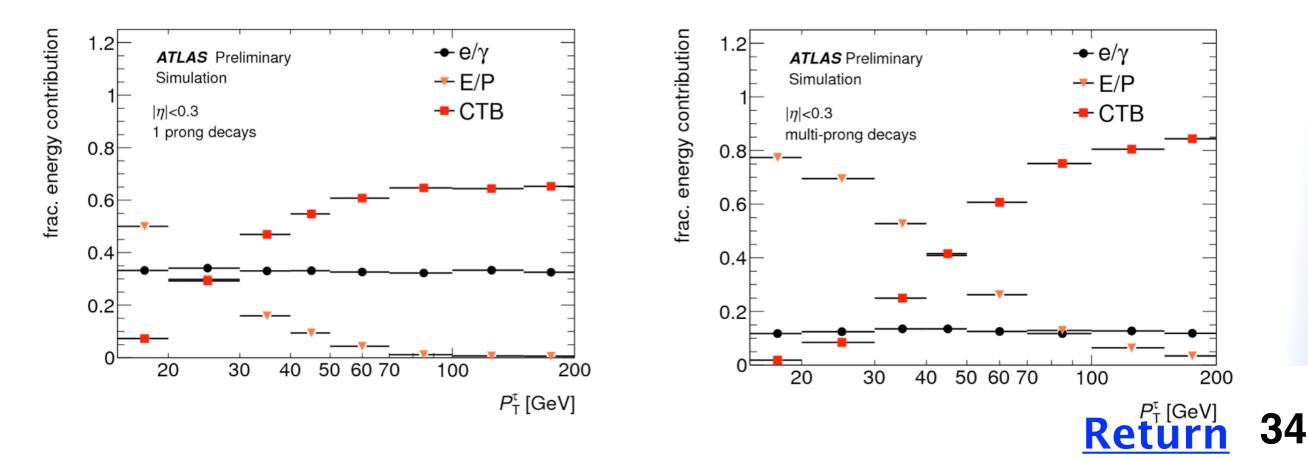
#### **TES systematics**



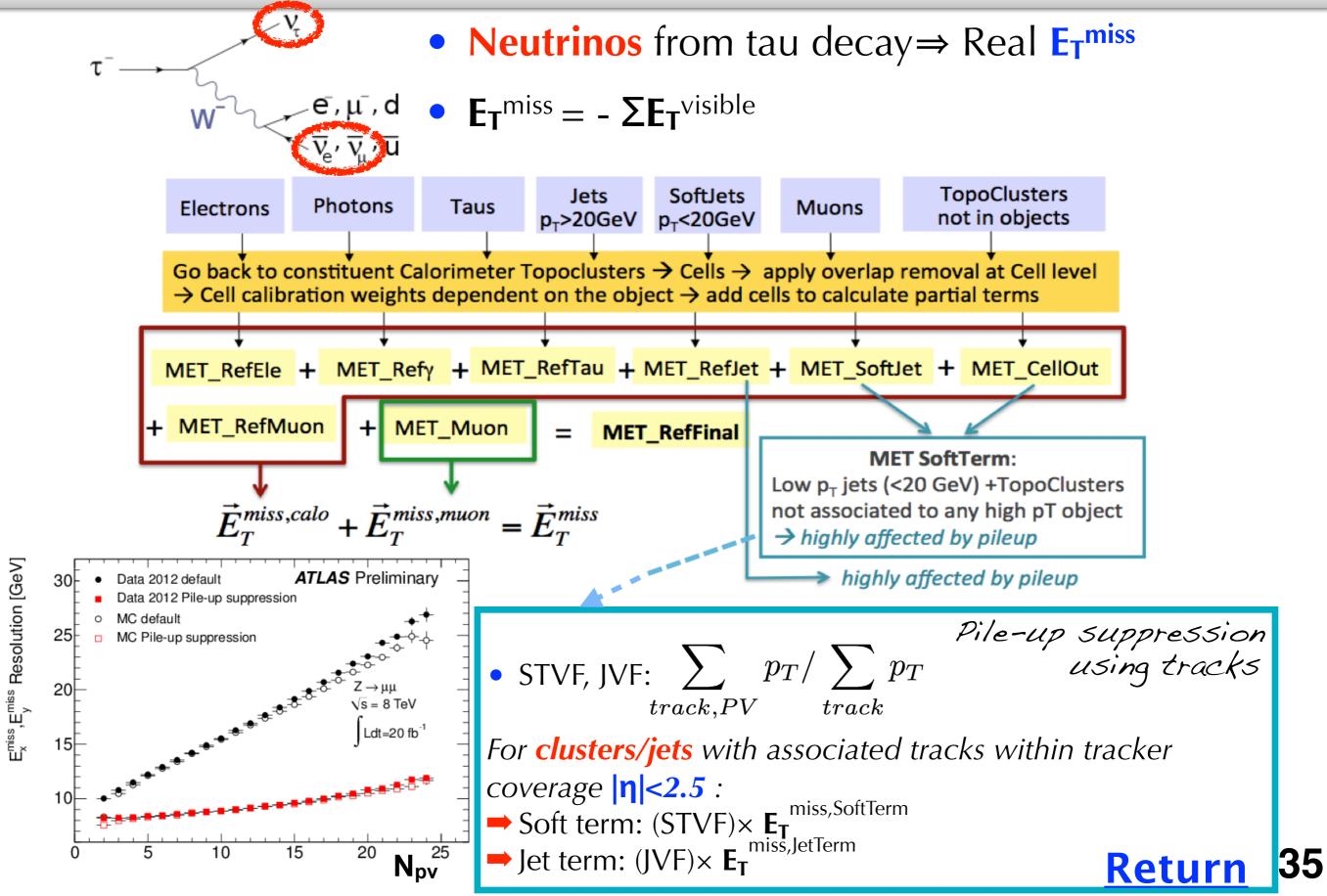
#### <u>Return</u> 33

#### Single particle response

- Determine calorimeter response uncertainty using single particle response, by decomposing the the tau to its decay products and convolving the constituents' response with the tau particle composition
- The response of the calorimeter to single charged pions is derived from one of three sources depending on the particle kinematics
  - > P<20GeV for  $|\eta|$ <1.7 and P<60GeV for 1.7< $|\eta|$ <2.5: in-situ (E/P) measurements
  - > High momentum in central region  $|\eta| < 0.8$ , combined test beam
  - > High momentum outside central region ( $|\eta|$ >0.8) use simulation

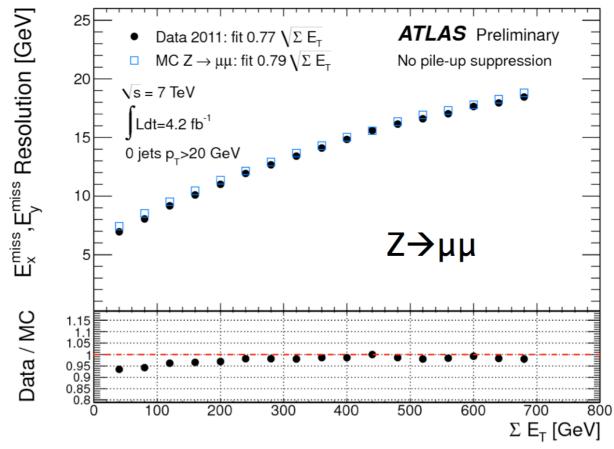


#### E<sub>T</sub>miss reconstruction



## Et miss systematics

- Uncertainties on the scale and resolution of objects (leptons/taus/ jets need are propagated to the MET
- Soft term uncertainty is evaluated separately



- Mean Data/MC discrepancy as the systematic uncertainty
- 5% in MET scale and 2% in MET resolution, treated uncorrelated (conservative approach)

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Retur

- Data/MC ratios have weak dependence on pile-up
- Pile-up affects resolution but well described in MC

## Fake Factor method

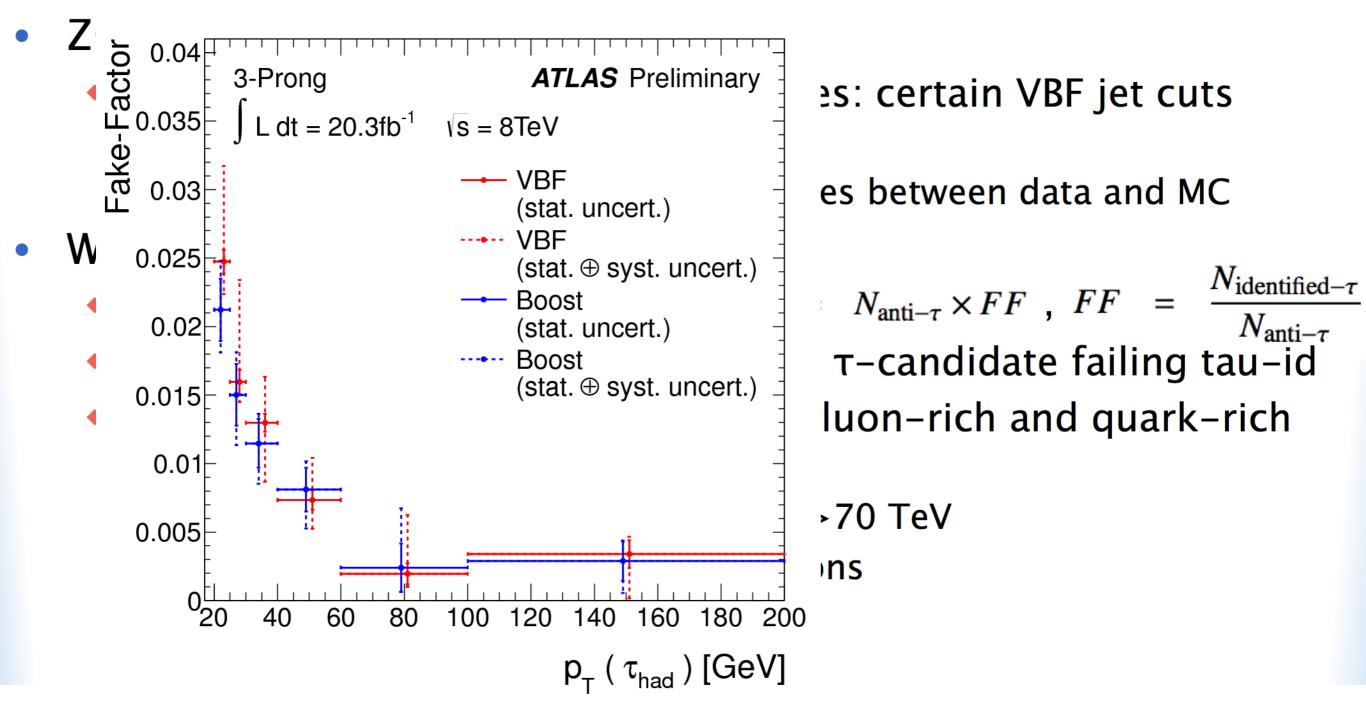
- Tight selection: not enough events left to estimate background
- Z→ττ , Z→II
  - Using MC Alpgen VBF-filtered samples: certain VBF jet cuts applied in generator level
    - $|\Delta \eta_{jj}|$  re-weighted to correct differences between data and MC
- W, QCD, top
  - Using fake factor (FF) method:  $N_{Bkg.}^{Est.} = N_{anti-\tau} \times FF$ ,  $FF = \frac{N_{identified-\tau}}{N_{anti-\tau}}$
  - $N_{anti-\tau}$  in a CR similar to VBF, with the  $\tau$ -candidate failing tau-id
  - FF separated into FF<sub>QCD</sub> and FF<sub>w</sub> for gluon-rich and quark-rich samples

Return

- $FF_W$  measured in W control region  $m_T > 70$  TeV
- FF<sub>QCD</sub> measured in CR with loose leptons

## Fake Factor method

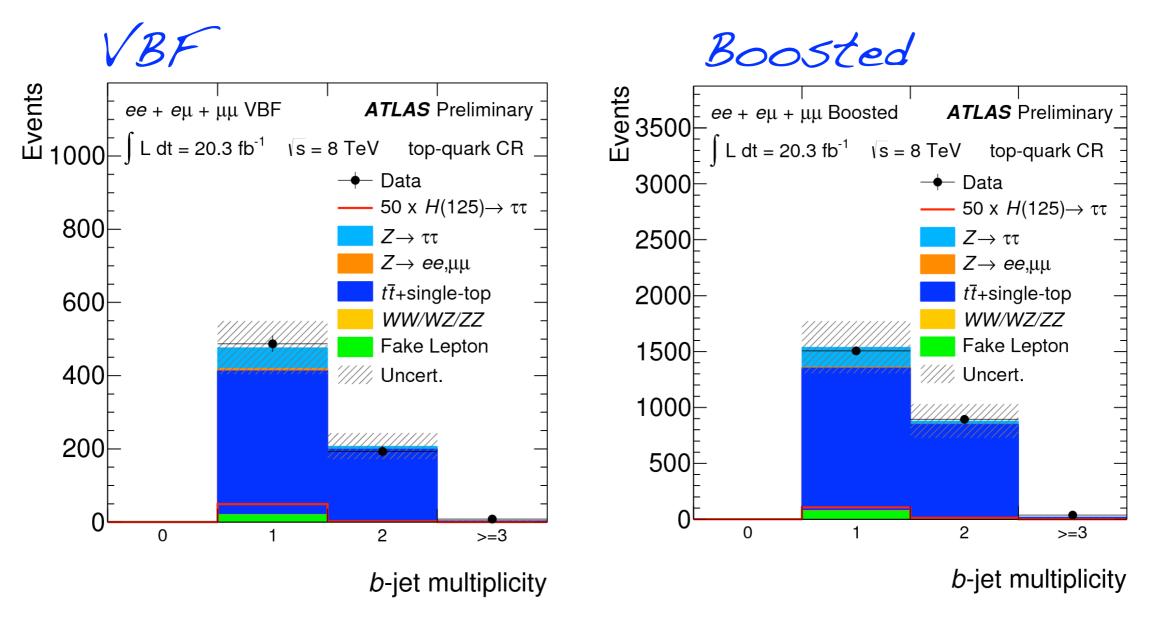
Tight selection: not enough events left to estimate background





## Top background

- Shape from simulation
- Normalisation from data control region
  - Done separately for Boosted and VBF categories



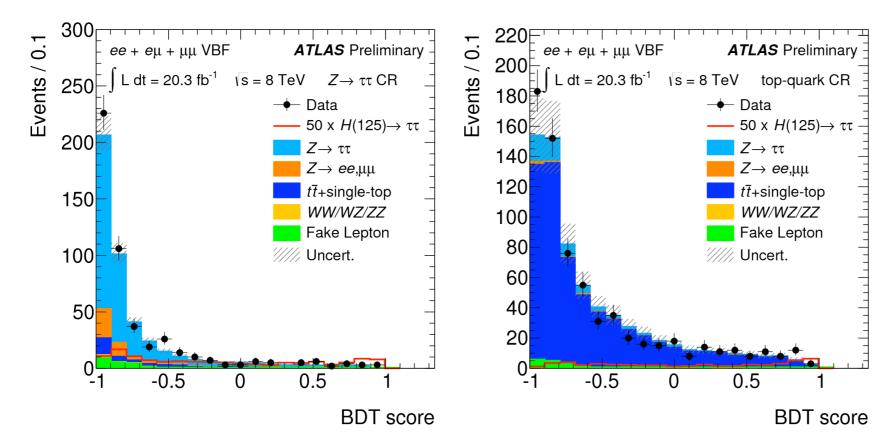
Return 39

### LepLep Control Regions

- $Z \rightarrow \ell \ell$ -enriched: for same-flavour events, the  $m_{\tau\tau}^{\text{vis}}$  selection is changed to 80 GeV <  $m_{\tau\tau}^{\text{vis}}$  < 100 GeV.
- $Z \rightarrow \tau \tau$ -enriched:  $m_{\tau\tau}^{\text{HPTO}} < 100 \text{ GeV}$ , where  $m_{\tau\tau}^{\text{HPTO}}$  is the invariant mass, obtained using the collinear approximation, calculated only with high  $p_{\text{T}}$  objects.

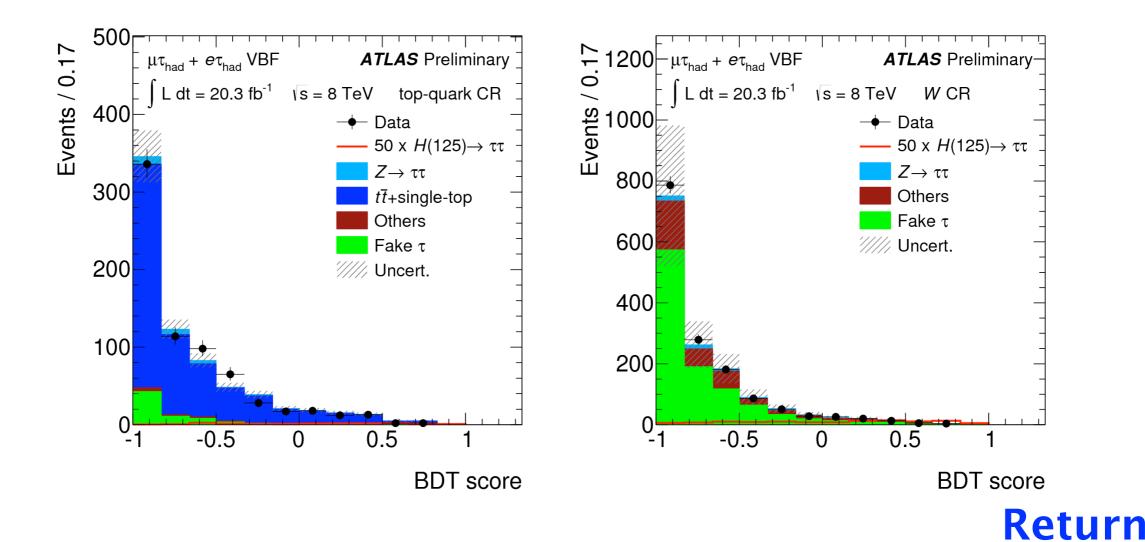
Return

- $t\bar{t}$  -enriched: invert b-jet veto.
- Fake-enriched: same sign lepton events.
- Low BDT score.



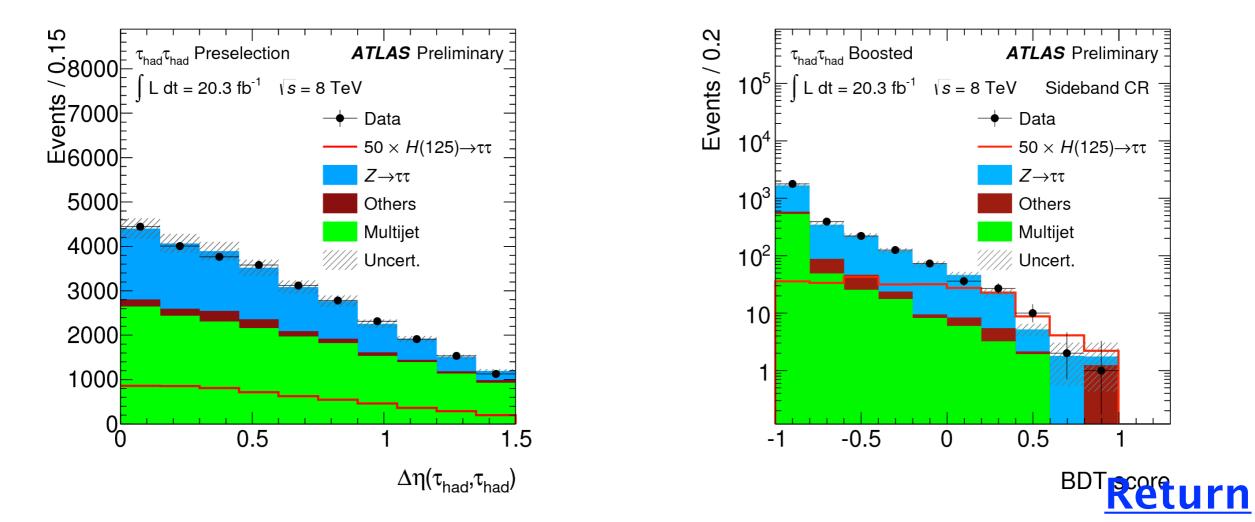
#### LepHad Control Regions

- $Z \rightarrow \tau \tau$ -enriched:  $m_T < 40$  GeV and  $m_{\tau\tau}^{MMC} < 110$  GeV.
- W-enriched:  $m_{\rm T} > 70$  GeV.
- $t\bar{t}$  -enriched: invert *b*-jet veto and  $m_{\rm T} > 50$  GeV.
- Low BDT score.



### HadHad Control Regions

- Mass sideband:  $m_{\tau\tau}^{\text{MMC}} < 100 \text{ GeV or } m_{\tau\tau}^{\text{MMC}} > 140 \text{ GeV}$ .
- Multijet-enriched: inverted signal region  $\Delta \eta$  selection:  $\Delta \eta(\tau_{had}, \tau_{had}) > 1.5$ .
- Rest category: events that pass preselection but fail the VBF and boosted category selections. This region is used in the global likelihood fit to determine the Z → τ<sup>+</sup>τ<sup>-</sup> and the multijet background normalizations.
- Low BDT score.



#### Analysis cross-checks

#### Rigorous checks of background model and fitting technique

- ✓ Check modeling of all input variables
- ✓ Check modeling of correlation between each pair of input variables: <V<sub>i</sub>> vs V<sub>j</sub>
- ✓ Dedicated control regions (CR) for all major backgrounds
  - Z→ee/µµ + jets CR in lep-lep & lep-had
  - Top CR in lep-lep & lep-had
  - W+jets CR in lep-had
  - "Fakes"-enriched CR in lep-lep
  - QCD-enriched CR in had-had

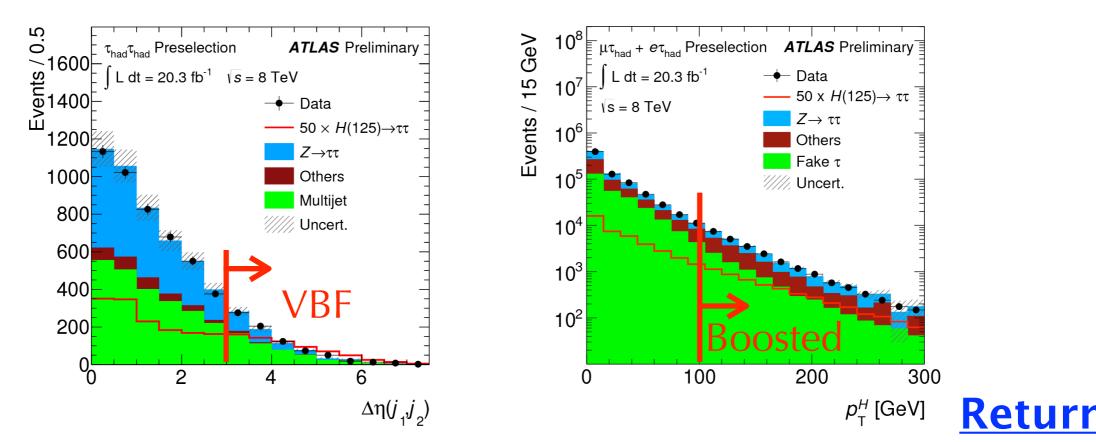
✓ Perform fit in mass sidebands (outside 100-140 GeV window)

- Check of  $Z \rightarrow \tau \tau$  background and overall background model
- ✓ Study each constrained or pulled fit nuisance parameter

#### <u>Return</u> 43

## Analysis Categorisation

- Separate the clearly distinct signal topologies
  - Isolate production mechanisms
  - Use variables that are relevant to each mechanism
- Analysis is performed in 2 categories
  - VBF: 2 jets with leading(sub-leading)  $p_T$ >50(30) GeV,  $\Delta \eta$ (jj)>3
    - ✤ VBF signal fraction ~60%
  - ◆ **Boosted:**  $p_T(H) > 100 \text{ GeV}$  ,  $p_T(H) = \vec{E}_T^{miss} + \vec{\tau_1} + \vec{\tau_2}$ 
    - Dominated by gg-fusion (~70%)



## Jet related cuts to define categories

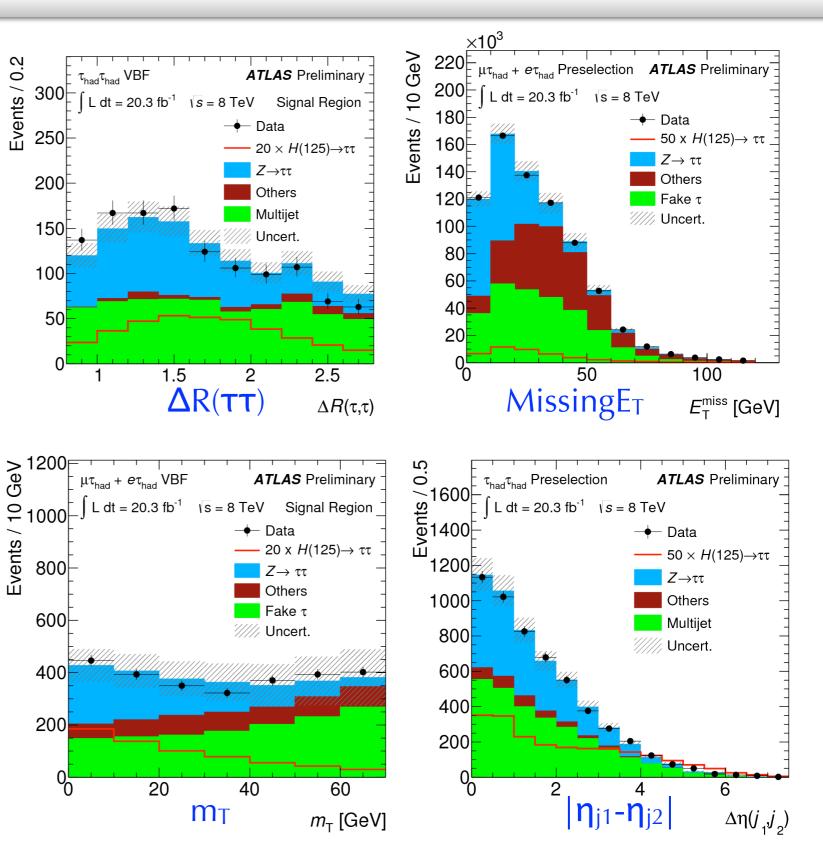
Category	Selection	$ au_{ m lep} au_{ m lep}$	$ au_{ ext{lep}} au_{ ext{had}}$	$ au_{ m had} au_{ m had}$
	$p_{\mathrm{T}}(j_1)$ (GeV)	40	50	50
	$p_{\rm T}(j_2)$ (GeV)	30	30	30/35
VBF	$\Delta\eta(j_1,j_2)$	2.2	3.0	2.0
	$b$ -jet veto for jet $p_{\rm T}$ (GeV)	25	30	-
	$p_{\rm T}^H$ (GeV)	-	-	40
	$p_{\mathrm{T}}(j_1)$ (GeV)	40	-	-
Boosted	$p_{\rm T}^H$ (GeV)	100	100	100
	$b$ -jet veto for jet $p_{\rm T}$ (GeV)	25	30	-

#### How we use BDT's

- We train separate BDTs in each channel and category (see following pages).
- The BDT is trained against a mix of all backgrounds in nature's proportions. Signal is VBF-only in the VBF category and a mix elsewhere.
- Training is performed on each half of the events and applied to the other half (cross-evaluation) such that all events appear in the final plots.
- The BDT score is used as the final discriminant in the fit model.

### Input variables to BDT

- Probe resonance properties
  - $m_{MMC}(TT), \Delta R(TT)$
- Explore event topology
  - ET<sup>miss</sup>, mT, object
     centralities, high pT objects
     sum
- VBF specific, for the 2 VBF jets:
  - Different hemispheres
     ŋ<sub>j1</sub>×ŋ<sub>j2</sub>
  - Separation | η<sub>j1</sub>-η<sub>j2</sub> |
  - Invariant mass m<sub>j1j2</sub>



<u>Return</u> 47

#### Input variables to BDT

X7 · 11		VBF			Boosted	
Variable	$ au_{ m lep} au_{ m lep}$		$ au_{ m had} au_{ m had}$	$ au_{ m lep} au_{ m lep}$		$ au_{ m had} au_{ m had}$
$m_{ au au}^{ m MMC}$	•	•	•	•	•	•
$\Delta R(\tau, \tau)$	•	٠	٠		•	•
$\Delta \eta(j_1, j_2)$	•	•	٠			
$m_{j_1,j_2}$	•	٠	٠			
$\eta_{j_1}  imes \eta_{j_2}$		•	•			
$p_{\mathrm{T}}^{\mathrm{Total}}$		•	•			
sum <i>p</i> <sub>T</sub>					•	•
$p_{\mathrm{T}}(\tau_1)/p_{\mathrm{T}}(\tau_2)$					•	•
$E_{\rm T}^{\rm miss}\phi$ centrality		•	٠	•	•	•
$x_{\tau 1}$ and $x_{\tau 2}$						•
$m_{ au au,j_1}$				•		
$m_{\ell_1,\ell_2}$				•		
$\Delta \phi_{\ell_1,\ell_2}$				•		
sphericity				•		
$p_{\mathrm{T}}^{\ell_1}$				•		
$p_{\mathrm{T}}^{j_1}$				•		
$E_{\mathrm{T}}^{\mathrm{miss}}/p_{\mathrm{T}}^{\ell_2}$				•		
$m_{ m T}$		•			•	
$\min(\Delta \eta_{\ell_1 \ell_2, \text{jets}})$	•					
$j_3 \eta$ centrality	•					
$\ell_1 \times \ell_2 \eta$ centrality	•					
$\ell \eta$ centrality		•				
$ au_{1,2} \eta$ centrality			•			

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#### Variables definition

- $p_{\rm T}^{\rm Total}$ : Magnitude of vector sum of the visible components of the  $\tau$  decay products, the two leading jets and the  $E_{\rm T}^{\rm miss}$ .
- sum  $p_{\rm T}$ : Scalar sum of  $p_{\rm T}$  of the visible components of the  $\tau$  decay products and of the jets.
- $E_{\rm T}^{\rm miss}\phi$  centrality: A variable that quantifies the relative angular position of the  $E_{\rm T}^{\rm miss}$  with respect to the  $\tau$  decay products in the transverse plane. The transverse plane is transformed such that the direction of the  $\tau$  decay products are orthogonal, and that the smaller  $\phi$  angle between the  $\tau$  decay products defines the positive quadrant of the transformed plane.  $E_{\rm T}^{\rm miss}\phi$  centrality is defined as the sum of the x and y components of the  $E_{\rm T}^{\rm miss}$  unit vector in this transformed plane.
- sphericity: A variable that describes the isotropy of energy flow. It is based on the quadratic momentum tensor:

$$S^{\alpha\beta} = \frac{\sum_{i} p_{i}^{\alpha} p_{i}^{\beta}}{\sum_{i} |\vec{p_{i}}|^{2}}.$$
(2)

Both leptons and the selected jets are considered in the computation. In this equation,  $\alpha$  and  $\beta$  are the indices of the tensor, and the summation is performed over the momenta of the leptons and the jets in the event. The sphericity of the event is then defined in terms of the two largest eigenvalues of this tensor,  $\lambda_2$  and  $\lambda_3$ :

$$S = \frac{3}{2}(\lambda_2 + \lambda_3). \tag{3}$$

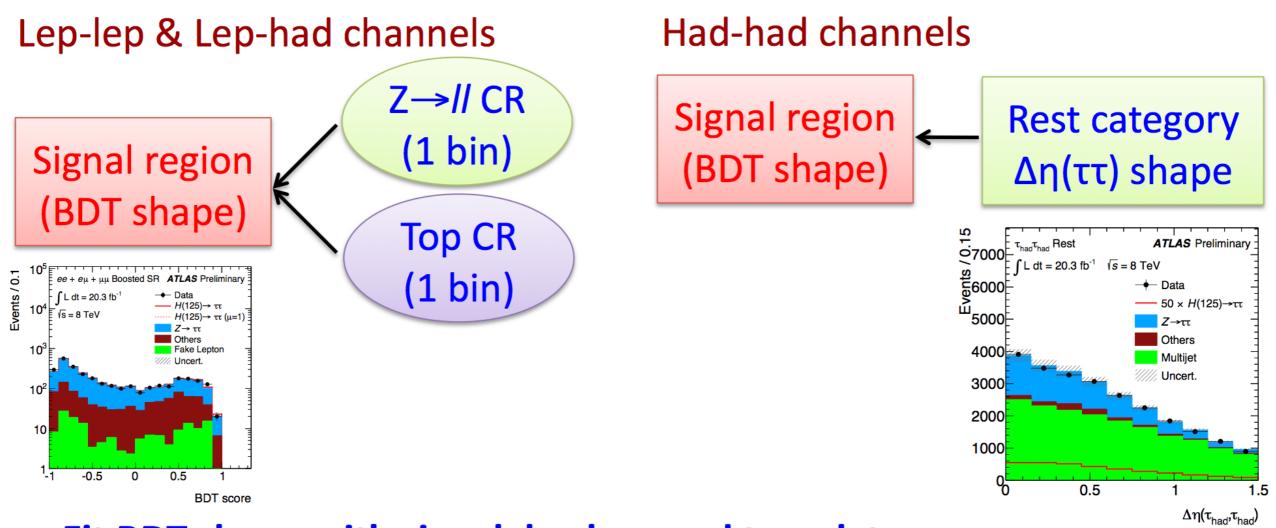
• object  $\eta$  centrality: A variable that quantifies the  $\eta$  position of an object (a  $\tau_{had}$  candidate or an isolated lepton) with respect to the two leading jets in the event. It is defined as

$$C_{\eta_1,\eta_2}(\eta) = \exp\left[\frac{-4}{(\eta_1 - \eta_2)^2} \left(\eta - \frac{\eta_1 + \eta_2}{2}\right)^2\right]$$
(4)

where  $\eta_1$  and  $\eta_2$  are the pseudorapidities of the two leading jets. This variable has value 1 when the object is halfway between the two jets, 1/e when the object is aligned with one of the jets, and < 1/e when the object is outside the jets. This variable is used for the following BDT inputs:  $\ell_1 \times$  $\ell_2 \eta$  centrality (product of the two  $\eta$  centralities),  $\ell \eta$  centrality,  $j_3 \eta$  centrality and  $\tau_{1,2} \eta$  centrality ( $\eta$  centrality of each  $\tau_{had}$ ). When  $j_3 \eta$  centrality is used, events with only two jets are assigne dummy value of -0.5.

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### Fit model

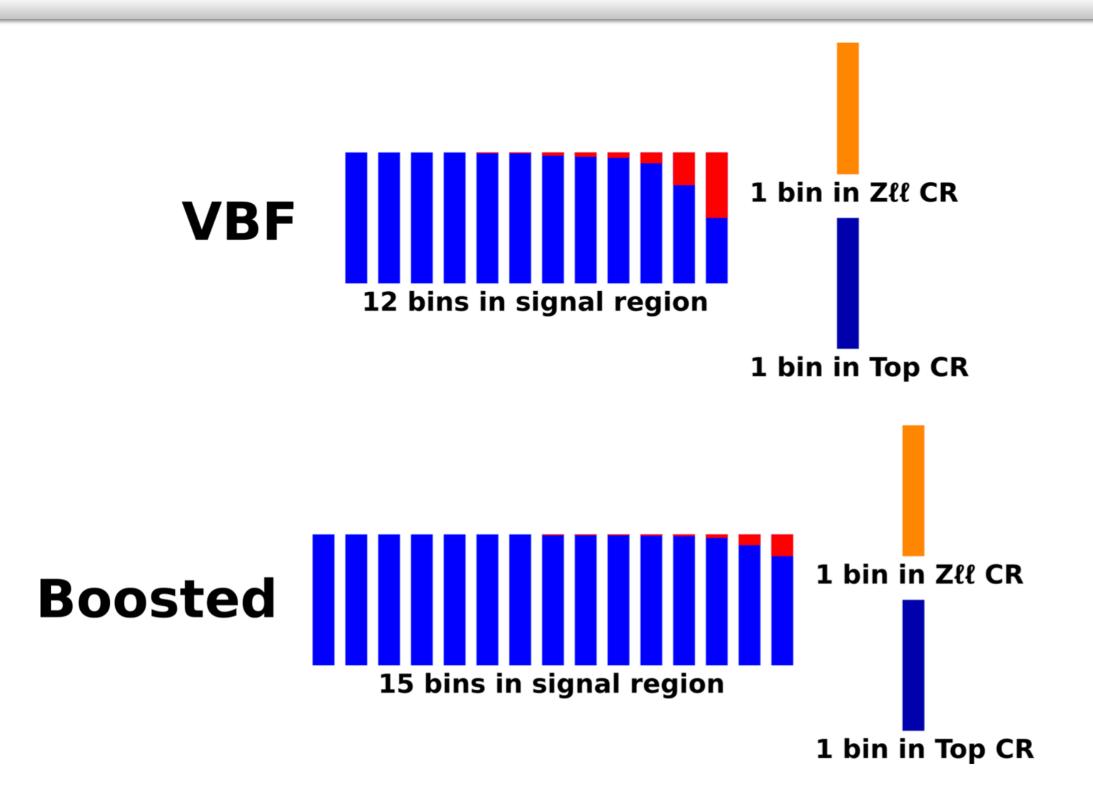


#### Fit BDT shape with signal+background templates

- Simultaneous fit in 6 SR and 5 CR with common systematics NP's
- $Z \rightarrow \tau \tau$ , Top, multijet (in had-had) & Z \rightarrow II normalizations are free in the fit
  - Control regions to constrain normalization of Top & Z $\rightarrow$ II
  - Had-had channel: multijet &  $Z \rightarrow \tau \tau$  constrained in Rest category

#### Return 50

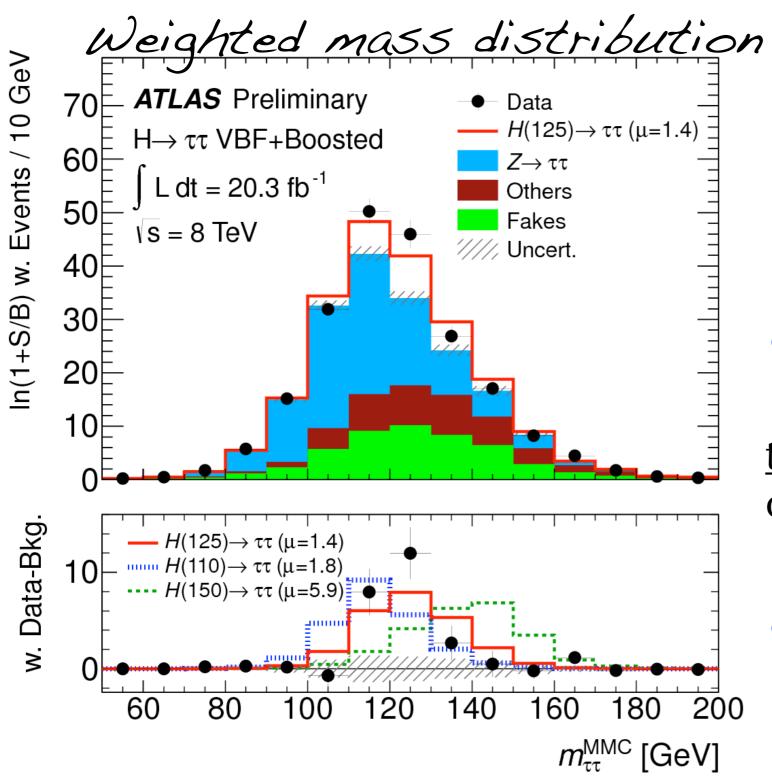
#### Fit model

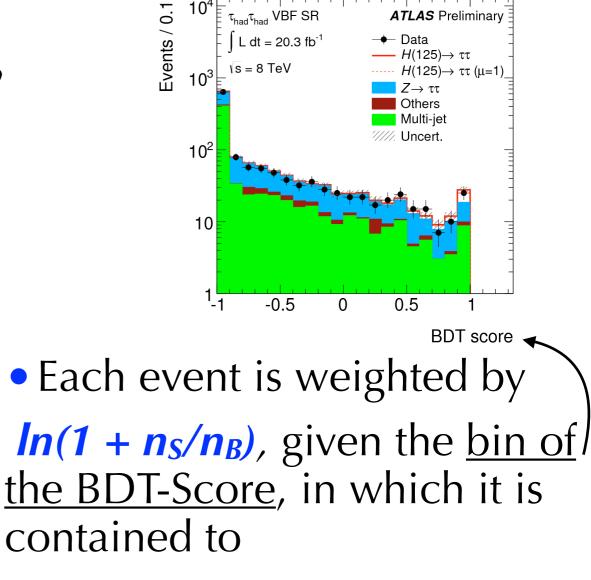


We run a simultaneous fit on all these (along with the bins from  $\tau_{had}\tau_{had}$  and  $\tau_{lep}\tau_{lep}$ )

#### <u>Return</u> 51

#### Is the excess compatible with a $m_H=125$ GeV Higgs boson?



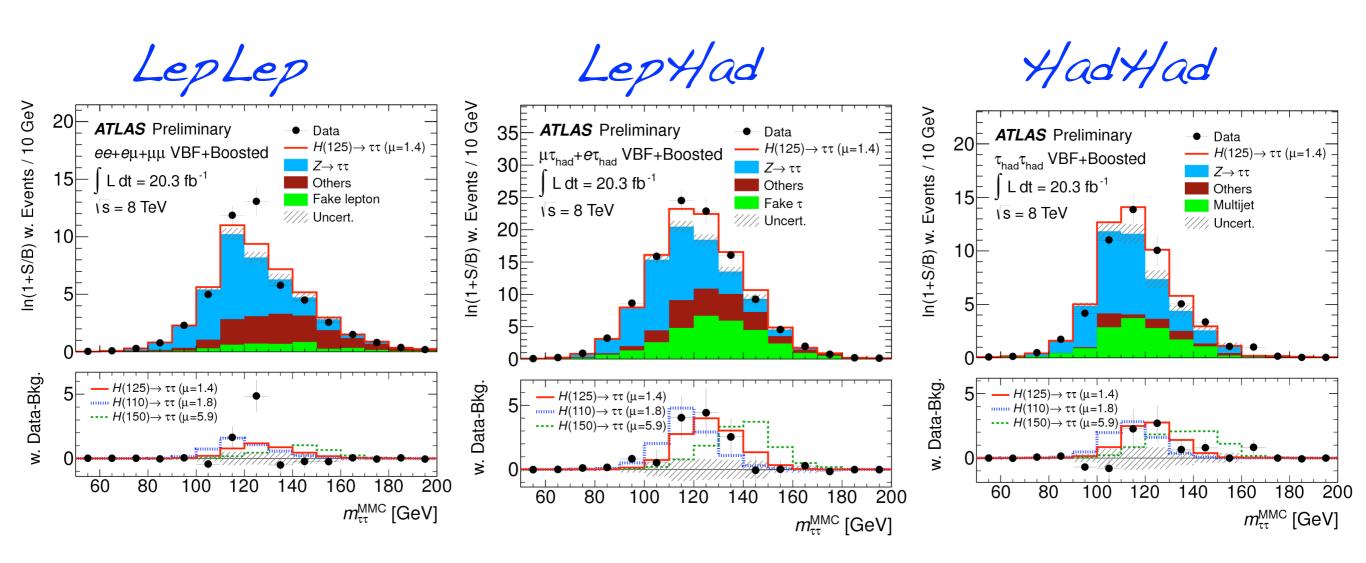


• Observed signal compatible with m<sub>H</sub>=125 GeV

**52** 

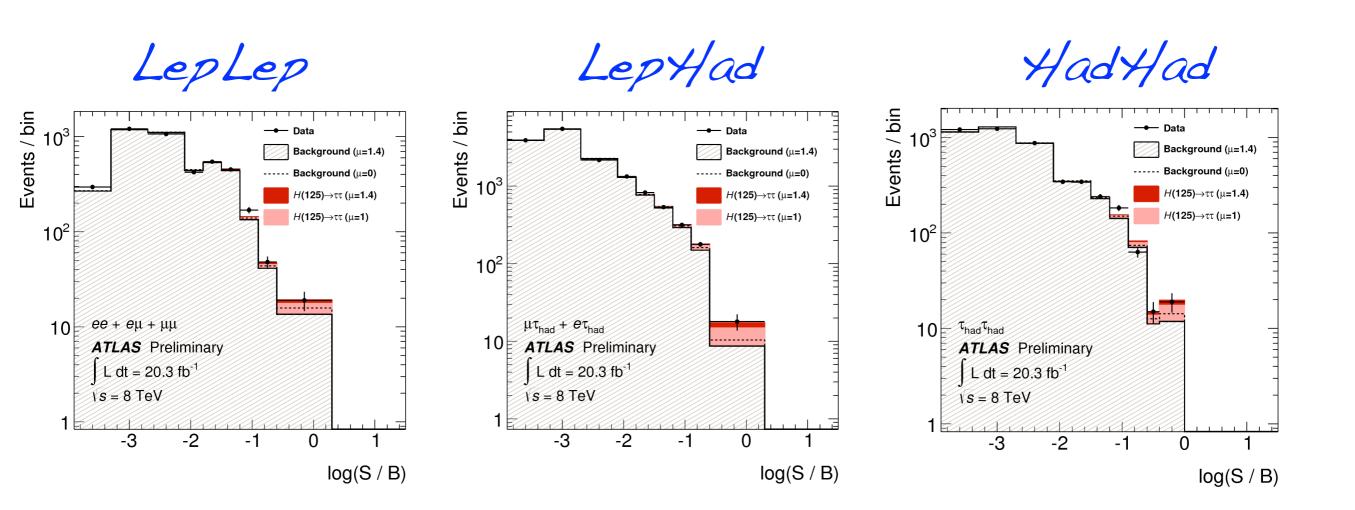
Return

#### Weighted Mass plots



#### <u>Return</u> 53

#### Log(S/B) plots





### Event Yields in LepLep

Process/Category		VBF			Boosted	
BDT score bin edges	0.684-0.789	0.789-0.895	0.895-1.0	0.667-0.778	0.778-0.889	0.889-1.0
ggF	$0.53 \pm 0.26$	$0.8 \pm 0.4$	$0.7 \pm 0.4$	$5.3 \pm 2.1$	$5.2 \pm 2.0$	$1.7 \pm 0.7$
VBF	$1.15 \pm 0.35$	$2.0 \pm 0.6$	$5.0 \pm 1.5$	$1.01 \pm 0.33$	$1.5 \pm 0.5$	0.67 ± 0.22
WH	< 0.05	< 0.05	< 0.05	$0.71 \pm 0.22$	$0.64 \pm 0.20$	$0.16 \pm 0.05$
ZH	< 0.05	< 0.05	< 0.05	$0.36 \pm 0.11$	$0.32 \pm 0.10$	$0.06 \pm 0.02$
$Z \rightarrow \tau^+ \tau^-$	$7.6 \pm 0.8$	$9.0 \pm 0.9$	$4.6 \pm 0.6$	97 ± 7	$61.5 \pm 3.2$	$13.6 \pm 1.3$
Fake	$2.8 \pm 0.7$	$5.8 \pm 2.0$	$4.5 \pm 1.7$	$10.1 \pm 3.1$	$15 \pm 5$	$0.79 \pm 0.29$
Тор	$4.0 \pm 0.9$	$2.9 \pm 0.7$	$1.8 \pm 0.4$	$28 \pm 7$	$15 \pm 4$	$3.5 \pm 0.9$
Others	$1.97 \pm 0.26$	$3.3 \pm 0.4$	$2.7 \pm 0.4$	$24.7 \pm 1.9$	$8.8 \pm 0.6$	$2.34 \pm 0.24$
Total Background	$16.3 \pm 1.5$	$20.9 \pm 2.4$	$13.5 \pm 2.4$	$160 \pm 7$	$101 \pm 4$	$20.2 \pm 1.8$
Total Signal	$1.7 \pm 0.5$	$2.9 \pm 0.9$	$5.7 \pm 1.7$	$7.4 \pm 2.4$	$7.7 \pm 2.5$	$2.6 \pm 0.8$
S/B	0.10	0.14	0.42	0.05	0.08	0.13
Data	23	28	19	156	128	20

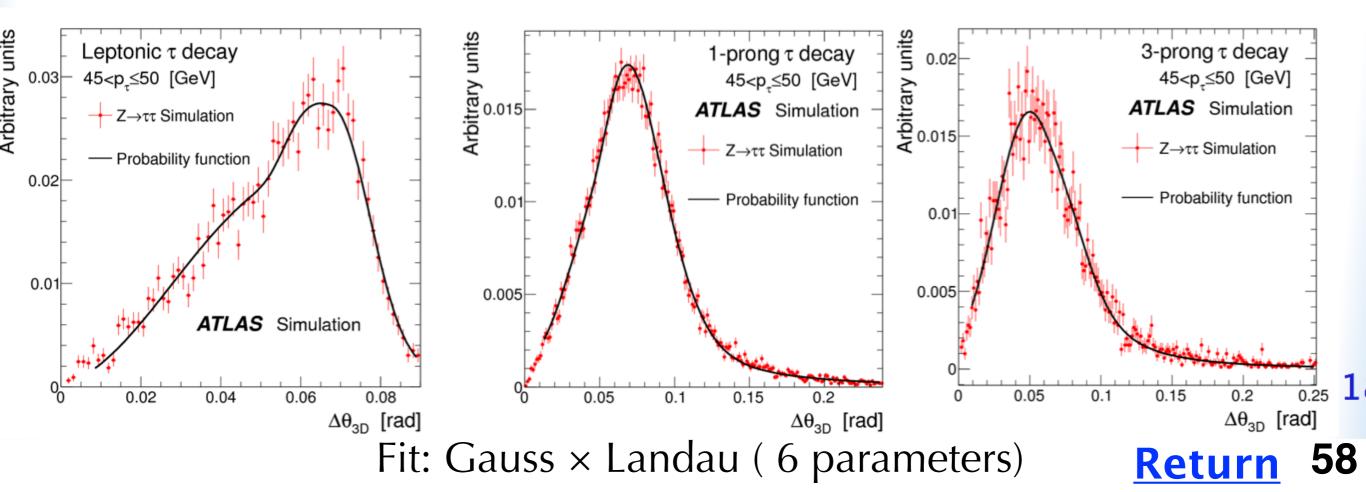
#### Event Yields in LepHad

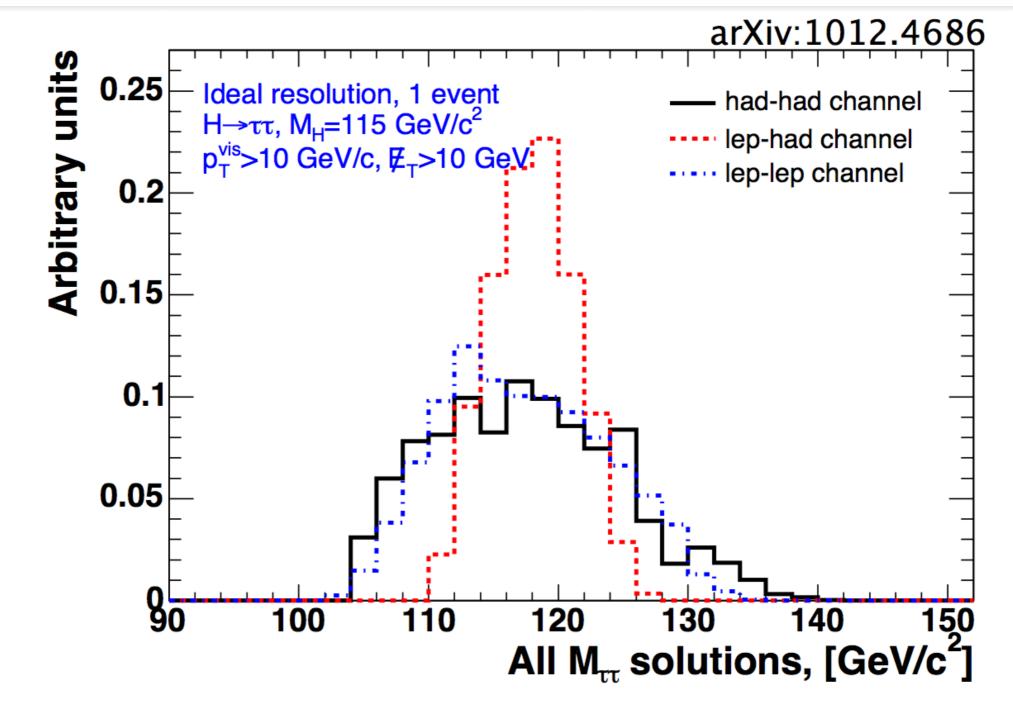
Process/Category		VBF	Boosted			
			0.000 1.0			0.0(7.1.0
BDT score bin edges	0.5-0.667	0.667-0.833	0.833-1.0	0.6-0.733	0.733-0.867	0.867-1.0
ggF	$2.2 \pm 0.9$	$3.5 \pm 1.5$	$1.2 \pm 0.6$	$7.7 \pm 2.9$	$6.3 \pm 2.3$	$5.5 \pm 2.1$
VBF	$4.1 \pm 1.2$	$9.2 \pm 2.7$	$7.5 \pm 2.2$	$1.7 \pm 0.5$	$1.5 \pm 0.5$	$1.3 \pm 0.4$
WH	< 0.05	< 0.05	< 0.05	$0.95 \pm 0.29$	$0.85 \pm 0.26$	$0.81 \pm 0.25$
ZH	< 0.05	< 0.05	< 0.05	$0.42 \pm 0.13$	$0.47 \pm 0.14$	$0.41 \pm 0.12$
$Z \rightarrow \tau^+ \tau^-$	$28.6 \pm 1.4$	$25.0 \pm 1.6$	$2.41 \pm 0.35$	$48.3 \pm 3.4$	$26.1 \pm 2.7$	$18.4 \pm 2.0$
Fake	$37.7 \pm 1.8$	$27.9 \pm 2.1$	$3.5 \pm 0.5$	$27 \pm 4$	$10.8 \pm 1.8$	5.8 ± 1.4
Тор	$6.5 \pm 0.7$	$4.1 \pm 0.8$	$1.5 \pm 0.4$	$7.0 \pm 0.9$	$5.7 \pm 0.8$	$2.23 \pm 0.33$
Diboson	$2.9 \pm 0.4$	$3.0 \pm 0.5$	$0.23 \pm 0.04$	$4.8 \pm 0.5$	$4.0 \pm 0.5$	$1.69 \pm 0.23$
$Z \to \ell \ell (j \to \tau_{had})$	8.7 ± 1.7	$3.3 \pm 0.5$	$0.40 \pm 0.10$	$3.8 \pm 0.5$	$0.71 \pm 0.07$	< 0.05
$Z \to \ell \ell (\ell \to \tau_{had})$	$2.8 \pm 1.2$	$1.9 \pm 1.2$	$0.7 \pm 0.6$	$9.4 \pm 1.9$	$4.9 \pm 1.1$	3.8 ± 1.2
Total Background	$87.2 \pm 2.7$	$65 \pm 5$	$8.7 \pm 2.5$	$101 \pm 6$	$52 \pm 4$	$32 \pm 4$
Total Signal	$6.3 \pm 1.8$	$12.7 \pm 3.5$	$8.7 \pm 2.4$	$10.7 \pm 3.3$	$9.2 \pm 2.8$	8.0 ± 2.5
S/B	0.07	0.20	1.0	0.11	0.18	0.25
Data	90	80	18	103	64	34

### Event Yields in HadHad

Process/Category		VBF		Boosted		
BDT score bin edges	0.85-0.9	0.9-0.95	0.95-1.0	0.85-0.9	0.9-0.95	0.95-1.0
ggF	$0.39 \pm 0.17$	$0.35 \pm 0.16$	$2.0 \pm 0.9$	$2.2 \pm 0.8$	$2.5 \pm 1.0$	$2.3 \pm 0.9$
VBF	$0.57 \pm 0.18$	$0.72 \pm 0.22$	$5.9 \pm 1.8$	$0.55 \pm 0.17$	$0.61 \pm 0.19$	$0.57 \pm 0.17$
WH	< 0.05	< 0.05	< 0.05	$0.34 \pm 0.11$	$0.40\pm0.12$	$0.44 \pm 0.14$
ZH	< 0.05	< 0.05	< 0.05	$0.22 \pm 0.07$	$0.22\pm0.07$	$0.22 \pm 0.07$
$Z \rightarrow \tau^+ \tau^-$	$3.2 \pm 0.6$	$3.4 \pm 0.7$	$5.3 \pm 1.0$	$15.7 \pm 1.7$	$12.3 \pm 1.8$	$9.7 \pm 1.6$
Multijet	$3.3 \pm 0.6$	$2.9 \pm 0.6$	$5.9 \pm 0.9$	$5.2 \pm 0.6$	$3.7 \pm 0.5$	$1.40 \pm 0.22$
Others	$0.38 \pm 0.09$	$0.49 \pm 0.12$	$0.64 \pm 0.13$	$1.49 \pm 0.27$	$2.8 \pm 0.5$	$0.07 \pm 0.02$
Total Background	$6.9 \pm 1.3$	$6.8 \pm 1.3$	$11.8 \pm 2.6$	$22.4 \pm 2.5$	$18.8 \pm 2.8$	$11.2 \pm 1.9$
Total Signal	$0.97 \pm 0.29$	$1.09 \pm 0.31$	$8.0 \pm 2.2$	$3.3 \pm 1.0$	$3.8 \pm 1.2$	$3.6 \pm 1.1$
S/B	0.14	0.16	0.67	0.15	0.2	0.32
Data	6	6	19	20	16	15

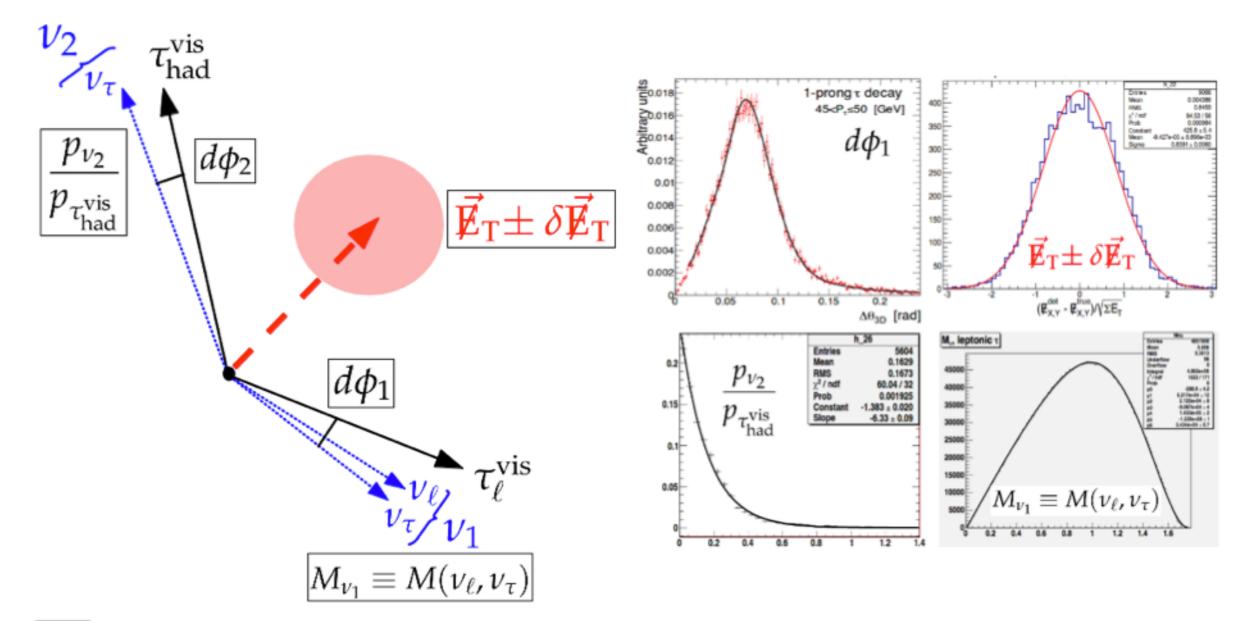
- Based on Nucl.Instrum.Meth. A654:481-489,2011 Sasha Pranko et al. [arXiv:1012.4686]
- Parameterize  $\Delta \theta_{3D}$  (visible  $\tau$ , neutrino[s]) in MC
- Solve τ, E<sub>T</sub><sup>miss</sup> kinematics equations for each point of the Δφ(vis,neutrino[s]) parameter space
- Use Δθ<sub>3D</sub>(vis,neutrino[s]) parameterization to weight the solutions in Δφ (vis,neutrino[s]) grid, put weighted solutions to histogram
- Peak most probable value as the  $M_{\tau\tau}^{MMC}$  estimator





Example of solutions for all points on  $[\Delta \phi_1; \Delta \phi_2]$  grid for a single Higgs event

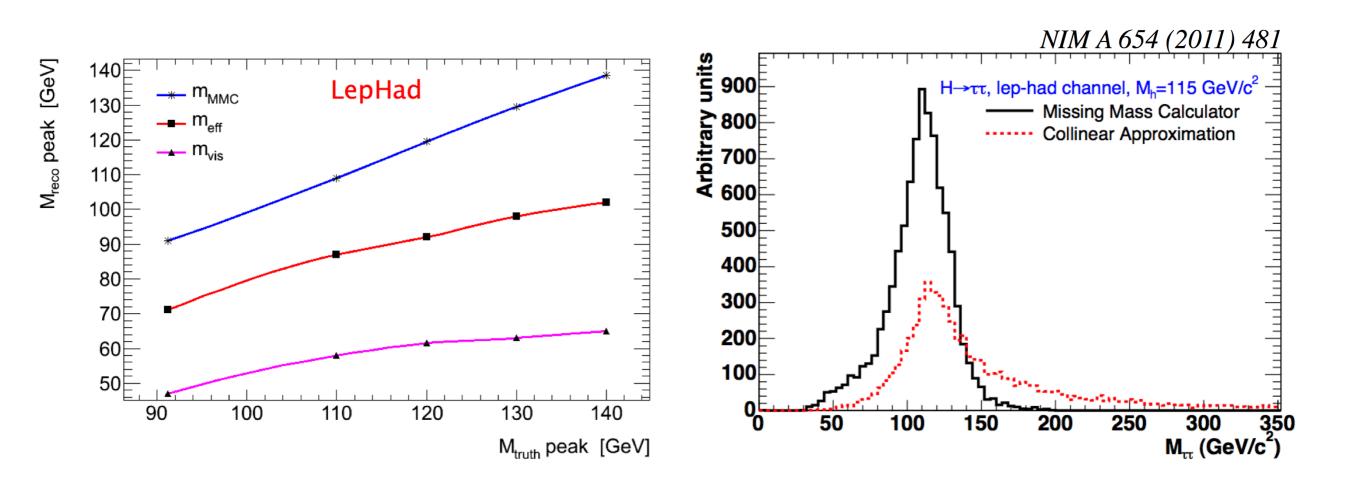
solutions weighted by corresponding P<sub>solution</sub> probabilities



= <u>unknown value</u>

- (1) **Perform a scan** over the unknowns, ie choose a config :  $q = (d\Phi_1, d\Phi_2, M_{v1}, mET, p_v/p_T)$
- (2) For each configuration q<sub>i</sub> : compute the **full invariant mass** m<sub>i</sub>
- (3) Fill an histogram of m, weighted by w,=PDF(q,), as a product each above PDF
- (4) Final reconstruced mass, MMC, is given by the max of this histogram

#### <u>Return</u> 60

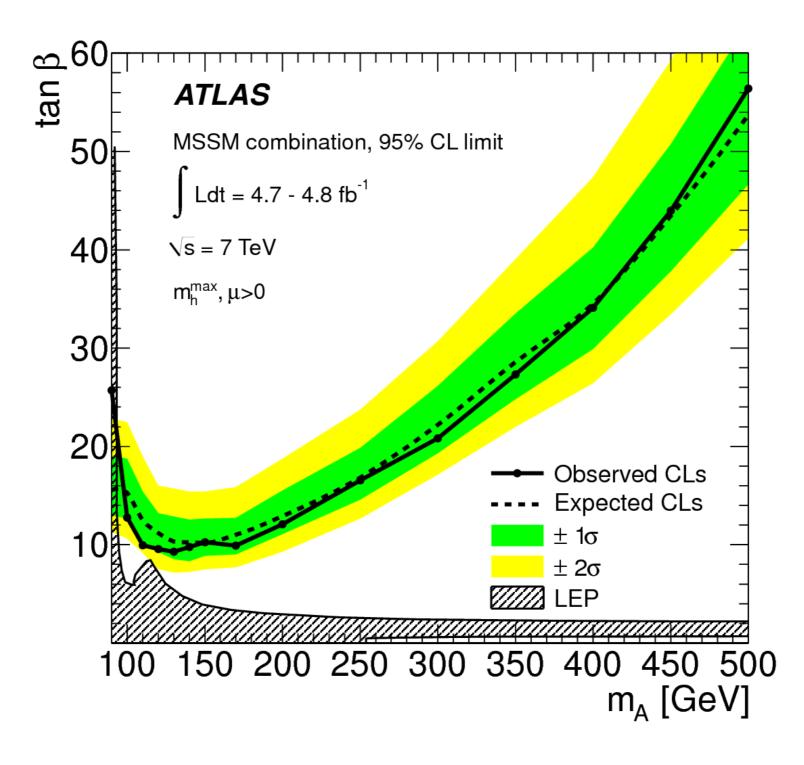


	Ζ→тт
Lep-Lep	~21%
Lep-Had	~18%
Had-Had	~14%



## BSM Higgs

 Fermionic decays provide constraints on the MSSM in the context of 2 Higgs doublet models





#### **Decision Trees**

- For each variable a range to scan defined by the spread of S and B in n steps
- Every such step is tested by evaluating a SVs B separation index based on the proportions of S and B lying on each side of the cut

$$p(R_i) = \frac{N_S(R_i)}{N_B(R_i) + N_S(R_i)},$$
(5.5)

where  $N_S(R_i)$  is the number of signal in region  $R_i$  and  $N_B(R_i)$  is the number of background in the same region. The separation index  $g(R_i)$  used is then expressed as

$$g(R_i) = p(R_i)(1 - p(R_i)),$$
 (5.6)

which is known as the *Gini index*. When scanning for a new cut to divide region  $R_i$ , two new regions are created:  $R_i^{v < c}$  and  $R_i^{v \ge c}$ . The quantity to optimize is given by

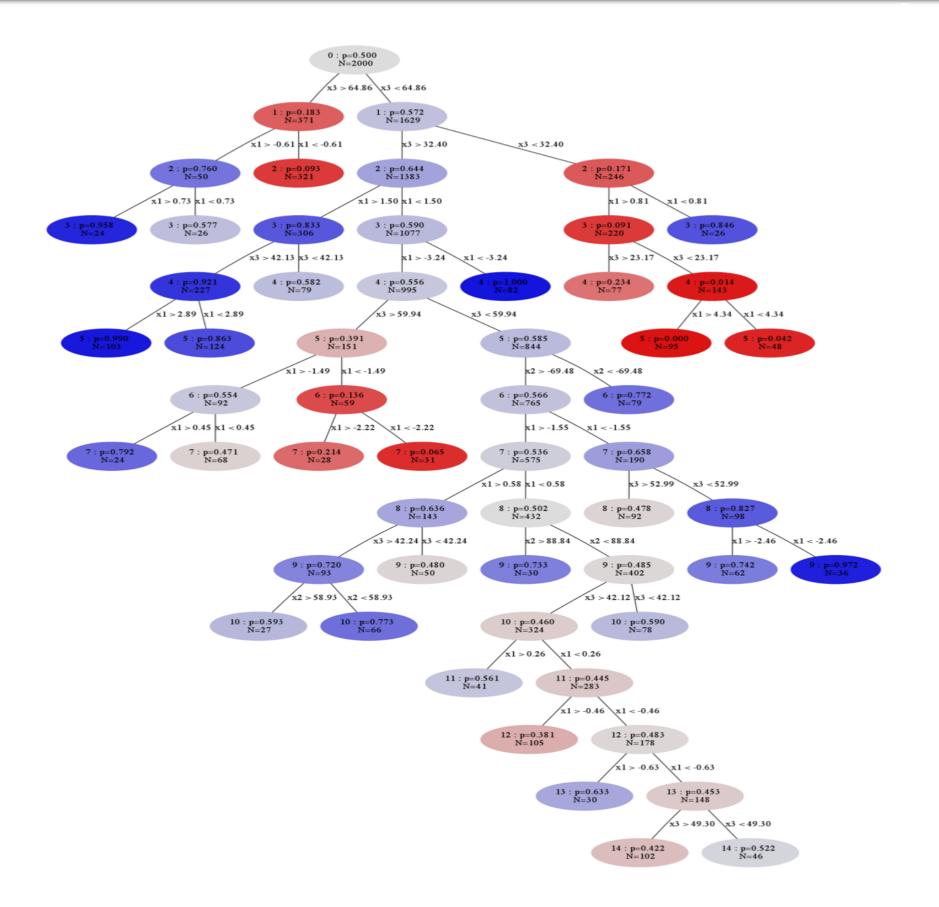
$$\Delta g(R_i, v, c) = g(R_i) - \frac{N(R_i^{v < c})g(R_i^{v < c}) + N(R_i^{v \ge c})g(R_i^{v \ge c})}{N(R_i^{v < c}) + N(R_i^{v \ge c})},$$
(5.7)

where

$$N = N_S + N_B. \tag{5.8}$$

 $\Delta g(R_i, v, c)$  represents the increase in separation given by the new cut *c* on variable *v* that separates region  $R_i$  into regions  $R_i^{v < c}$  and  $R_i^{v \ge c}$ . If one of the stopping criteria is not met, regions  $R_i^{v < c}$  and  $R_i^{v \ge c}$  become themselves subject to splitting by the same procedure. **Return** 63

#### **Decision Trees**



#### <u>Return</u>

### **Decision Trees stopping criteria**

The most useful stopping criteria is probably the *minimum leaf size*, where the splitting of new nodes stops when the total number of signal and background at these nodes falls below a threshold.

Another useful stopping criteria is the *maxdepth*, where one puts a maximum number on the number of consecutive splittings that can occur.



### Boosting

The boosting procedure takes several distinct weak classifiers and combines them into one strong classifier f, which we will call the "committee". Consider the following expression:

$$f(X) = \sum_{b=1}^{B} \alpha_b f_b(X) \tag{5.9}$$

which represents a a linear sum of *B* weak discriminants  $f_b$ , each weighted by a weight  $\alpha_b$ . This is to allow for the possibility that not all weak discriminants have the same classification accuracy; more importance should be attributed for the more accurate weak discriminants. Now, consider the case where the weak discriminants are decision trees. Optimizing each  $\alpha_b$ , without even considering the optimization of the cuts of each individual decision tree, is a formidable optimization problem. There are several minimization strategies to solve it, two of which will be discussed in this section.



### BDT

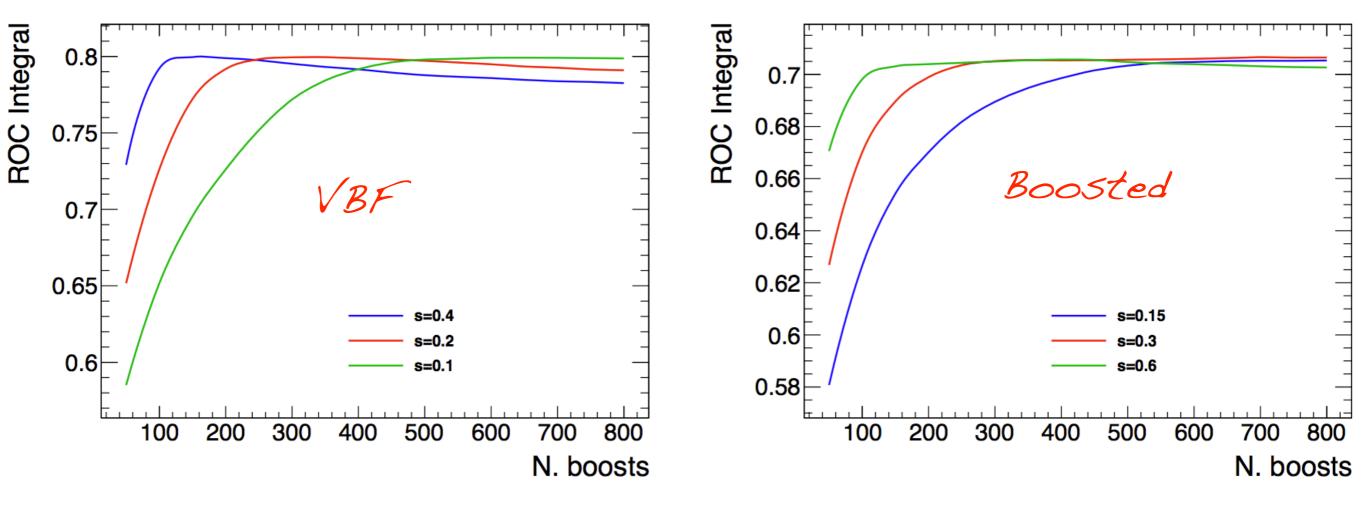


Table 8.2: Training parameters for the VBF category and Boosted category BDTs.

Parameter	VBF Category	Boosted Category	
N. Boosts	400	600	
Shrinkage	0.2	0.3	
Tree Depth	4	4	
Min. Leaf Size	150	150	

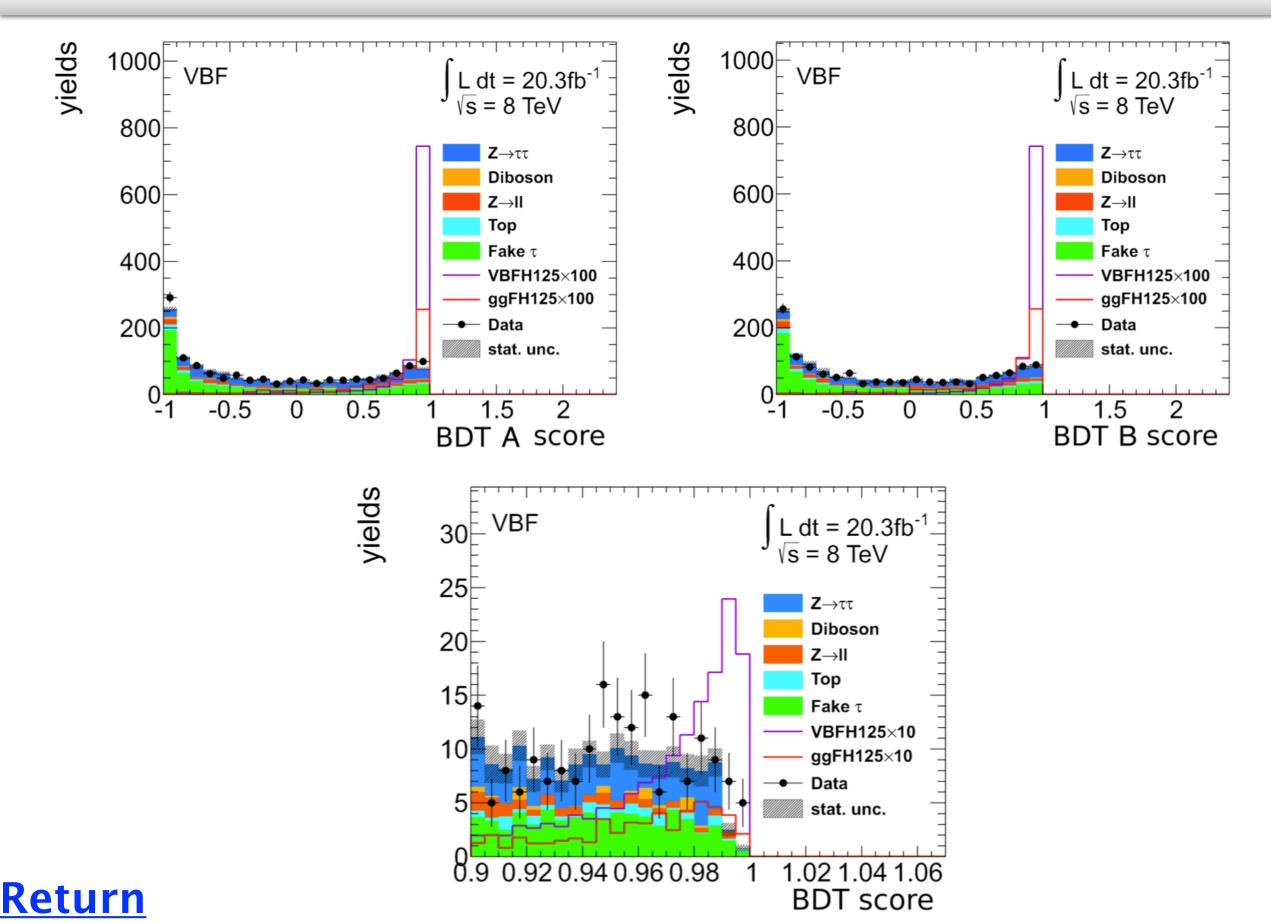


#### How we use BDT's

- We train separate BDTs in each channel and category (see following pages).
- The BDT is trained against a mix of all backgrounds in nature's proportions. Signal is VBF-only in the VBF category and a mix elsewhere.
- Training is performed on each half of the events and applied to the other half (cross-evaluation) such that all events appear in the final plots.
- The BDT score is used as the final discriminant in the fit model.

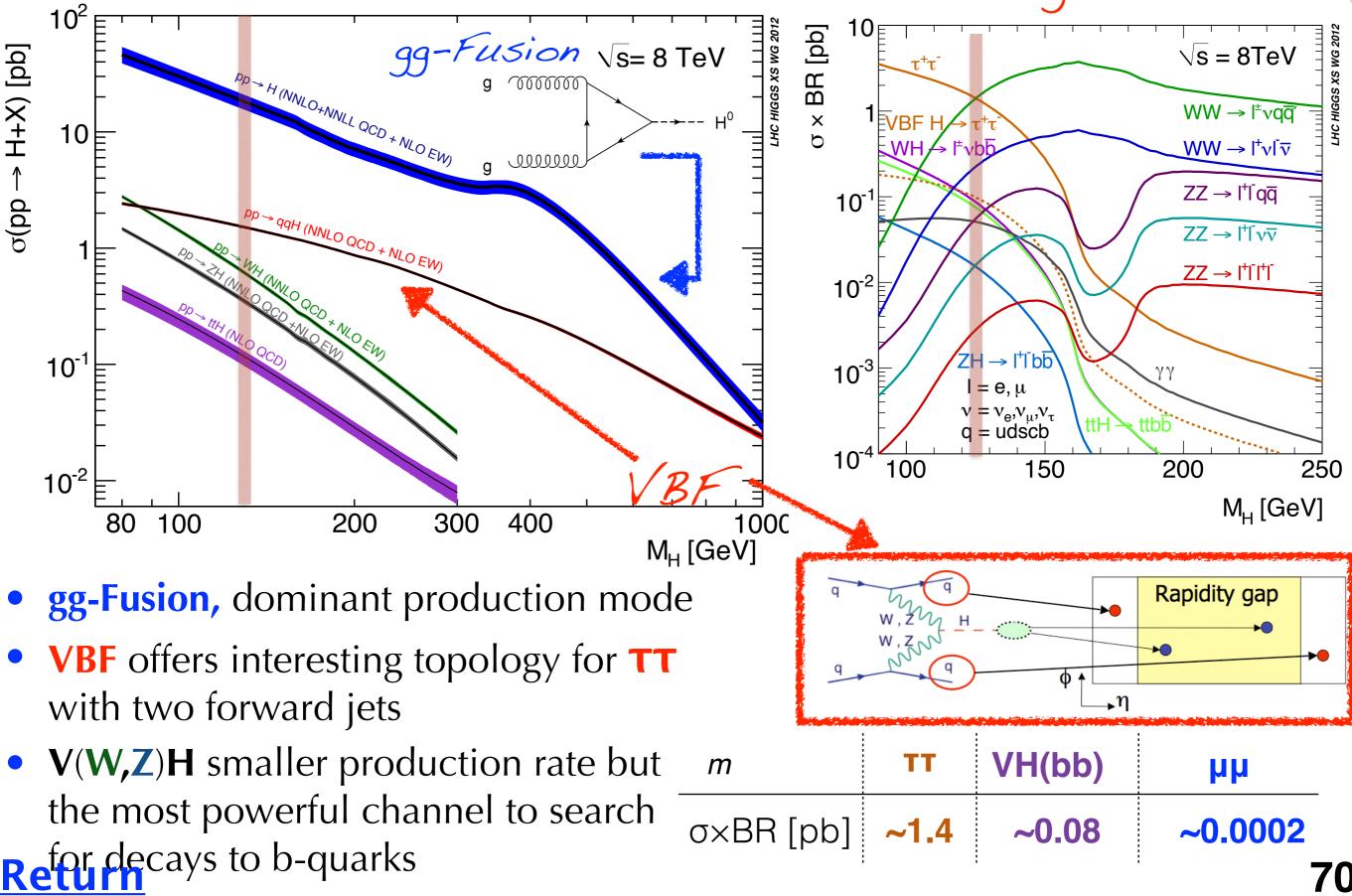


### **BDT cross-evaluation**



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# Higgs phenomenology in LHC



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