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*Looking for new physics with  
high mass diboson searches*

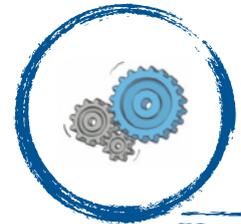
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CLHCP workshop

26<sup>th</sup> November 2021

*Antonio Giannini*

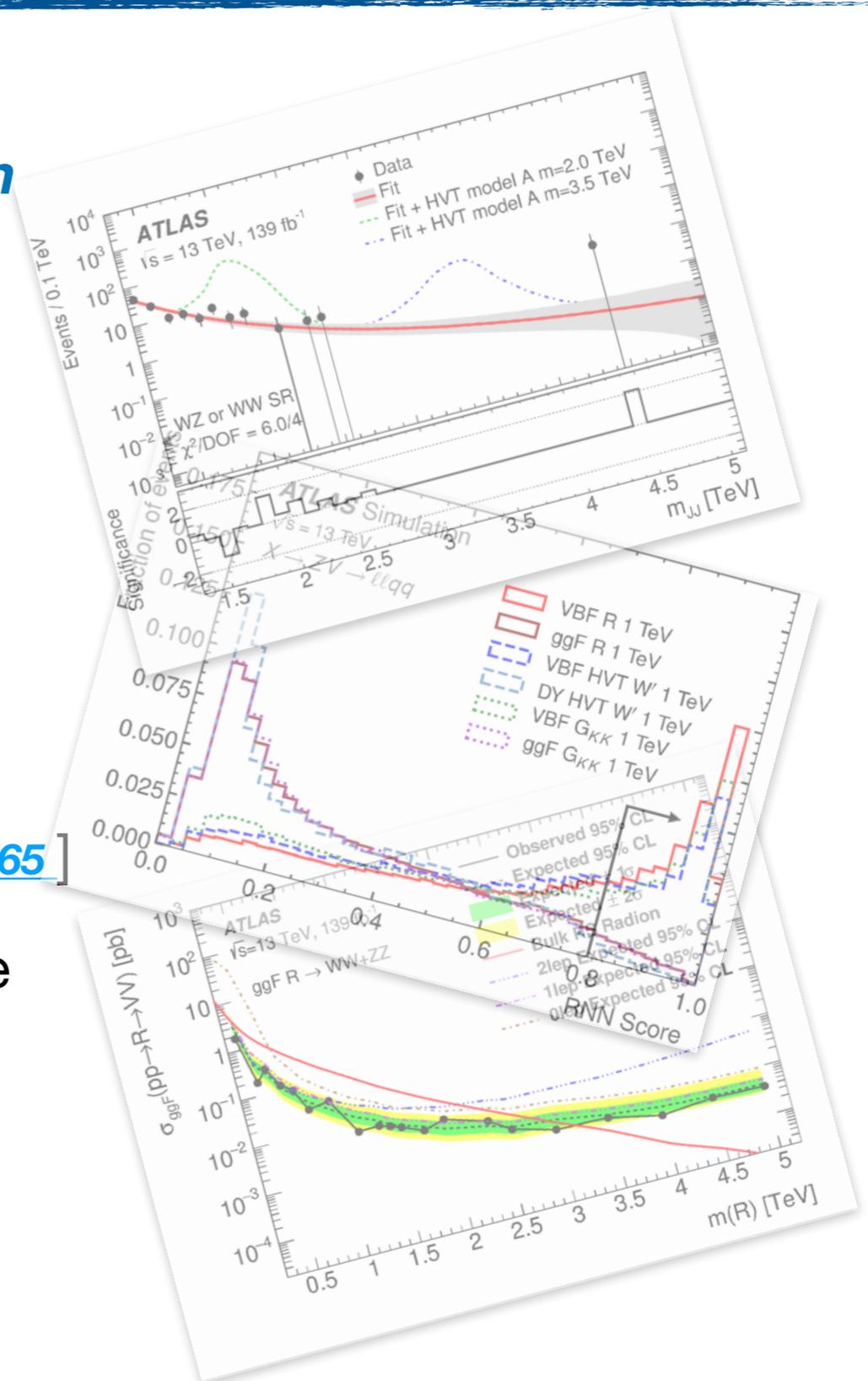
*University of Science and Technology of China*



# Outline

## Looking for new physics with high mass diboson searches

- Introduction to VV searches
- Full Run-2 139 fb<sup>-1</sup> data results
- Fully hadronic final states: [[JHEP09\(2019\)091](#)]
  - ▶ Boson-jet tagger
- Semi-leptonic final states: [[Eur. Phys. J. C 80 \(2020\) 1165](#)]
  - ▶ VBF event topology identification (Machine Learning)
- Conclusions and perspectives



# Introduction to diboson

- Diboson signatures open testing scenario of new physics decaying into SM sector
- Several BSM scenarios foresee new massive particles in the TeV range, allowed @LHC

[ATL-PHYS-PUB-2021-005](#)

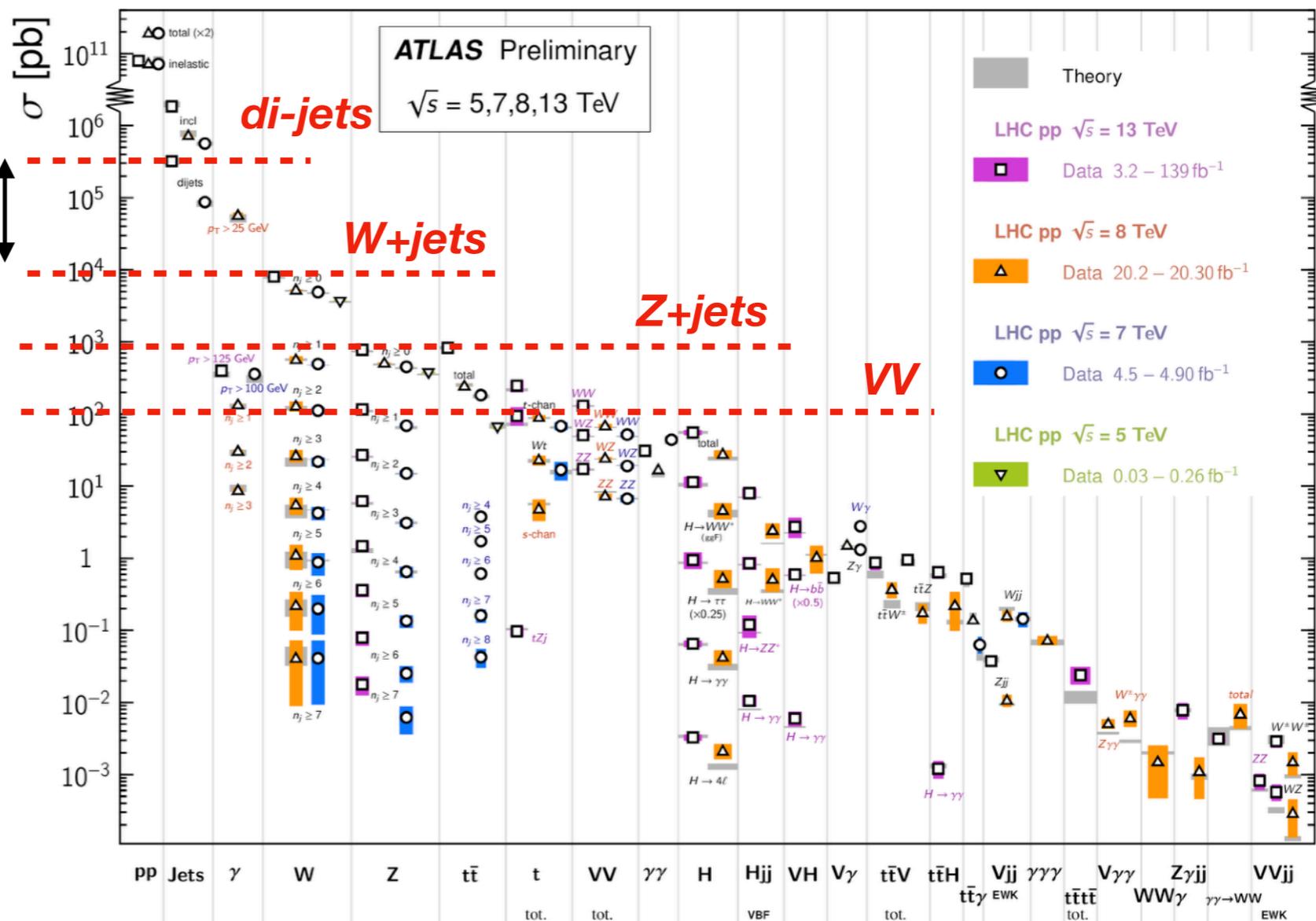
SM bkg processes for VV searches

$10^4$   
 $10^3$   
 $10^2$

Other rare SM processes

Standard Model Production Cross Section Measurements

Status: March 2021

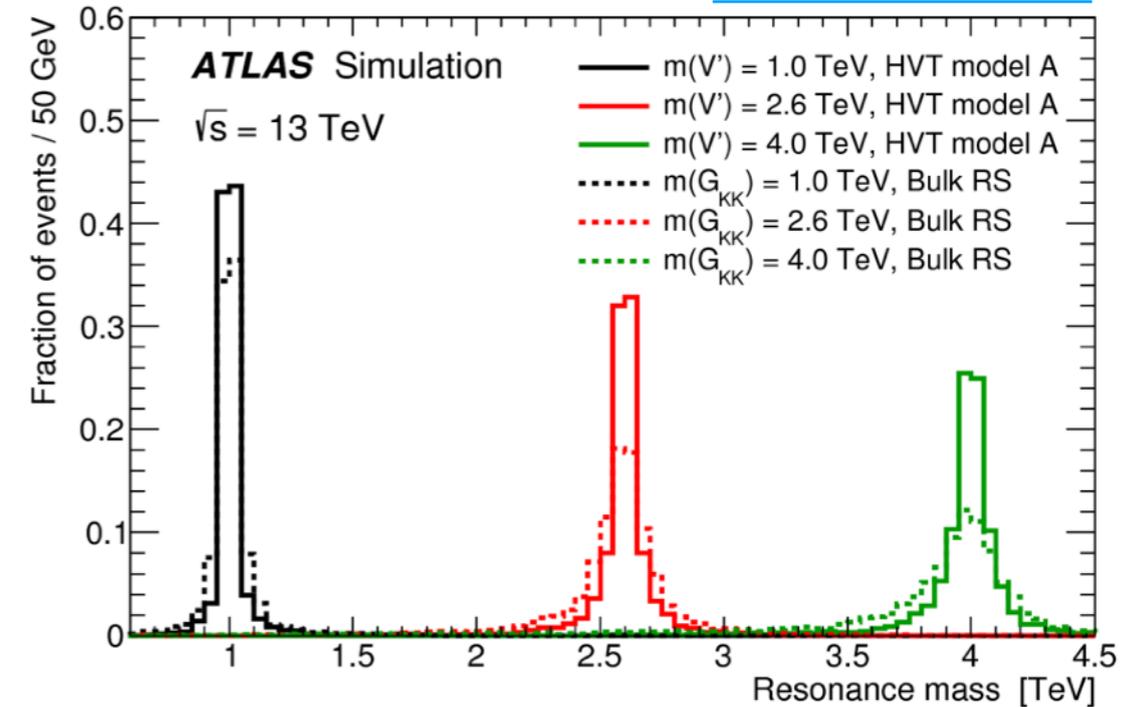




# BSM models: heavy $V$ resonances

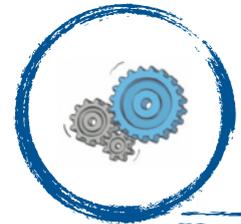
- Benchmark BSM models
  - ▶ Spin-0: RS Radions
  - ▶ Spin-1: Heavy Vector Triplet (HVT)
  - ▶ Spin-2: RS Gravitons
- Different production mechanisms are considered, ggF/DY/VBF
- Vector bosons from intermediate resonances are longitudinally state dominated

EXOT-2017-31



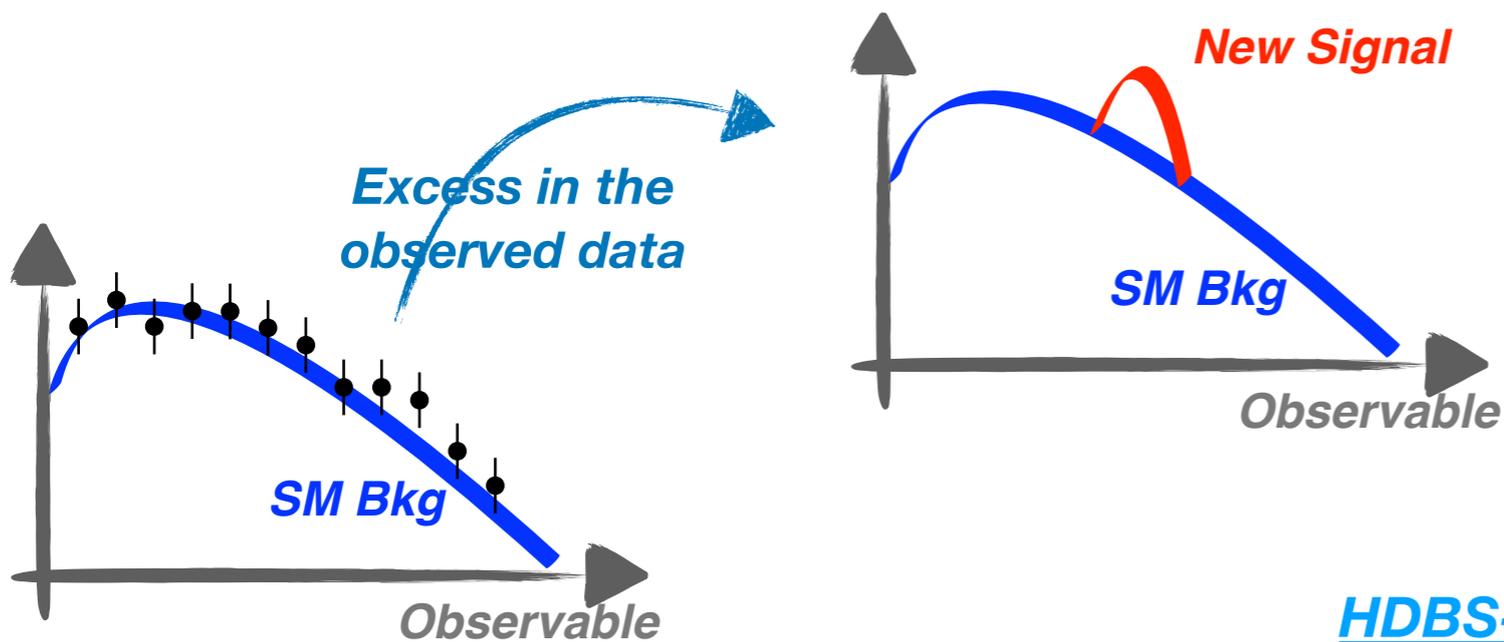
HDBS-2018-10

Model		Spin	$m = 800$ GeV			$m = 3$ TeV			
			$\sigma$ [pb]	$\mathcal{B}$	$\Gamma/m$	$\sigma$ [fb]	$\mathcal{B}$	$\Gamma/m$	
RS radion ( $k\pi r_c = 35$ , $\Lambda_R = 3$ TeV)	$R \rightarrow WW$	0	0.54 (ggF)	0.43	$2.6 \times 10^{-3}$	1.38 (ggF)	0.44	0.032	
	$R \rightarrow ZZ$		$1.1 \times 10^{-3}$ (VBF)	0.21		$5.5 \times 10^{-3}$ (VBF)	0.22		
HVT	Model A	1	$W' \rightarrow WZ$	53	0.024	0.026	79	0.020	0.025
			$Z' \rightarrow WW$	26	0.023		36		
	Model B		$W' \rightarrow WZ$	1.6	0.43	0.040	5.5	0.47	0.031
			$Z' \rightarrow WW$	0.86	0.41		2.5		
	Model C (VBF)		$W' \rightarrow WZ$	$4.0 \times 10^{-3}$	0.50	$3.5 \times 10^{-3}$	$1.6 \times 10^{-3}$	0.50	$3.3 \times 10^{-3}$
			$Z' \rightarrow WW$	$2.7 \times 10^{-3}$	0.49		$1.0 \times 10^{-3}$		
Bulk RS $G_{KK}$ ( $k/\overline{M}_{Pl} = 1.0$ )	$G_{KK} \rightarrow WW$	2	1.9 (ggF)	0.28	0.037	0.47 (ggF)	0.20	0.062	
	$G_{KK} \rightarrow ZZ$		0.050 (VBF)	0.14		$1.6 \times 10^{-2}$ (VBF)	0.10		



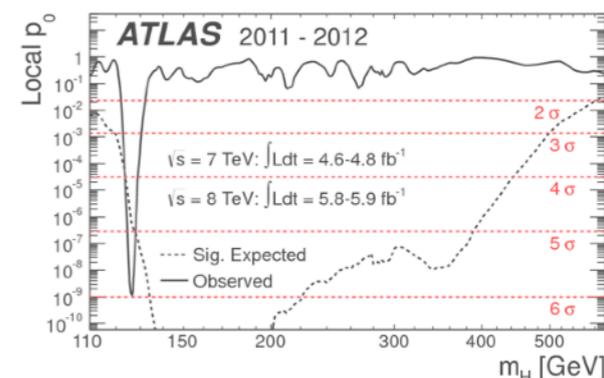
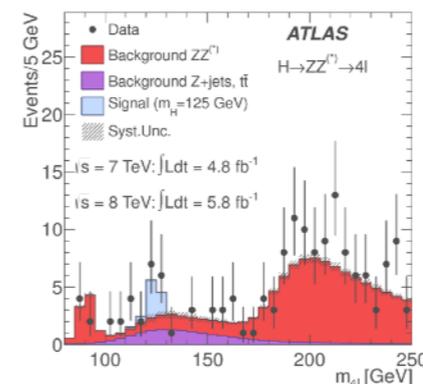
# Analysis strategy

- Set of signal regions, SRs, to optimise the signal sensitivity
- Set of control regions, CRs, to constrain the SM bkg:
  - ▶ high purity regions to constraint the MC
  - ▶ data-driven techniques
- Unblind your SRs, what do you observe?



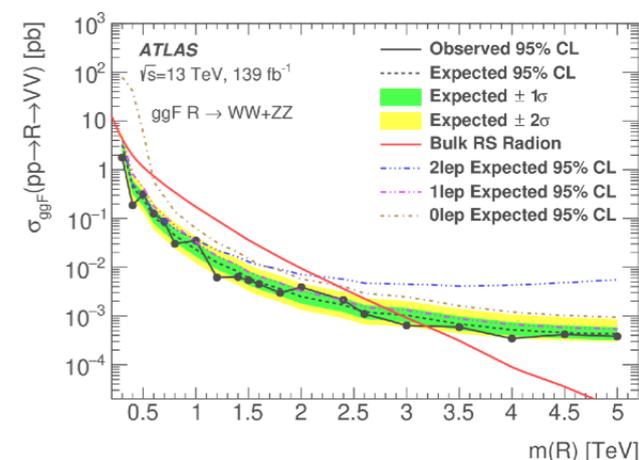
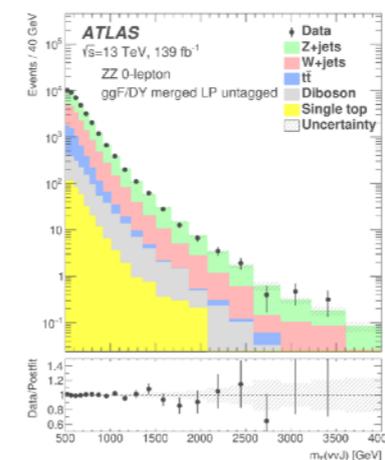
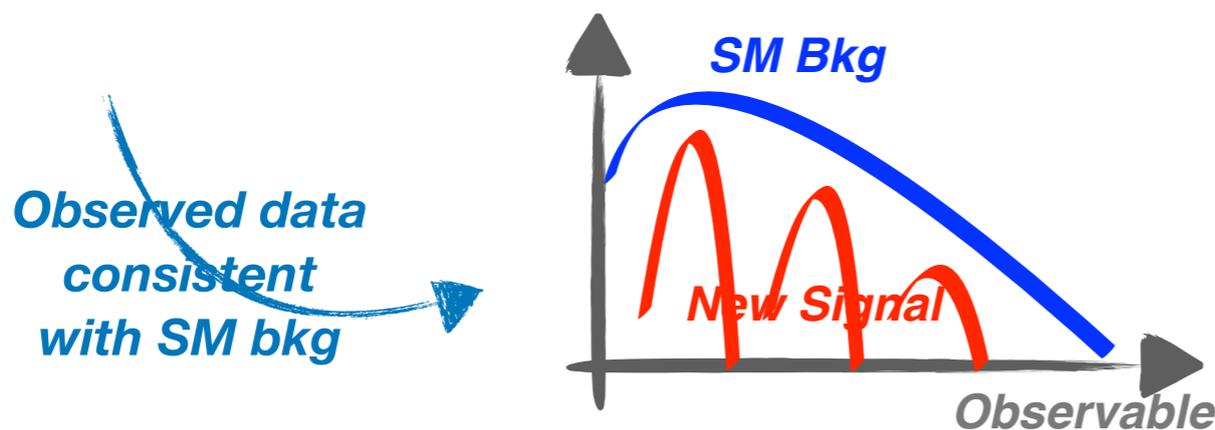
[link](#)

Claim your discovery!



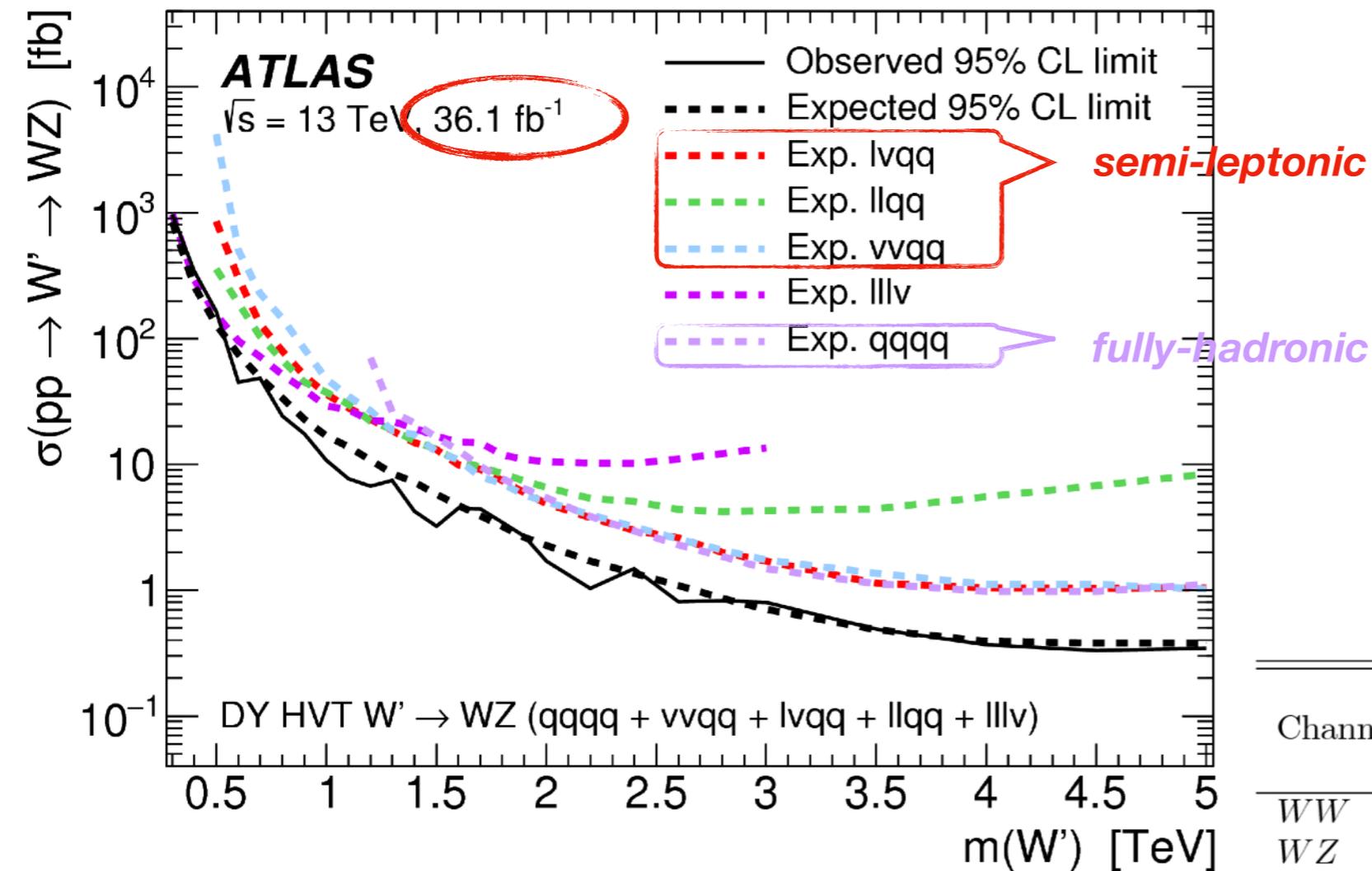
[HDBS-2018-10](#)

Put bounds on BSM models





# Diboson signatures sensitivity



Where we were with early run-2 data?

- ▶ Low mass:  $llqq/llv$
- ▶ High mass:  $vvqq/lvqq/qqqq$

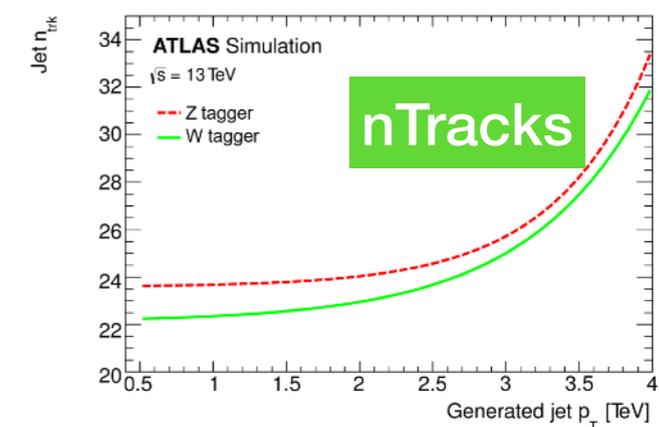
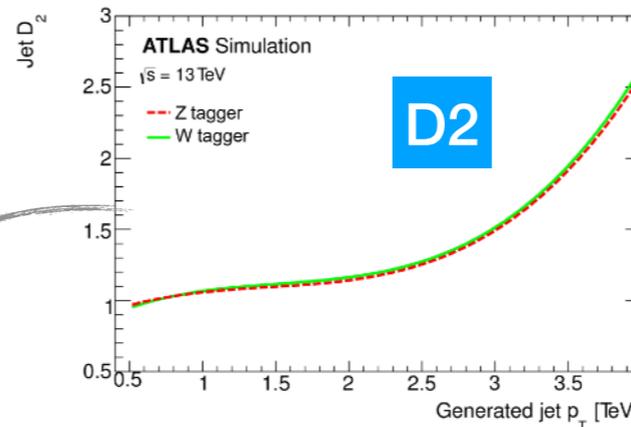
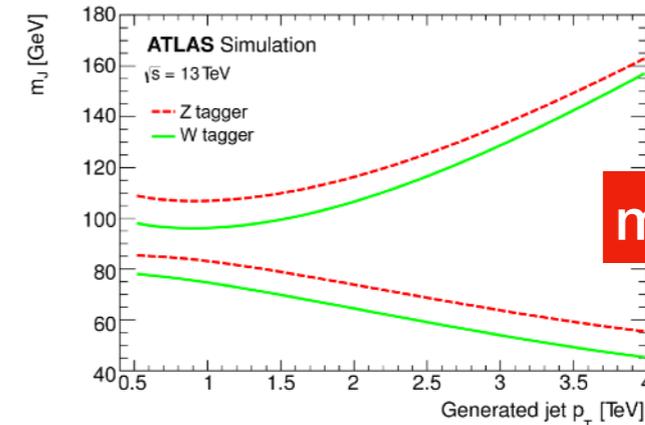
Channel	Lower limits on resonance mass [TeV]					
	HVT model A		HVT model B		Bulk RS	
	Obs	Exp	Obs	Exp	Obs	Exp
$WW$	2.9	3.1	3.6	3.5	1.7	1.9
$WZ$	3.6	3.6	3.9	3.9	-	-
$ZZ$	-	-	-	-	1.5	1.7
$VV$	3.7	3.7	4.0	3.9	2.3	2.2
$WH$	2.6	2.8	2.8	3.1	-	-
$ZH$	2.7	2.5	2.8	2.8	-	-
$VH$	2.8	3.1	3.0	3.4	-	-
$lv$	4.6	4.6	-	-	-	-
$ll$	4.5	4.4	-	-	-	-
$lv/ll$	5.0	5.0	-	-	-	-
$VV/VH$	4.3	4.3	4.5	4.4	-	-
$VV/VH/lv/ll$	5.5	5.3	-	-	-	-

[EXOT-2017-31](#)



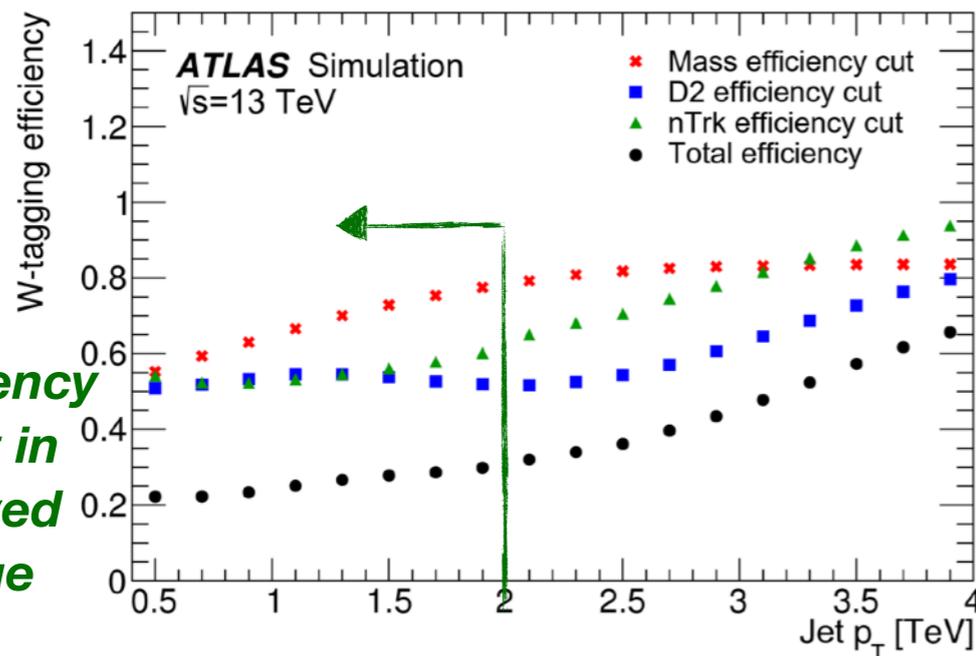
# Boson jets and taggers

- We look for BSM hints in the diboson events
  - ▶ the SM  $VV$  events are hidden in the **large amount of the QCD bkg**
- We need powerful **boson-jet tagger** to select our signal topology
  - ▶ di-jets topology, TCC large- $R=1$ . jets
- 3-variables based tagger
  - ▶ WP optimised using significance

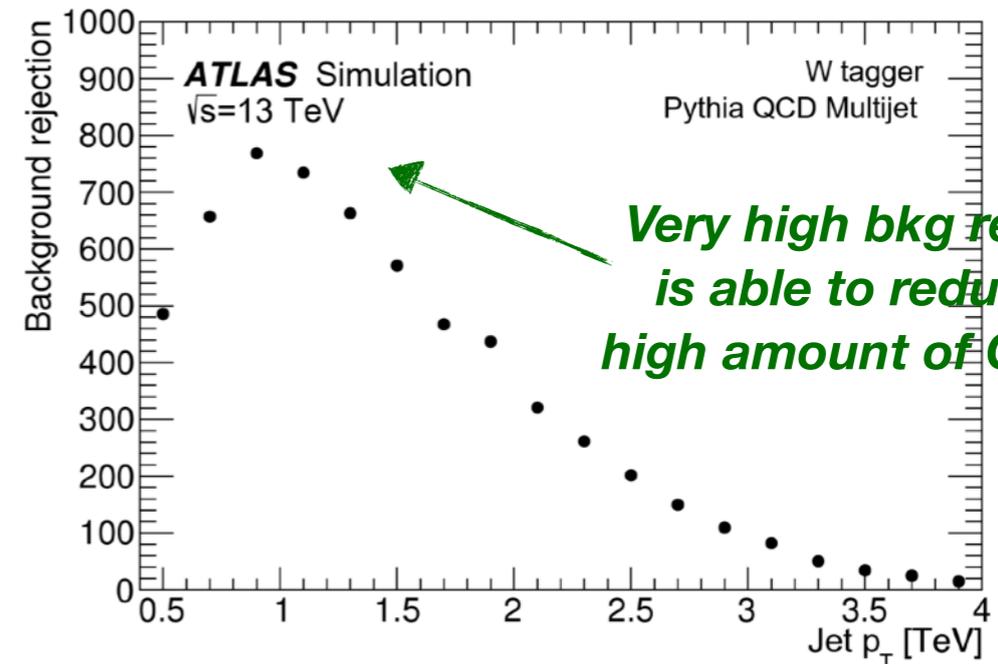


signal efficiency

bkg rejection



signal efficiency mostly flat in the observed data range

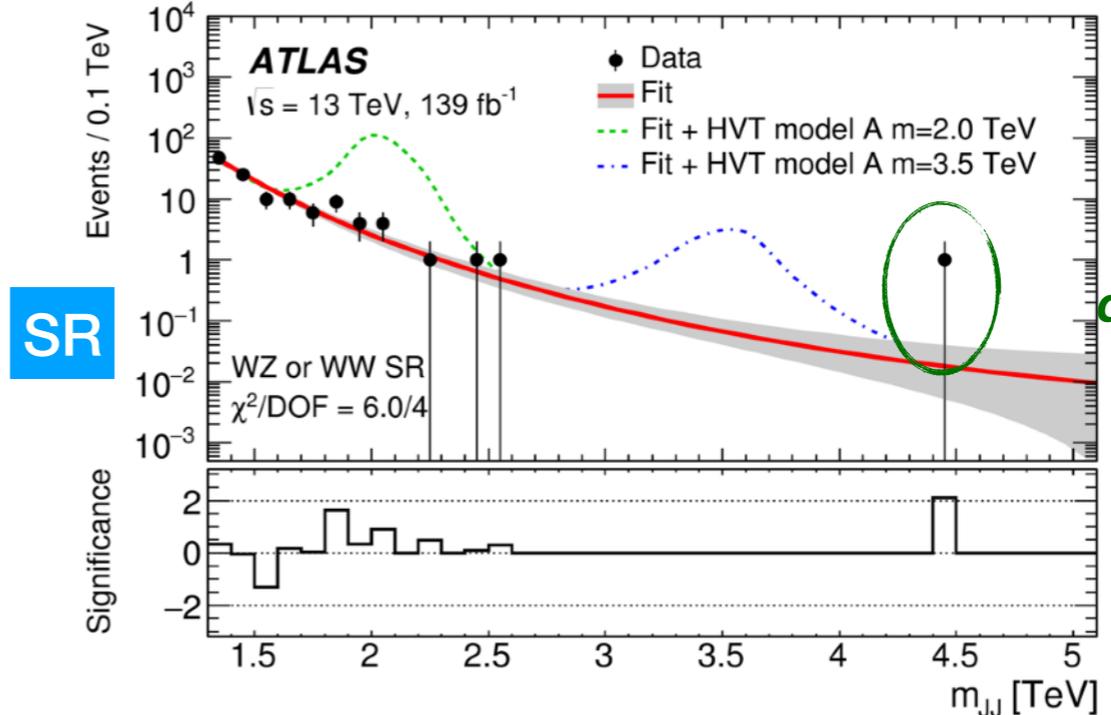
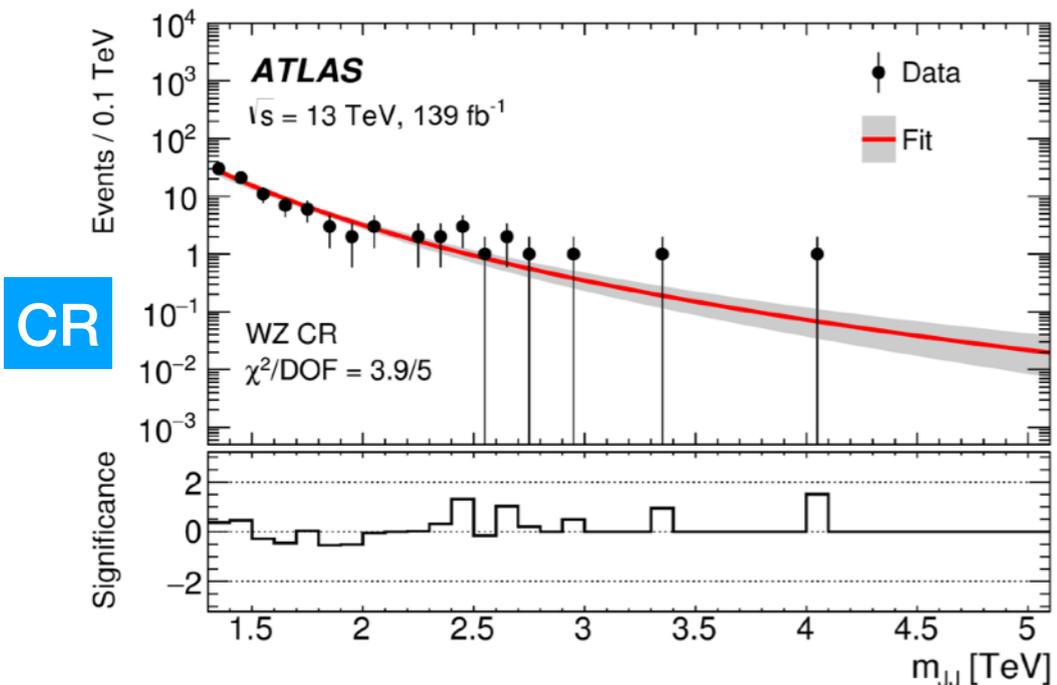
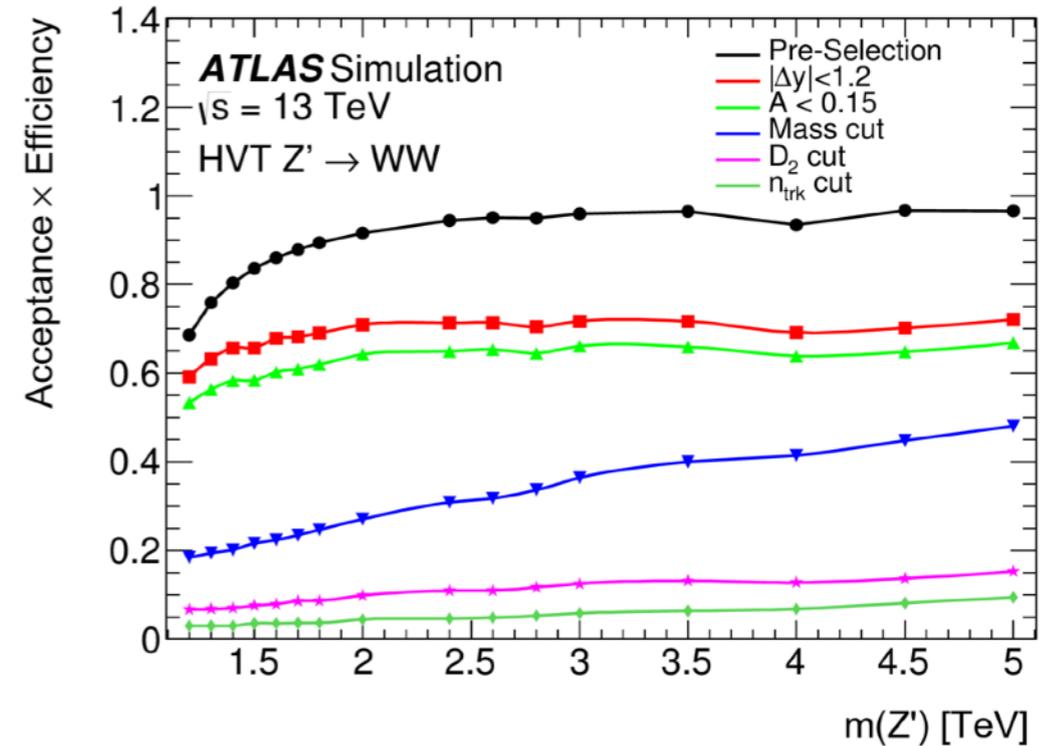


Very high bkg rejection is able to reduce the high amount of QCD bkg



# Fully-hadronic strategy

- Very simple analysis:
  - ▶ di-jets requirements:  $\Delta Y < 1.2$  (reduce t-channel QCD)  $p_T\text{-asymmetry} < 0.15$  (to reduce mis-reconstructed events)
  - ▶ di-tagging: *boson tagger x 2*
- Fully data-driven bkg estimation:
  - ▶ modelling of the fit shape tested in CRs
  - ▶ bkg uncertainty driven by the *fit uncertainty*
  - ▶ *tagger uncertainty* in dedicated V+jets CR

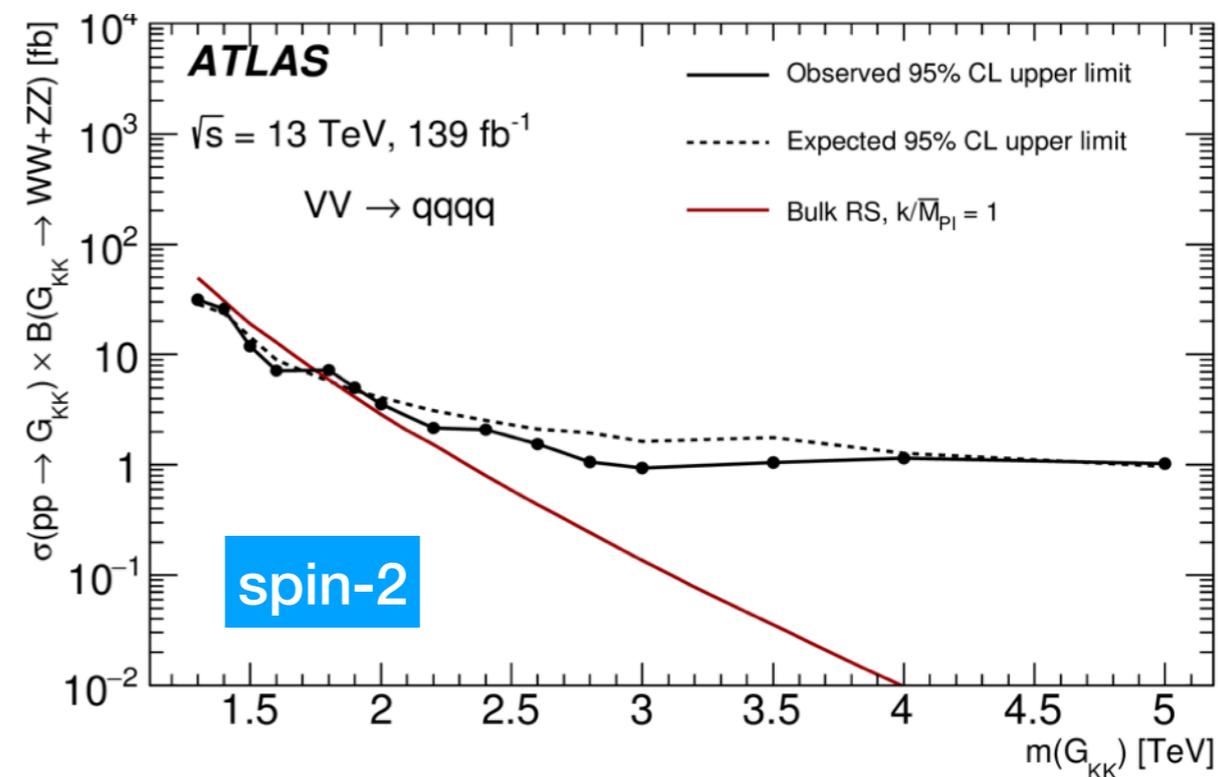
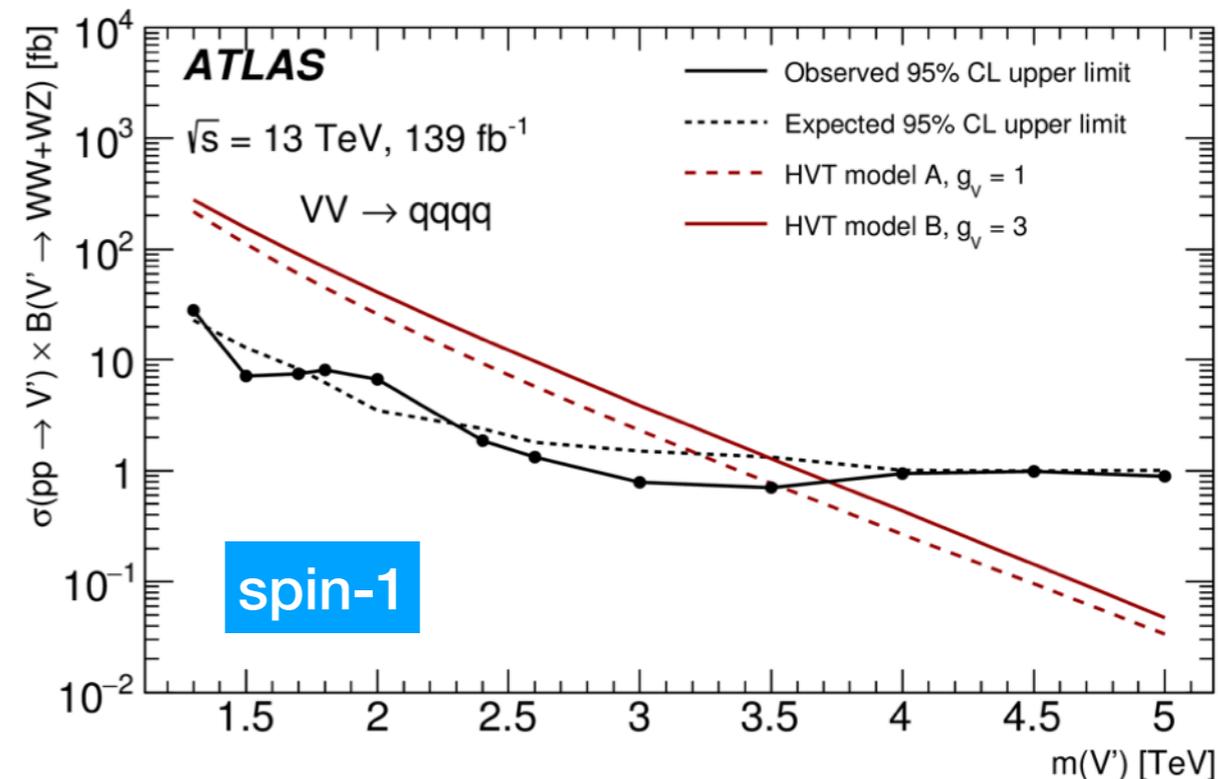


We collect data at very high  $m_{JJ}$  range



# VV fully-hadronic results

- No significant deviation observed
  - ▶ interpretation of the observed data in terms of BSM models
- Very competitive results in the high mass regime
  - ▶ we can not say anything below 1.3 TeV



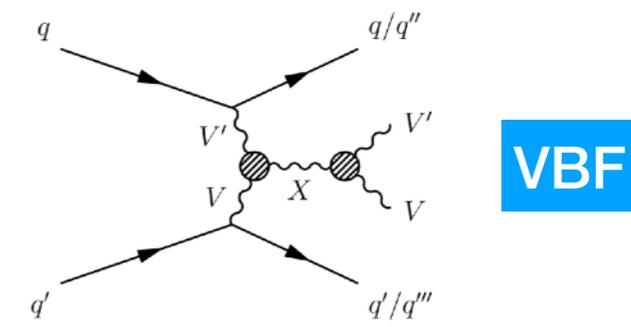
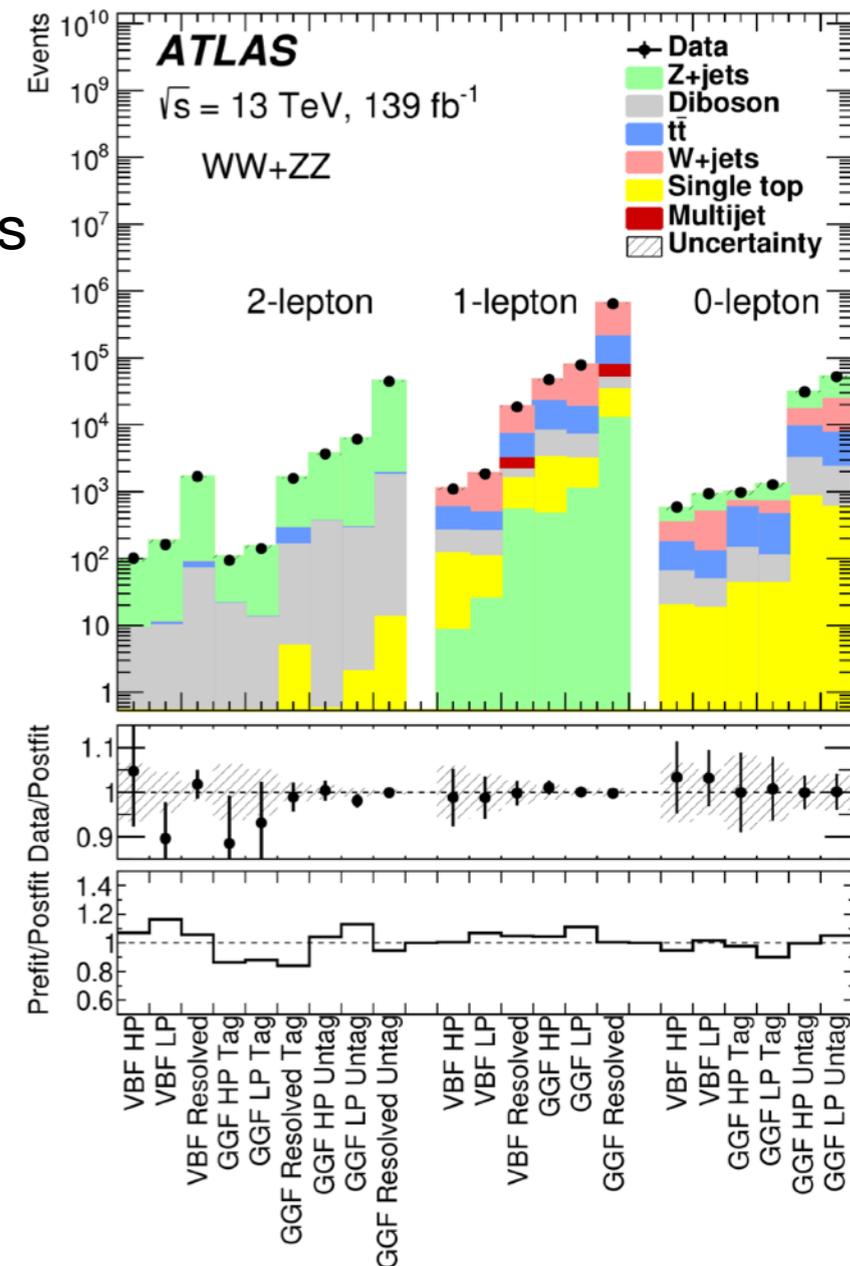
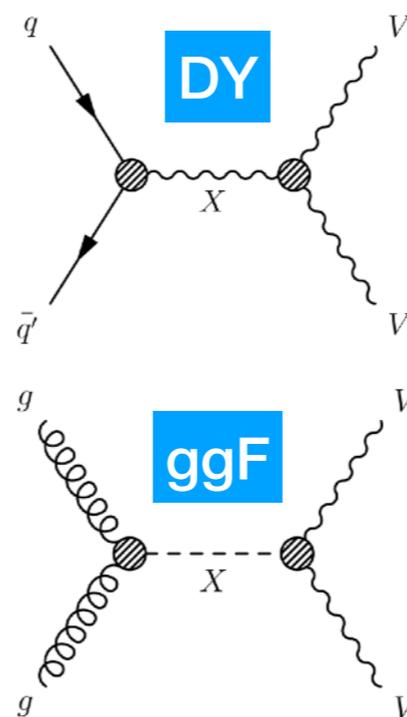
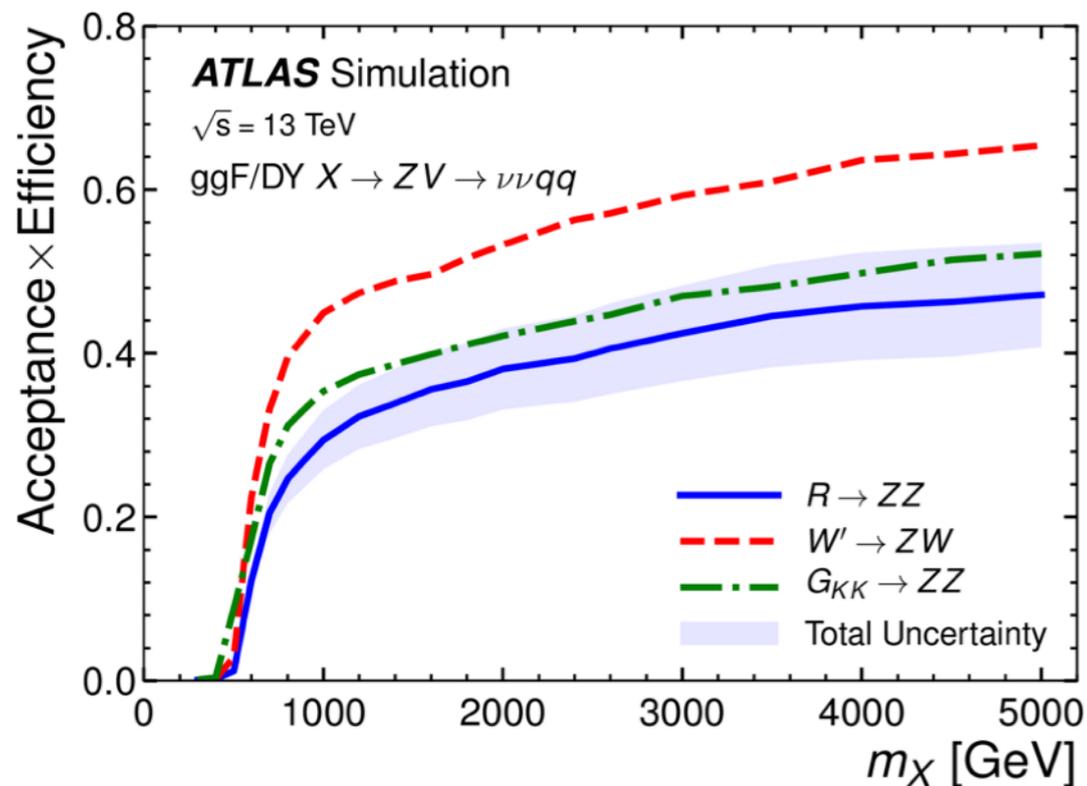
Model	Signal Region	Excluded mass range [TeV]
Radion	WW	none
	ZZ	none
	WW + ZZ	none
HVT model A, $g_V = 1$	WW	1.3–2.9
	WZ	1.3–3.4
	WW + WZ	1.3–3.5
HVT model B, $g_V = 3$	WW	1.3–3.1
	WZ	1.3–3.6
	WW + WZ	1.3–3.8
Bulk RS, $k/\overline{M}_{Pl} = 1$	WW	1.3–1.6
	ZZ	none
	WW + ZZ	1.3–1.8



# Semi-leptonic signatures

HDBS-2018-10

- Semi-leptonic channels has **lower BR but cleaner environment** w.r.t. fully-hadronic channel
  - ▶ MC-based bkg estimation with quite complex SRs/CRs scheme definition
- Different channels to be combined:
  - ▶ **3 leptons channels**: ll, lv, vv
  - ▶ 2 V-hadronic reconstruction techniques: **resolved/boosted**
  - ▶ **VBF vs ggF/DY** production mechanism categorisation





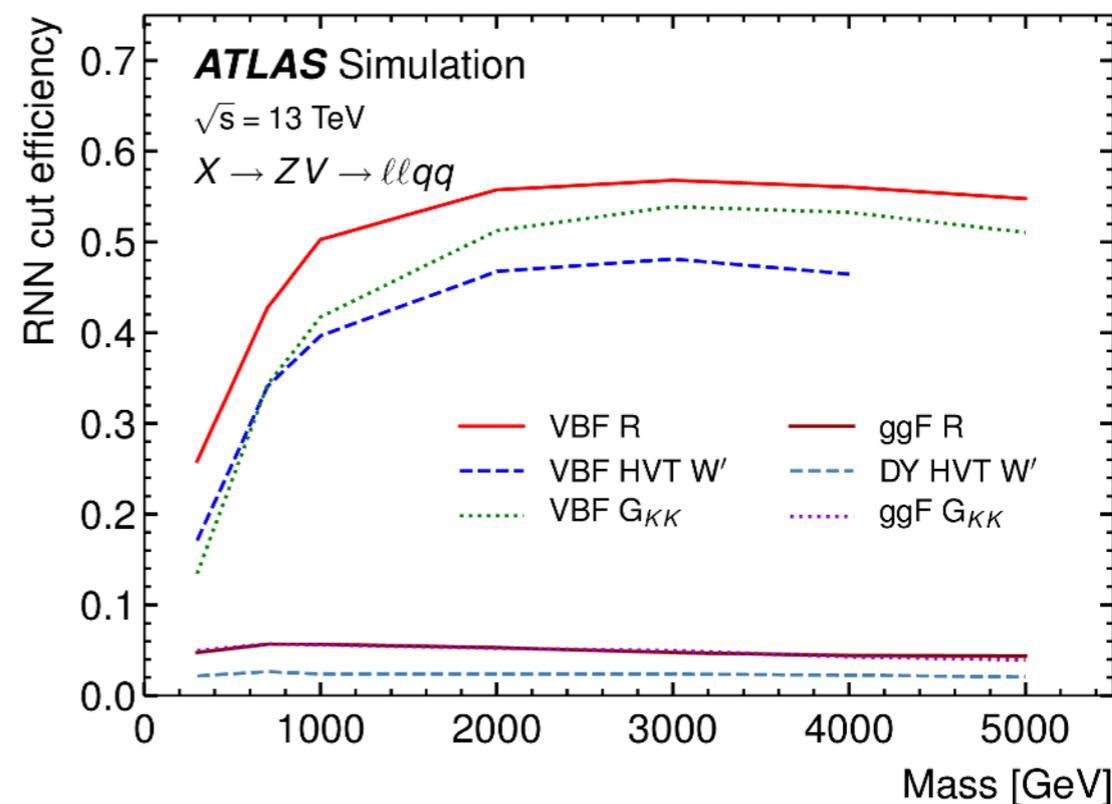
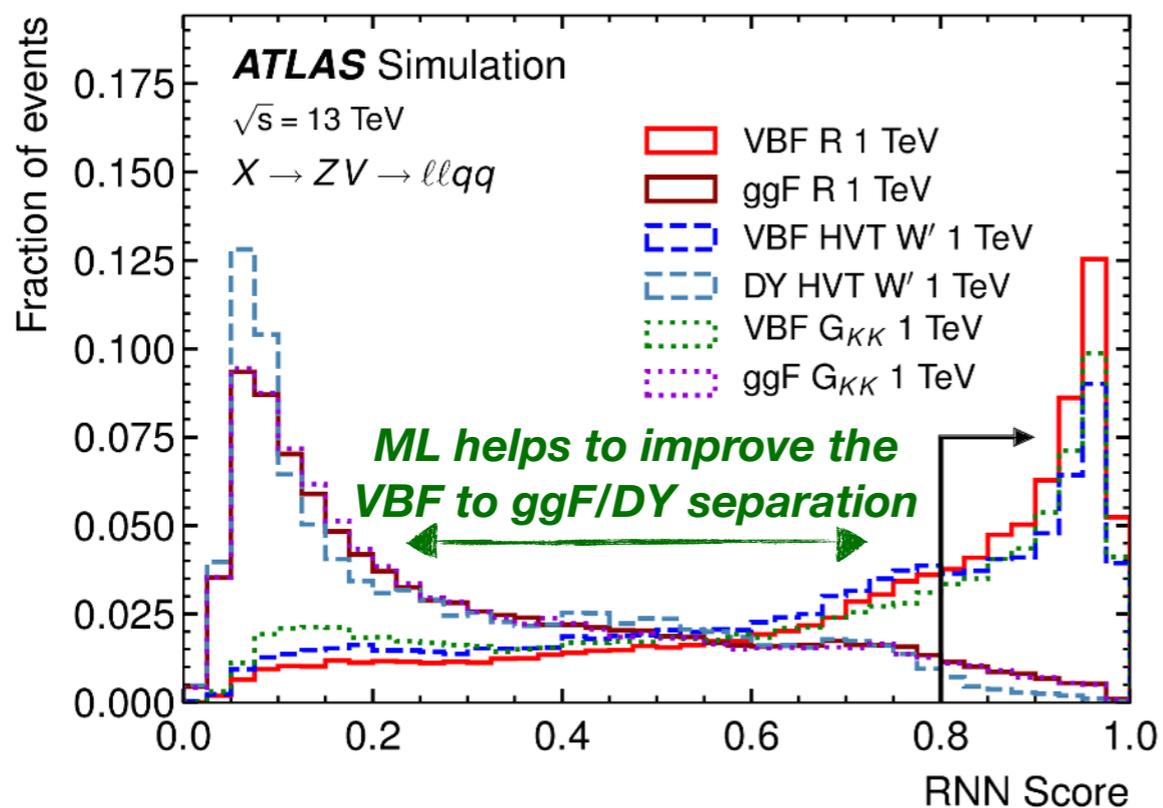
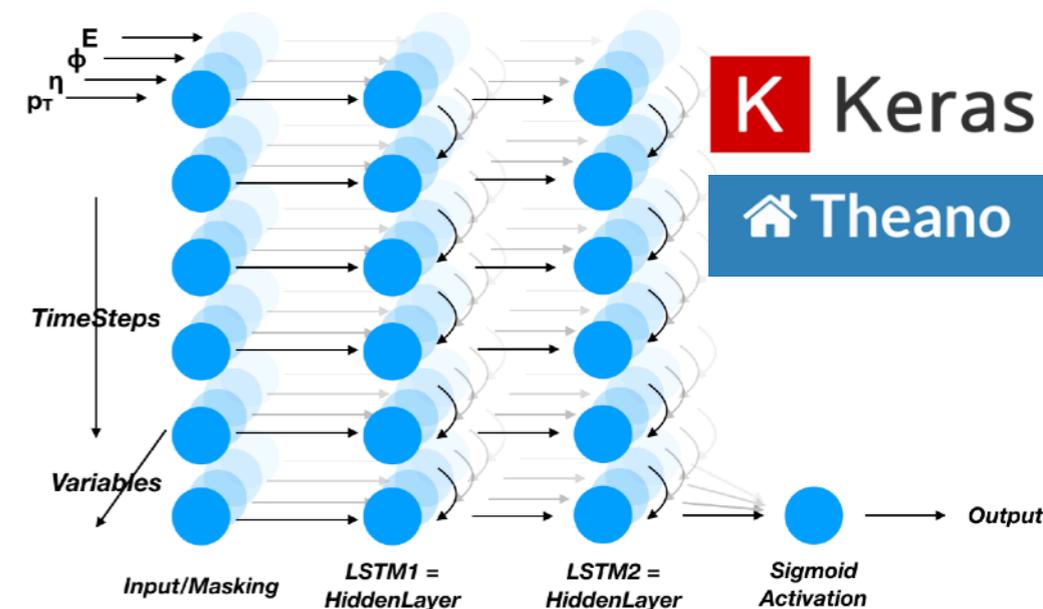
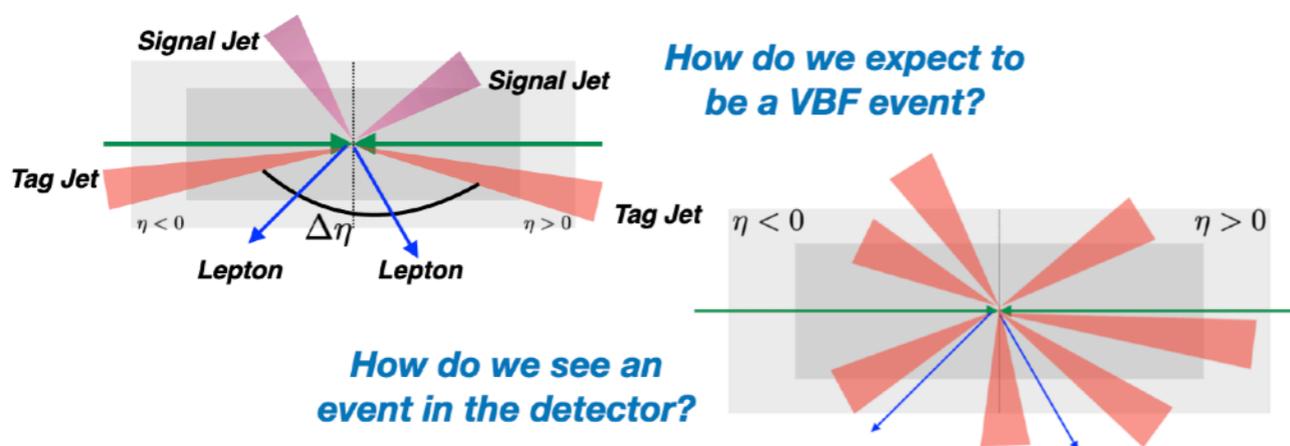
# VBF categorisation using ML

- Novel ML technique introduced to categorise VBF vs ggF/DY events

- ▶ RNN dealing with **low-level jets** input variables

- improved performances w.r.t. cut based approaches

- ▶ **1-jet VBF** events naturally recovered

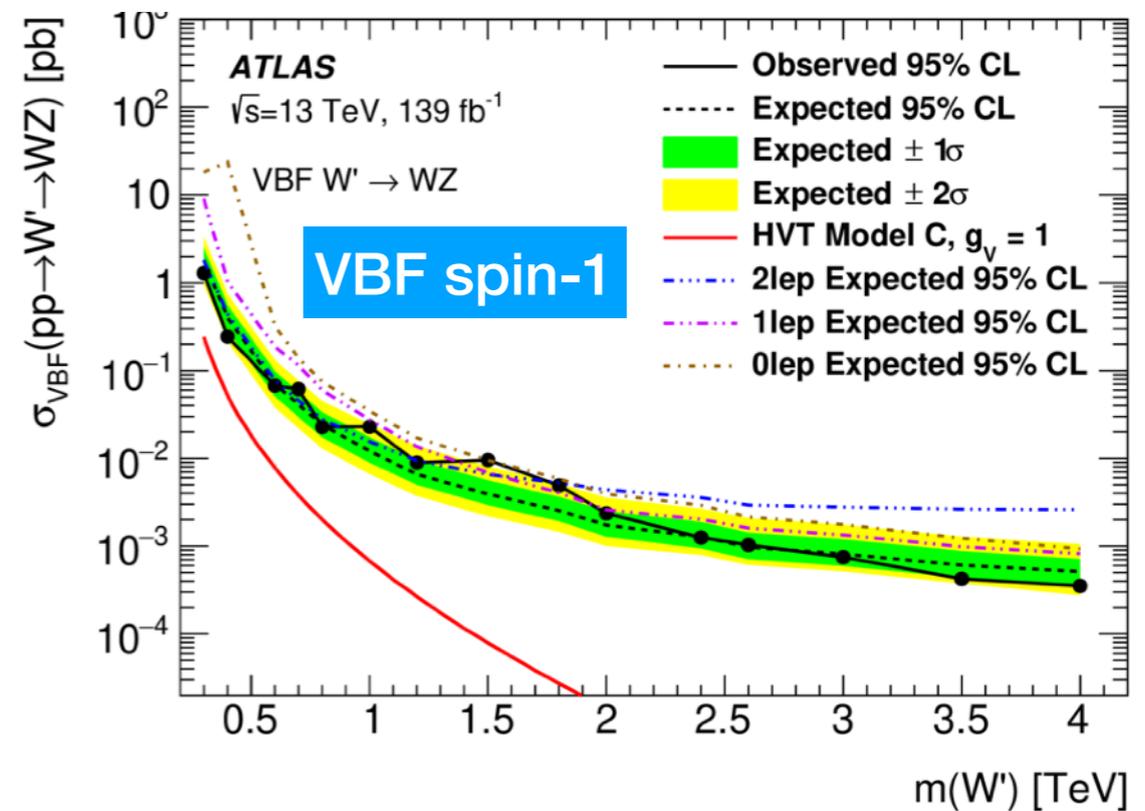
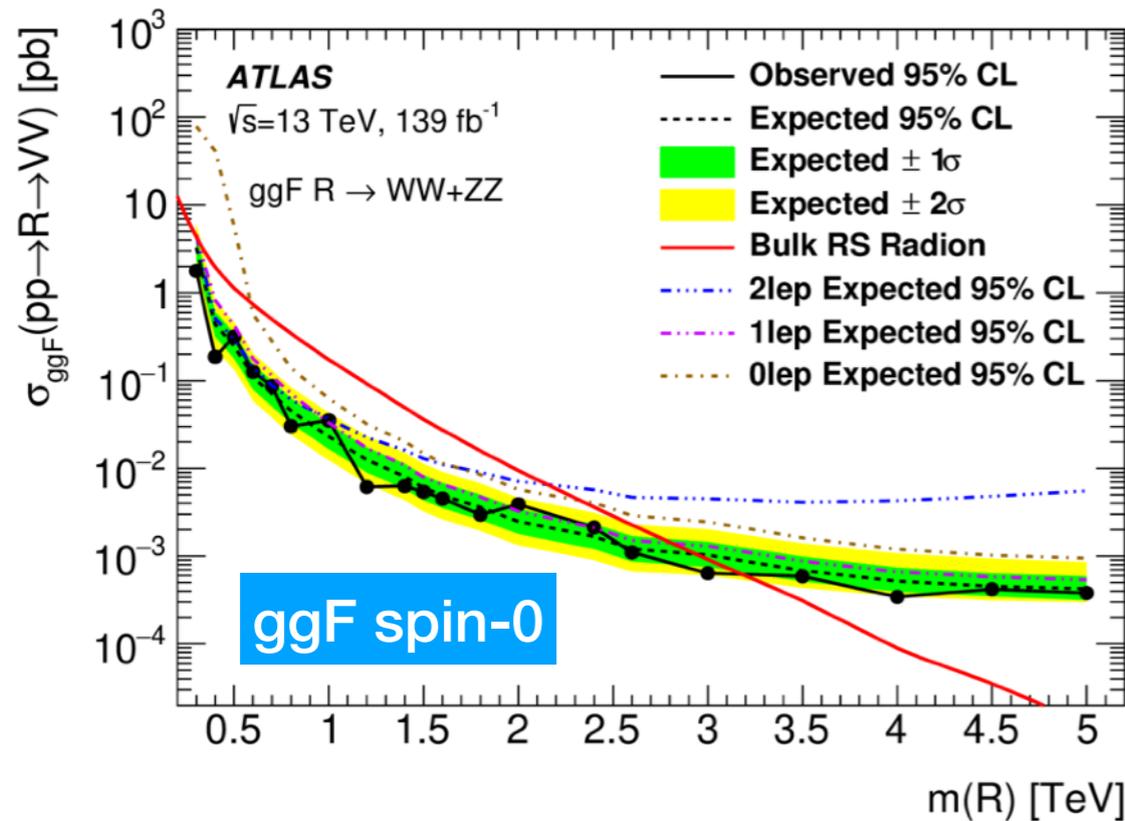
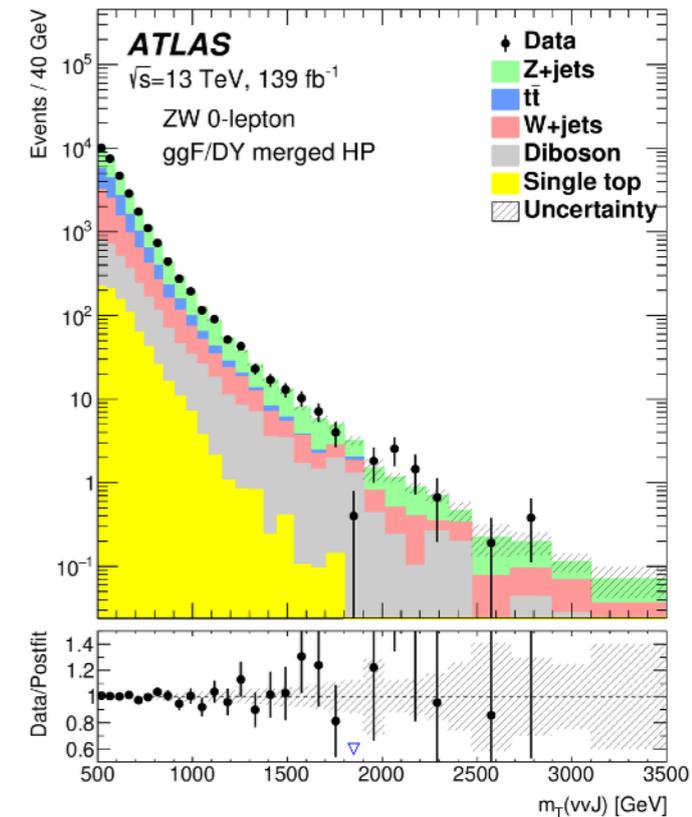
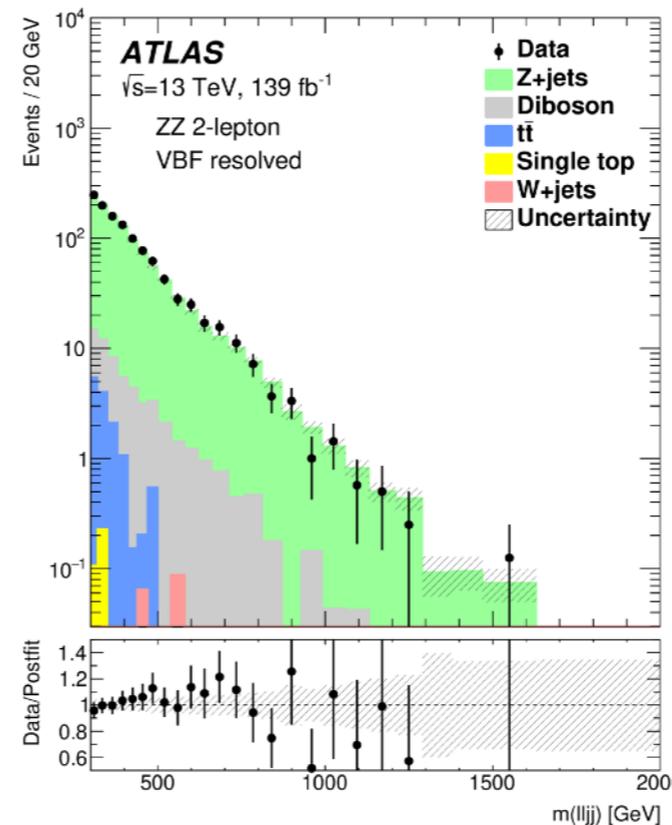




# $VV$ semi-leptonic results

HDBS-2018-10

- No significant deviation observed
  - ▶ new data are interpreted as upper bounds on the cross section of new models
- Different channels let to cover large p.s.:
  - ▶ 0/1 lepton channels contributing at high-mass, 2 lepton at low-mass
  - ▶ VBF regions covered, still need to be improved to get exclusions





# Conclusions & perspectives

PUB-2021-018

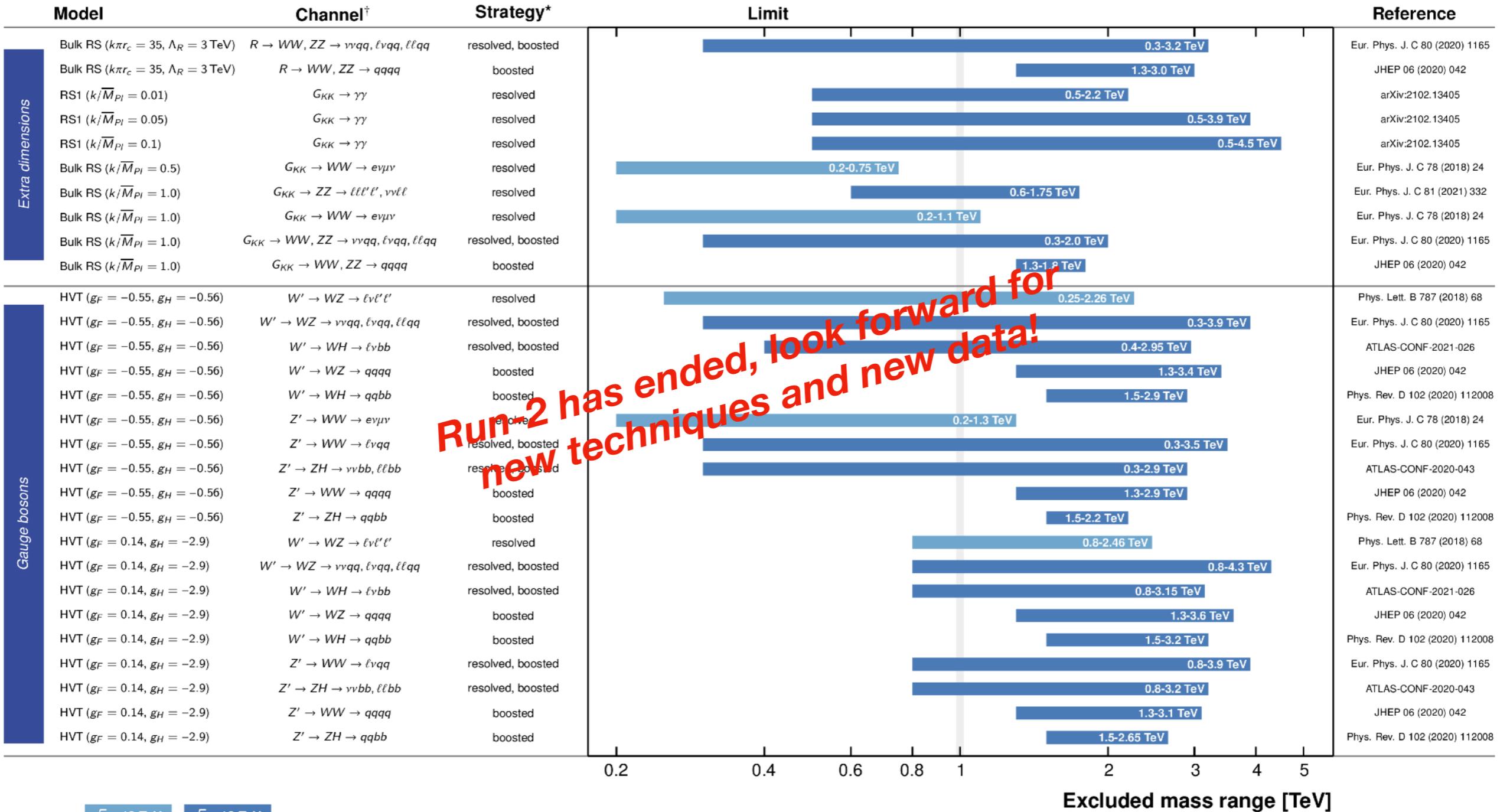
## ATLAS Diboson Searches - 95% CL Exclusion Limits

Status: June 2021

$\mathcal{L} = (36.1 - 139) \text{ fb}^{-1}$

ATLAS Preliminary

$\sqrt{s} = 13 \text{ TeV}$



$\sqrt{s} = 13 \text{ TeV}$   
 $\mathcal{L} = 36.1 \text{ fb}^{-1}$

$\sqrt{s} = 13 \text{ TeV}$   
 $\mathcal{L} = 139 \text{ fb}^{-1}$

\*small-radius (large-radius) jets are used in resolved (boosted) events

†with  $\ell = \mu, e$



# Conclusions & perspectives

## High-mass $VV$ resonance searches during Run-2

[PUB-2021-018](#)

- Different channels very competitive

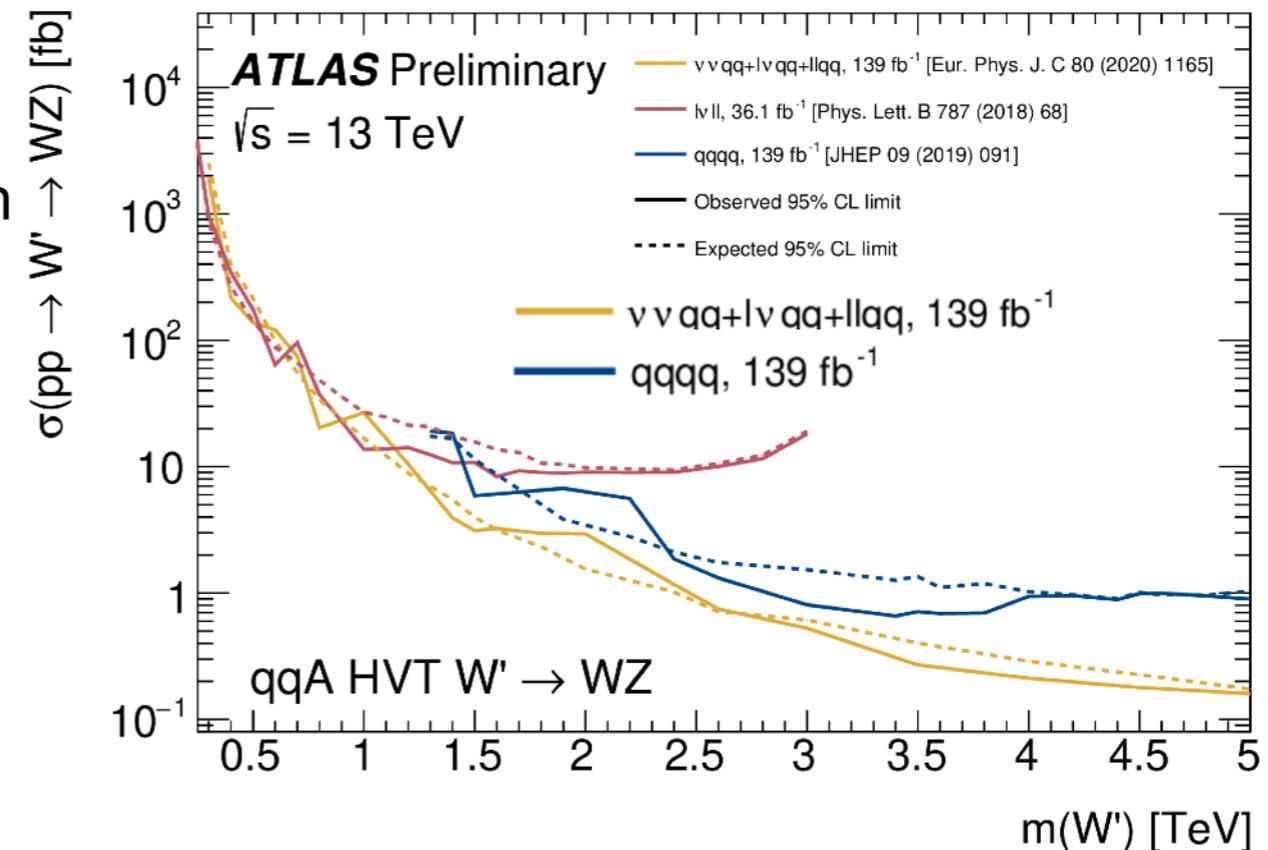
### Fully-hadronic channel:

- ▶ large- $R(=1.)$  jets and very powerful boson tagger technique are the keys to exploit high mass range

### Semi-leptonic channel:

- ▶ new ML techniques already exploited for VBF categorisation events (VBF-RNN)

- Several models and mass ranges excluded



### What is next?

Both channels are re-analysing Run-2 for improved results and preparation for Run-3:

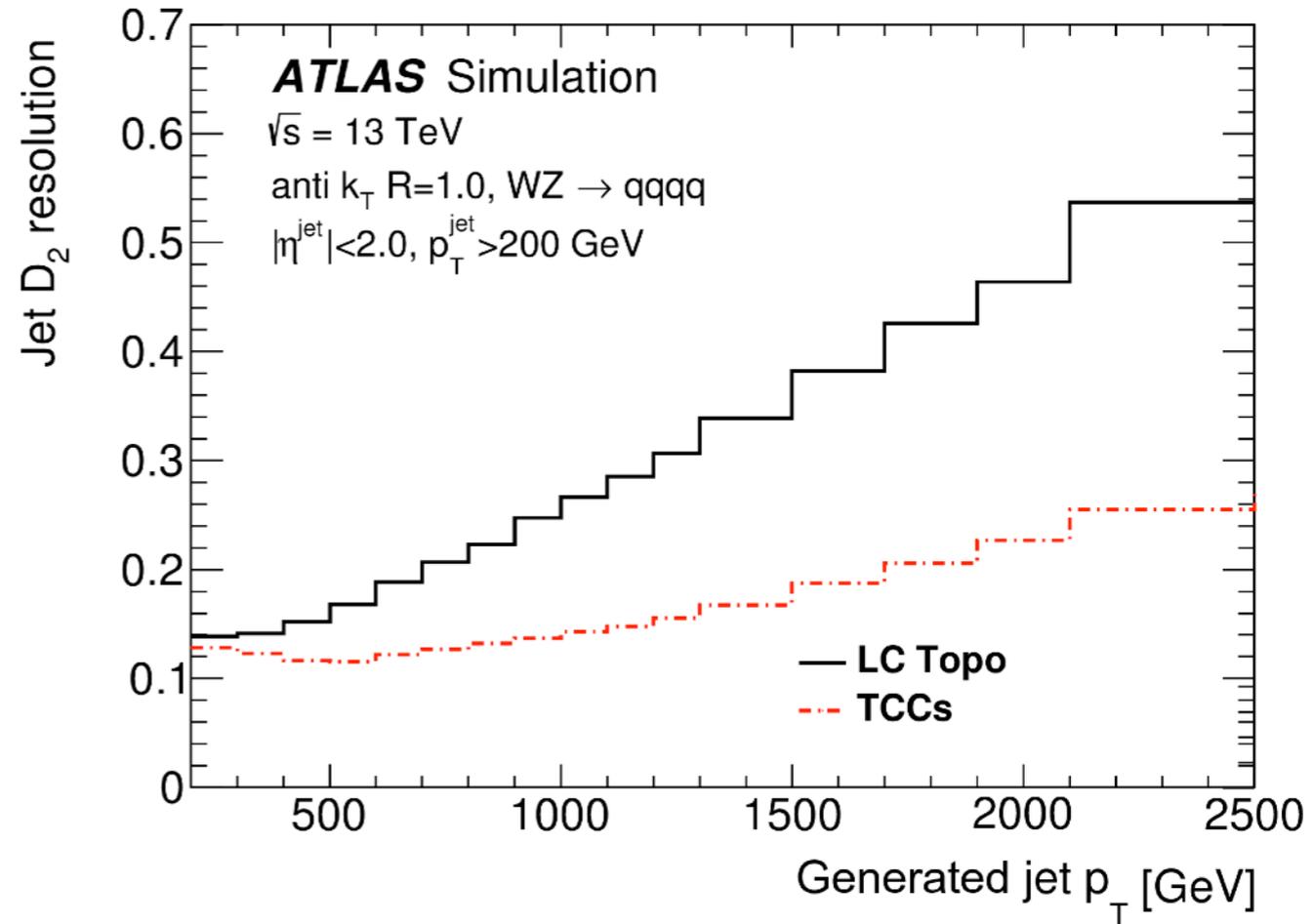
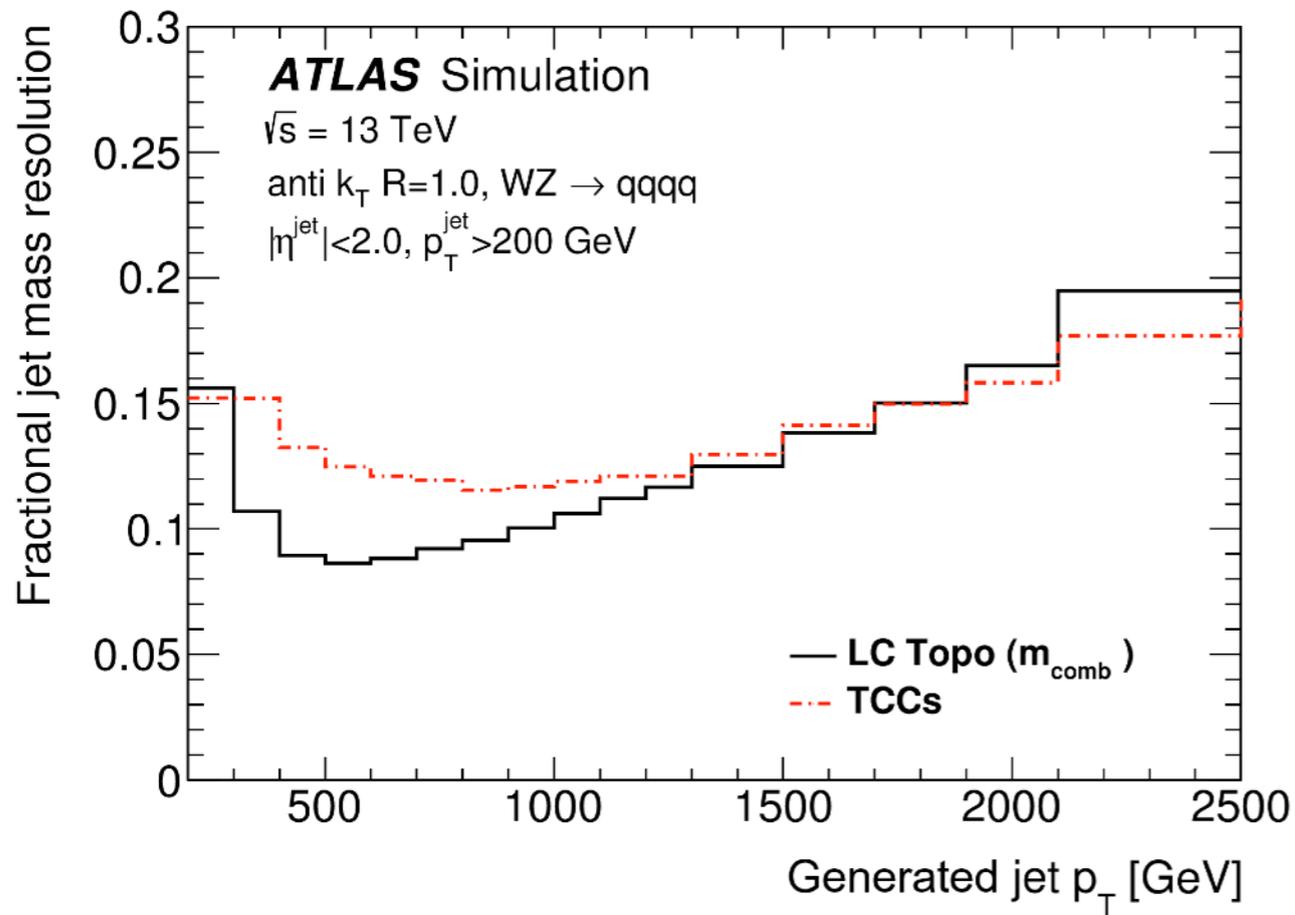
- ▶ fully-hadronic: new jets reconstruction and ML tagging techniques
- ▶ semi-leptonic: extension of ML approaches





*backup*

# LCTopo VS TCC



# Event Selection

Signal region

Veto events with leptons:

No  $e$  or  $\mu$  with  $p_T > 25$  GeV and  $|\eta| < 2.5$

Event pre-selection:

$\geq 2$  large- $R$  jets with  $|\eta| < 2.0$  and mass  $> 50$  GeV

$p_{T1} > 500$  GeV and  $p_{T2} > 200$  GeV

$m_{JJ} > 1.3$  TeV

Topology and boson tag:

$|\Delta y| = |y_1 - y_2| < 1.2$

$A = (p_{T1} - p_{T2}) / (p_{T1} + p_{T2}) < 0.15$

Boson tag with  $D_2$  variable,  $n_{\text{trk}}$  variable, and  $W$  or  $Z$  mass window

V+jets control region

Veto events with leptons:

No  $e$  or  $\mu$  with  $p_T > 25$  GeV and  $|\eta| < 2.5$

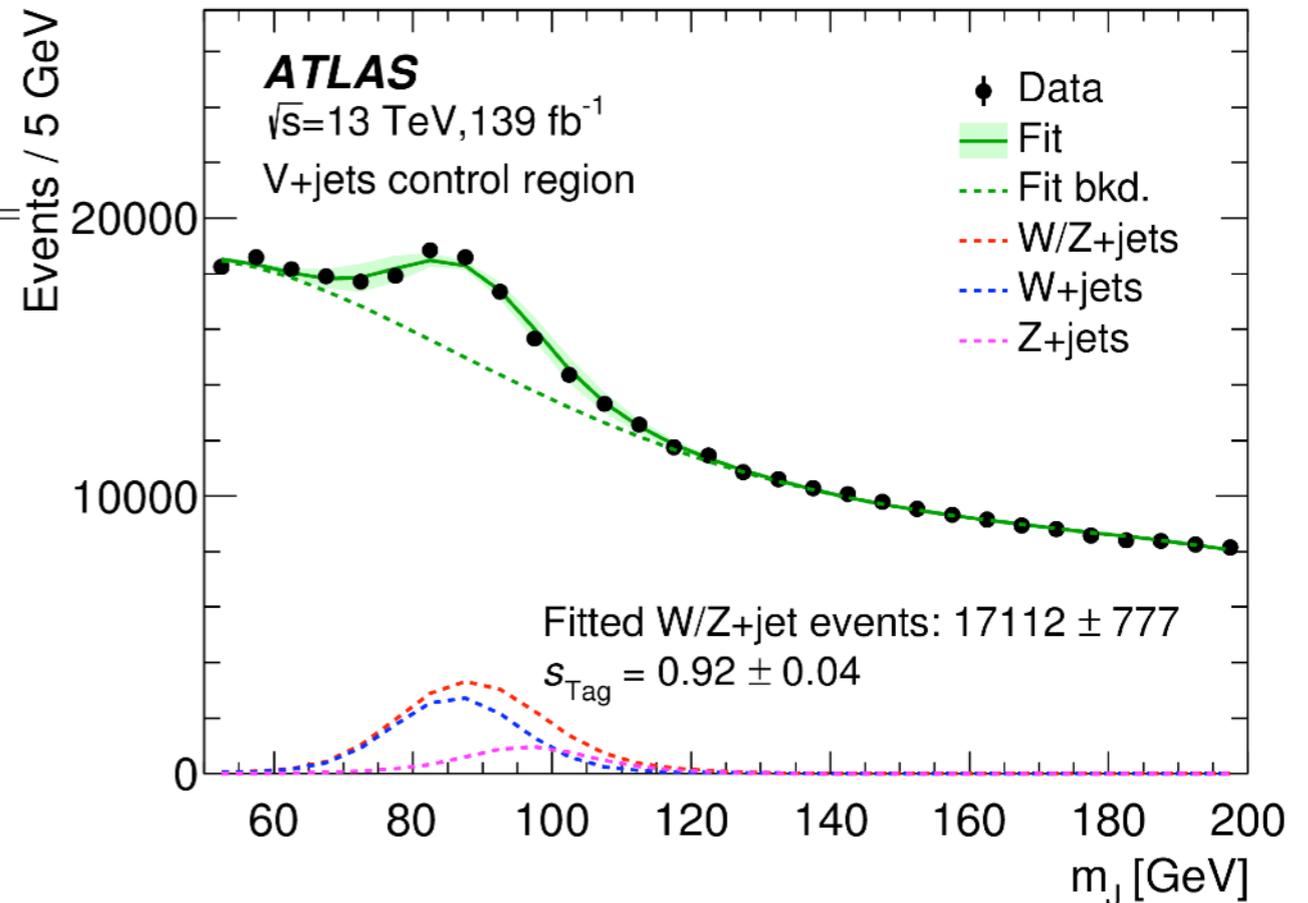
V+jets selection:

$\geq 2$  large- $R$  jets with  $|\eta| < 2.0$

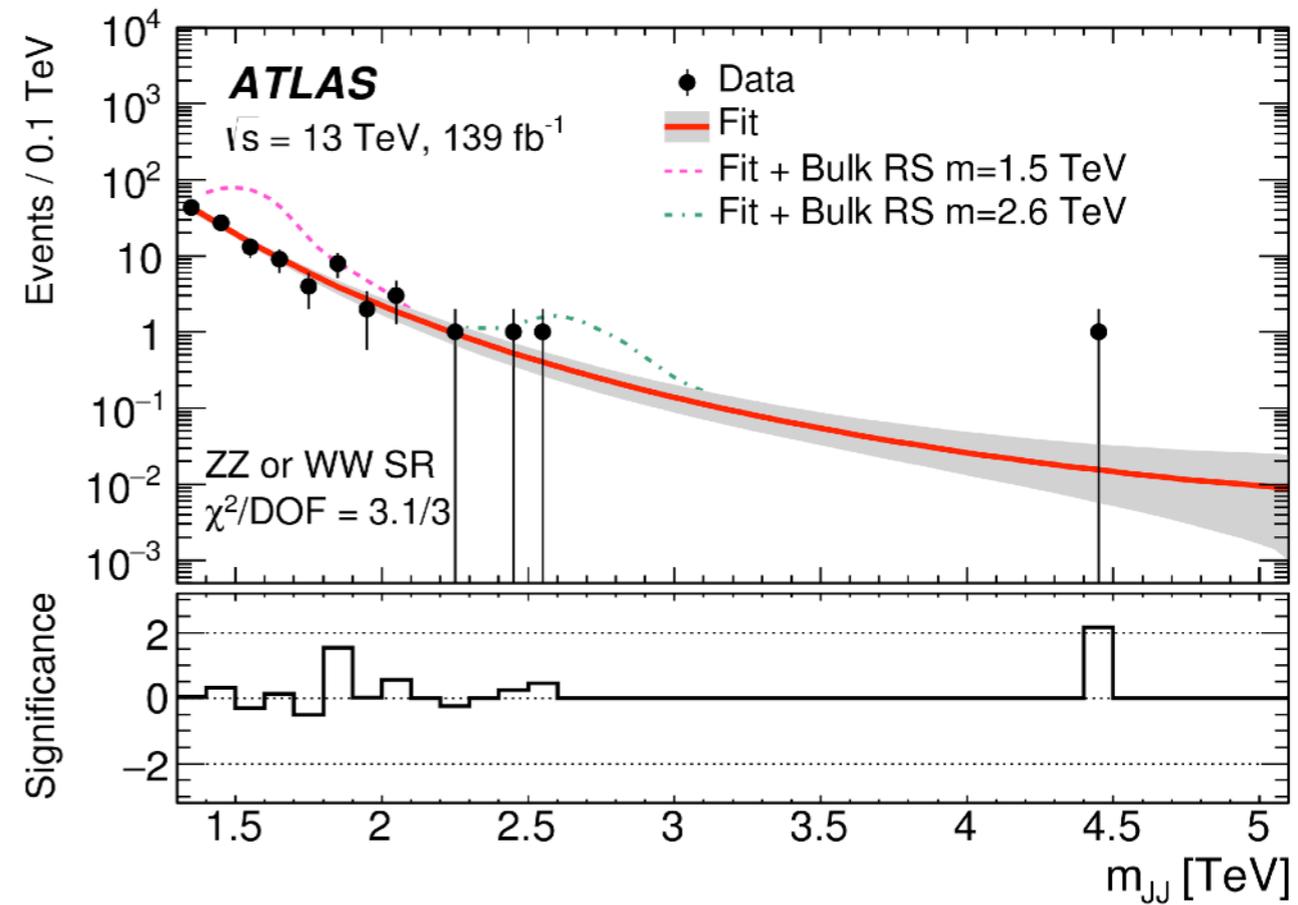
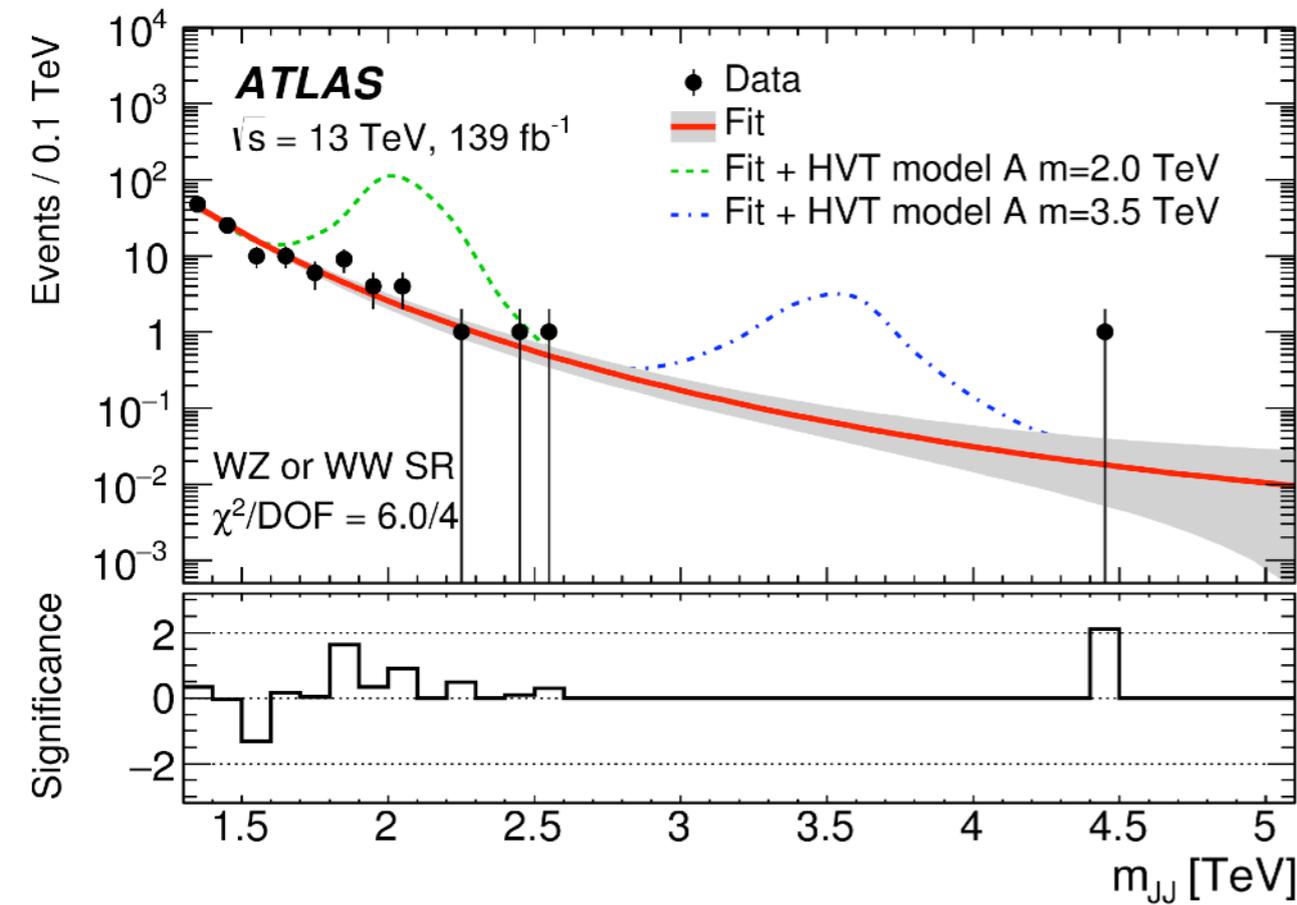
$p_{T1} > 600$  GeV and  $p_{T2} > 200$  GeV

Boson tag with  $D_2$  and  $n_{\text{trk}}$  variables on either jet

Anti-boson tag with  $D_2$  variable on other jet

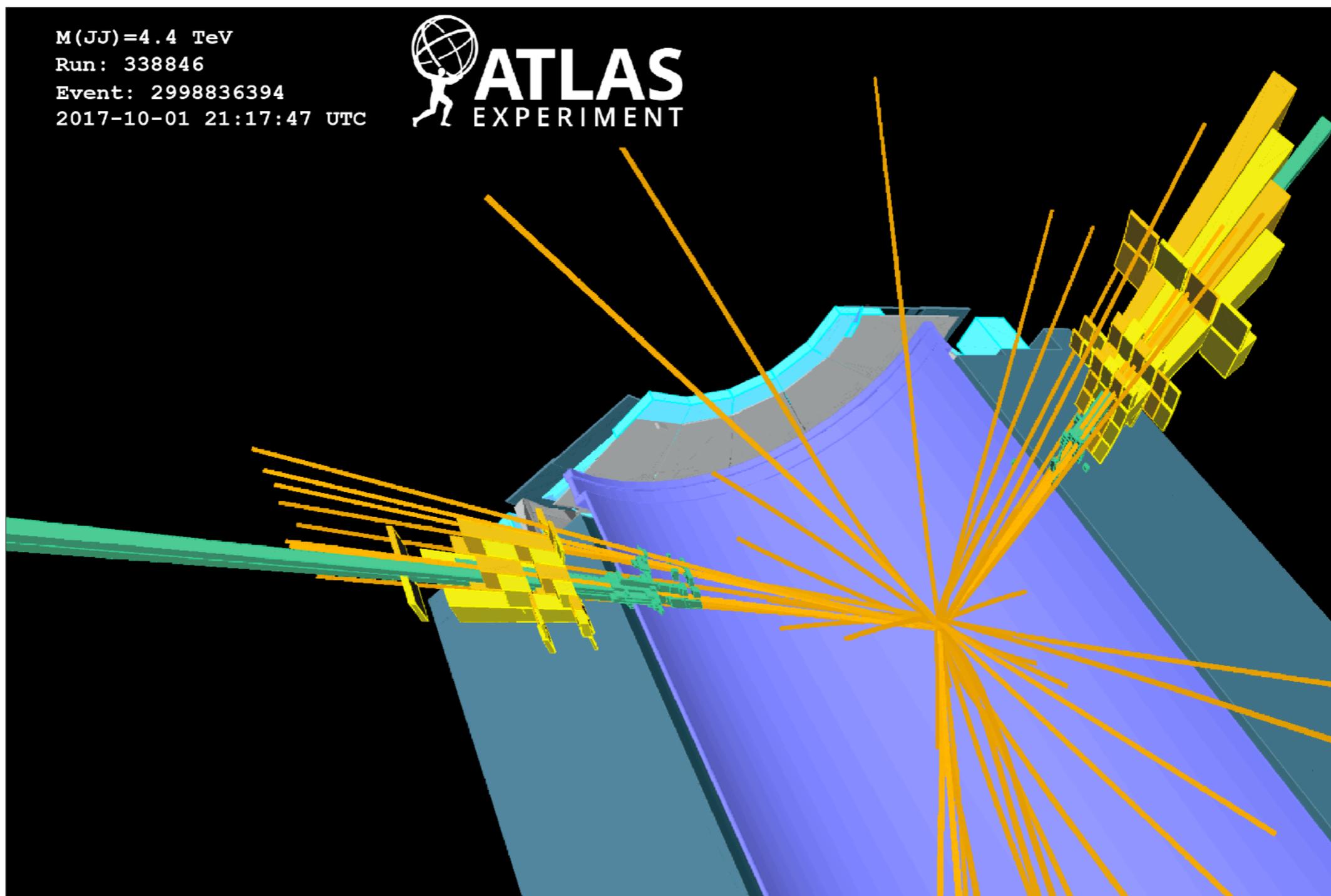


# SRs, fit, uncertainties

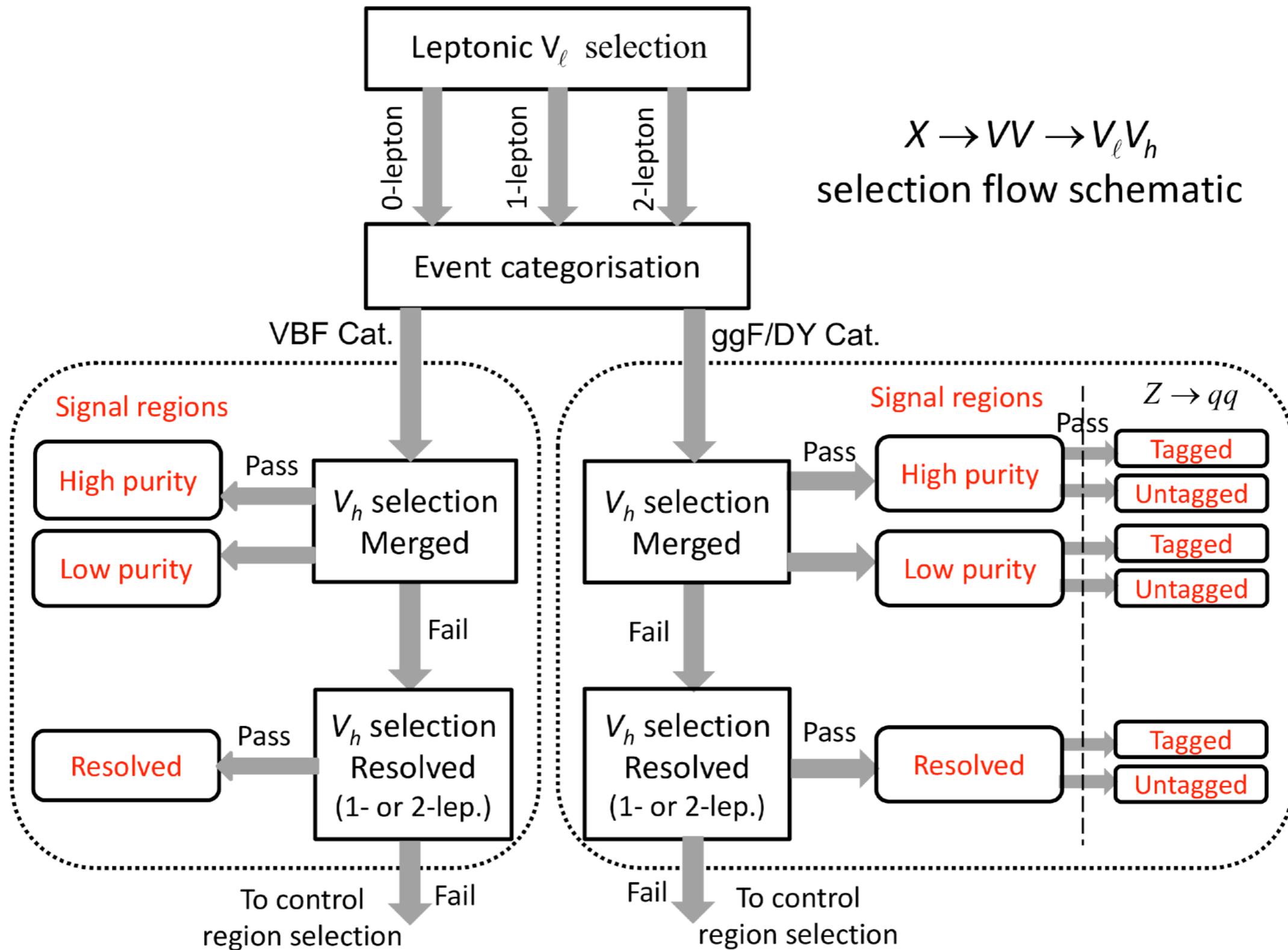


Source	$m(V') = 1.4 \text{ TeV}$	$m(G_{KK}) = 2.8 \text{ TeV}$
Fit	32%	2.4%
Jet $p_T$ scale	29%	1.5%
Total systematic uncertainty	79%	17%
Statistical uncertainty	61%	99%

# Event display $m_{JJ} = 4.4 \text{ TeV}$



# Analysis flow



# Event selection

Event selection	0-lepton ( $ZV \rightarrow \nu\nu V_h$ )	1-lepton ( $WV \rightarrow \ell\nu V_h$ )	2-lepton ( $ZV \rightarrow \ell\ell V_h$ )
$V_\ell$ selection	No <i>Loose</i> lepton $E_T^{\text{miss}} > 250$ GeV $p_T^{\text{miss}} > 50$ GeV	1 <i>Tight</i> electron or 1 <i>Medium</i> muon with $p_T^\ell > 30$ GeV $E_T^{\text{miss}} > 60$ GeV $p_T^{V_\ell} > 75$ GeV	2 <i>Loose</i> leptons with $p_T^\ell > 30$ GeV from the $Z \rightarrow \ell\ell$ candidate
Event veto	No additional <i>Loose</i> leptons Veto events with $b$ -jets not associated with the $Z \rightarrow qq$ candidate		
Event categorisation	$\geq 1$ large- $R$ jets or $\geq 2$ small- $R$ jets VBF and ggF/DY classification according to RNN score		
$V_h$ selection (Merged)		$E_T^{\text{miss}} > 100$ GeV $p_T^{V_\ell} > 200$ GeV	
		$\geq 1$ large- $R$ jets The leading jet passing $p_T$ -dependent $m_J$ requirement	
		$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)	$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)
$V_h$ selection (Resolved)	Not Performed	Failed merged selection $\geq 2$ small- $R$ jets with $ \eta  < 2.5$ $62 < m_{jj} < 97$ GeV for $W \rightarrow jj$ $70 < m_{jj} < 105$ GeV for $Z \rightarrow jj$	
		$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.25$ (VBF)	$\mathcal{R}_{p_T/m} > 0.35$ (ggF/DY) $\mathcal{R}_{p_T/m} > 0.35$ (VBF)



# Uncertainties

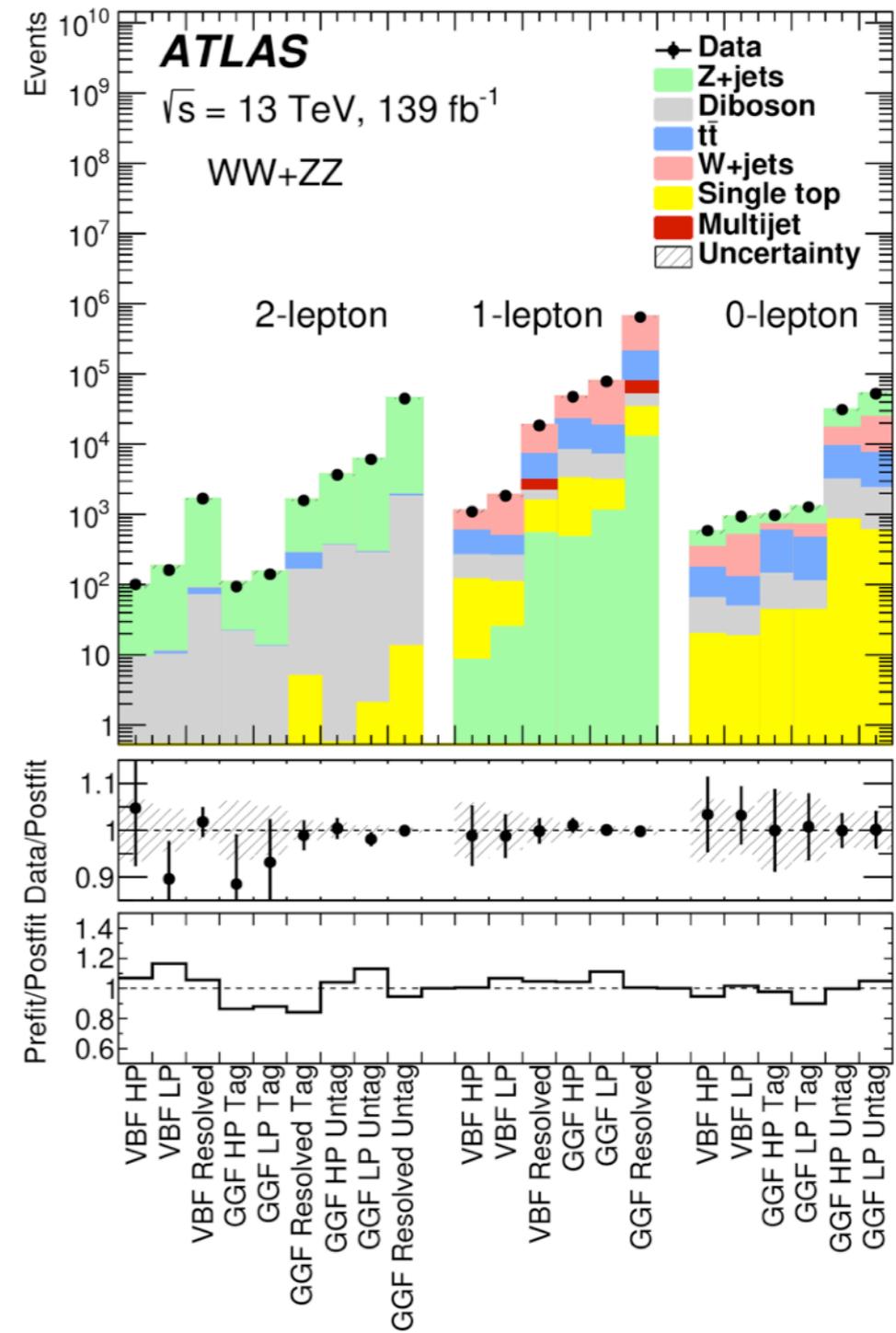
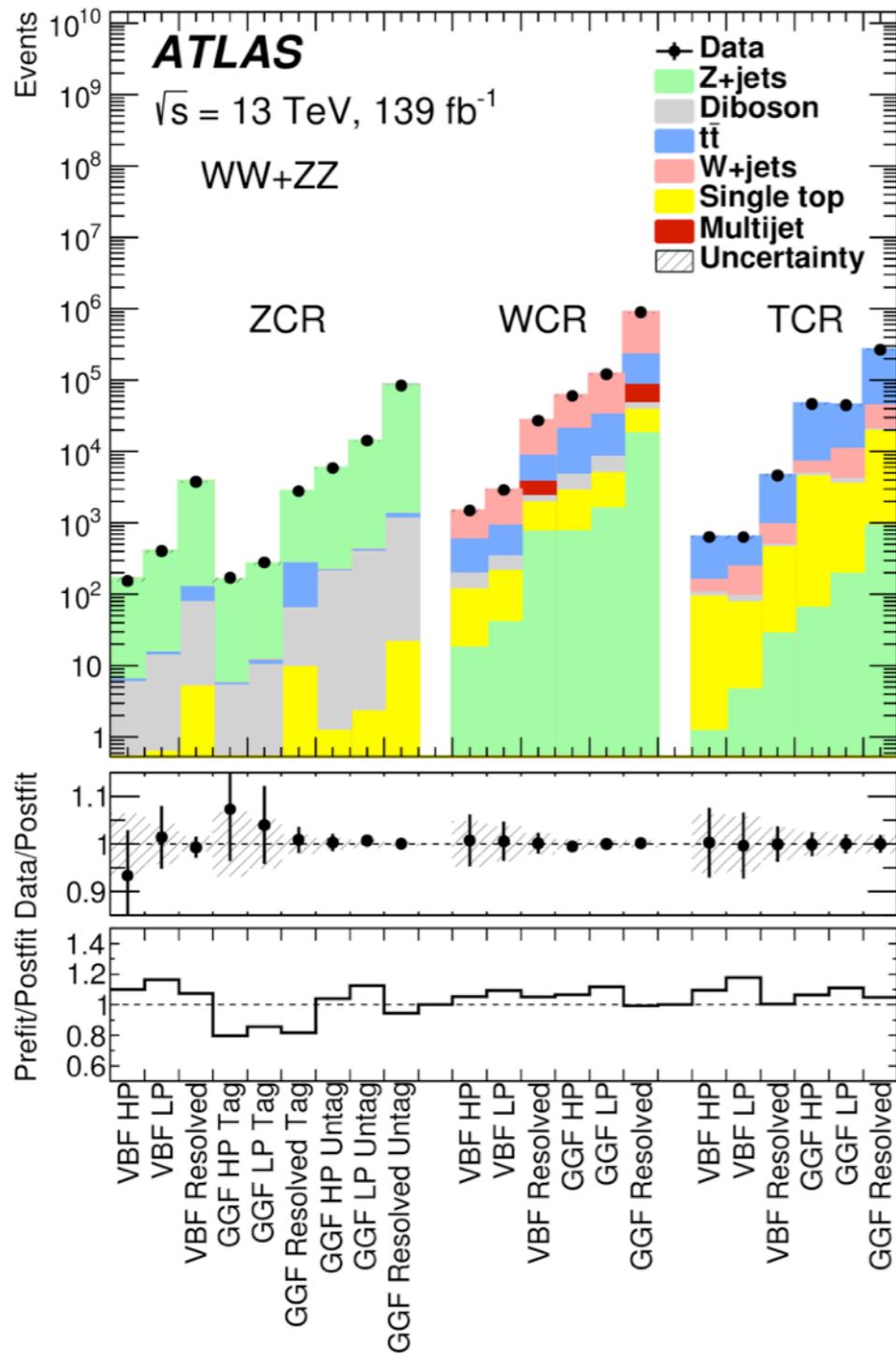
$m(G_{KK}) = 600 \text{ GeV}$		$m(G_{KK}) = 2 \text{ TeV}$	
Uncertainty source	$\Delta\mu/\mu$ [%]	Uncertainty source	$\Delta\mu/\mu$ [%]
Total	50	Total	59
Statistical	29	Statistical	48
Systematic	41	Systematic	34
Large- $R$ jet	18	Large- $R$ jet	24
MC statistics	16	MC statistics	17
Background normalisations	15	$W/Z$ +jets modelling	15
Diboson modelling	12	Flavour tagging	5.5
$W/Z$ +jets modelling	11	$t\bar{t}$ modelling	4.2
Small- $R$ jet	9.7	Diboson modelling	3.9
$t\bar{t}$ modelling	8.1	Single- $t$ modelling	3.3



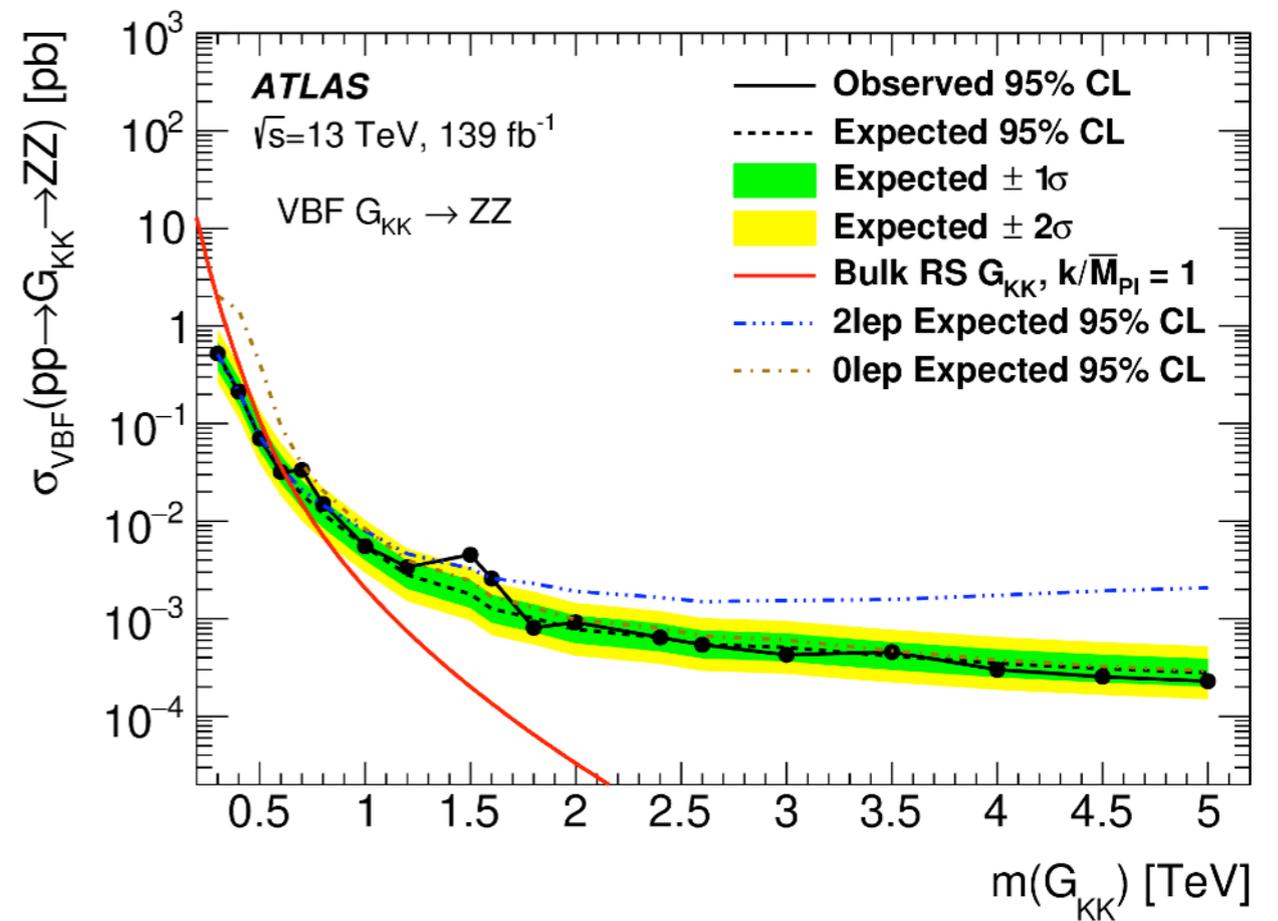
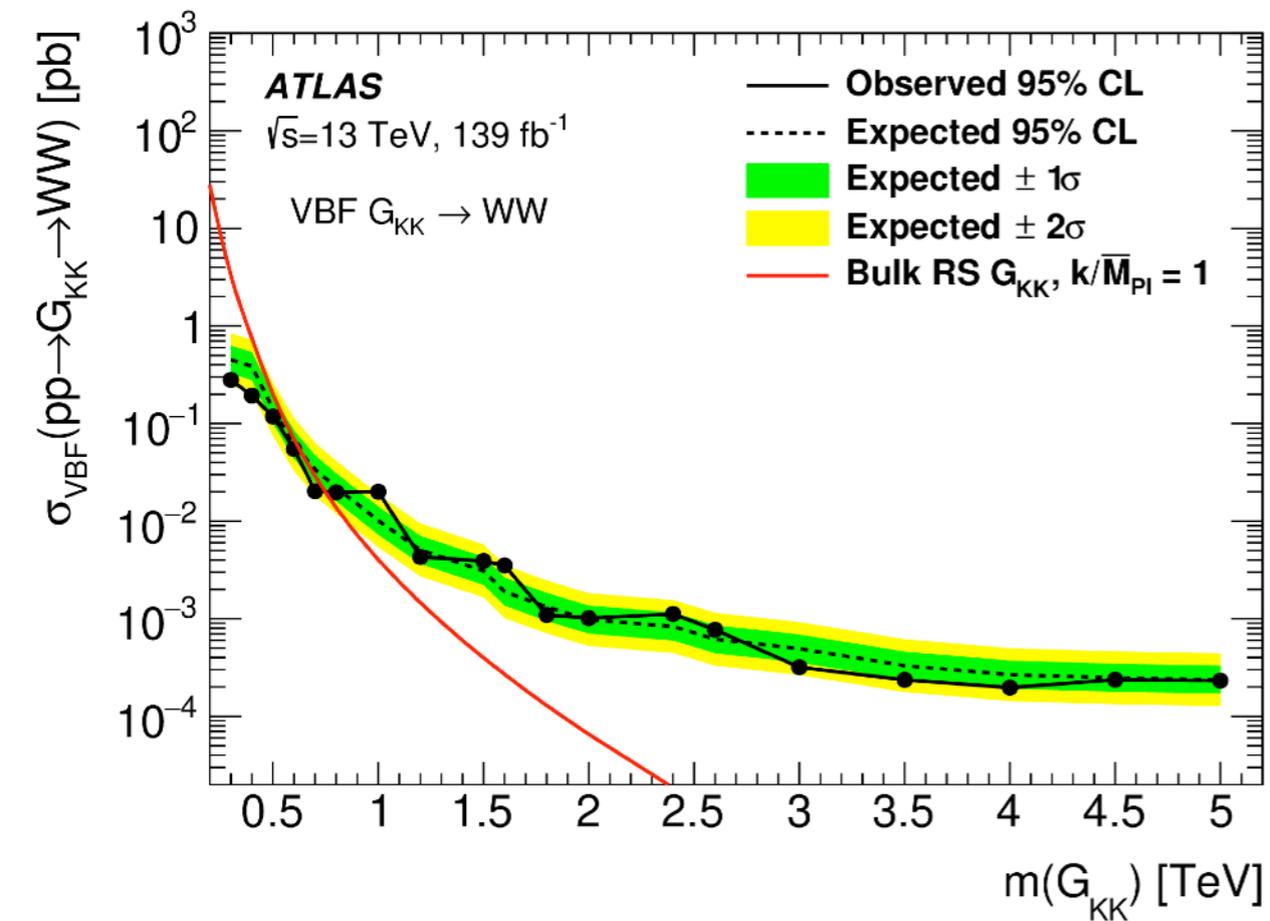
# Some yields...

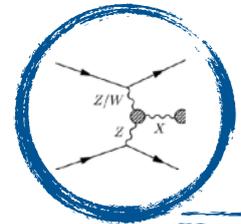
Channel	$V \rightarrow qq$ recon.	Signal regions	Background estimates												
			$W$ +jets		$Z$ +jets		$t\bar{t}$		Diboson		Single- $t$		Multijet	Total	
VBF category															
0-lepton (ZZ)	Merged	HP	169	$\pm 12$	228	$\pm 16$	102	$\pm 10$	51	$\pm 10$	24	$\pm 4$	-	574 $\pm 25$	
		LP	370	$\pm 23$	411	$\pm 20$	75	$\pm 8$	30	$\pm 4$	21	$\pm 4$	-	906 $\pm 33$	
	ggF/DY category														
	Merged	HP	Tag	133	$\pm 14$	270	$\pm 40$	437	$\pm 31$	100	$\pm 10$	45	$\pm 7$	-	982 $\pm 60$
		Untag	7600	$\pm 400$	14 300	$\pm 600$	6030	$\pm 270$	2300	$\pm 180$	840	$\pm 110$	-	31 100 $\pm 800$	
	LP	Tag	259	$\pm 28$	560	$\pm 50$	342	$\pm 24$	67	$\pm 7$	43	$\pm 7$	-	1270 $\pm 70$	
		Untag	16 300	$\pm 900$	28 600	$\pm 1100$	5040	$\pm 220$	1760	$\pm 150$	600	$\pm 80$	-	52 400 $\pm 1500$	
VBF category															
1-lepton (WW)	Merged	HP	530	$\pm 28$	8.3	$\pm 0.5$	321	$\pm 22$	141	$\pm 27$	113	$\pm 21$	-	1110 $\pm 50$	
		LP	1380	$\pm 40$	24.5	$\pm 1.1$	228	$\pm 17$	150	$\pm 33$	83	$\pm 16$	-	1870 $\pm 60$	
	Resolved		11 360	$\pm 190$	530	$\pm 10$	4060	$\pm 130$	590	$\pm 80$	1070	$\pm 210$	960 $\pm 110$	18 570 $\pm 340$	
	ggF/DY category														
	Merged	HP	24 820	$\pm 170$	463	$\pm 5$	13 890	$\pm 220$	4910	$\pm 250$	2800	$\pm 400$	-	46 900 $\pm 500$	
		LP	60 270	$\pm 240$	1095	$\pm 8$	11 050	$\pm 160$	3950	$\pm 210$	1970	$\pm 250$	-	78 300 $\pm 400$	
	Resolved		443 500	$\pm 1800$	12 480	$\pm 40$	126 000	$\pm 1500$	16 800	$\pm 1200$	21 200	$\pm 2800$	27 200 $\pm 1400$	647 000 $\pm 4000$	
VBF category															
2-lepton (ZZ)	Merged	HP	0		87	$\pm 6$	0.081	$\pm 0.009$	9.6	$\pm 1.2$	0		-	97 $\pm 6$	
		LP	0.133	$\pm 0.011$	170	$\pm 8$	0.85	$\pm 0.07$	9.9	$\pm 1.2$	0.43	$\pm 0.07$	-	181 $\pm 8$	
	Resolved		0.272	$\pm 0.012$	1566	$\pm 29$	17.0	$\pm 0.7$	72	$\pm 10$	0.48	$\pm 0.32$	-	1656 $\pm 31$	
	ggF/DY category														
	Merged	HP	Tag	0.0135	$\pm 0.0043$	85	$\pm 6$	0.283	$\pm 0.035$	21.1	$\pm 2.3$	0.34	$\pm 0.05$	-	107 $\pm 7$
		Untag	0.772	$\pm 0.010$	3300	$\pm 40$	4.27	$\pm 0.08$	361	$\pm 32$	0.58	$\pm 0.11$	-	3670 $\pm 50$	
	LP	Tag	0.0135	$\pm 0.0043$	138	$\pm 8$	0.313	$\pm 0.034$	12.8	$\pm 1.4$	0.30	$\pm 0.04$	-	152 $\pm 8$	
		Untag	2.341	$\pm 0.017$	5920	$\pm 50$	10.16	$\pm 0.16$	278	$\pm 26$	2.03	$\pm 0.29$	-	6220 $\pm 60$	
	Resolved	Tag	-		1323	$\pm 26$	110	$\pm 10$	159	$\pm 12$	4.7	$\pm 0.8$	-	1600 $\pm 30$	
		Untag	4.681	$\pm 0.026$	42 750	$\pm 160$	110.6	$\pm 1.5$	1800	$\pm 100$	13.4	$\pm 2.0$	-	44 650 $\pm 190$	

# Spin-0/2 regions



# VBF spin-2



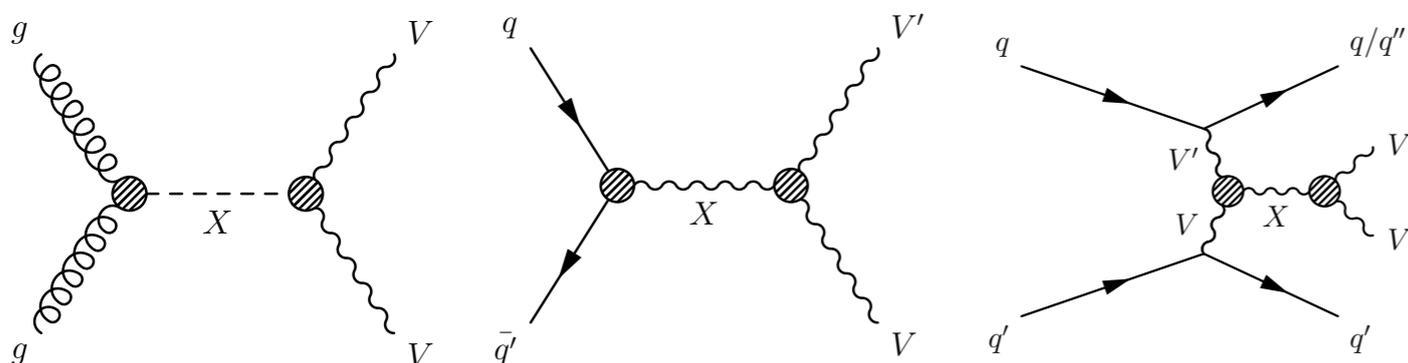
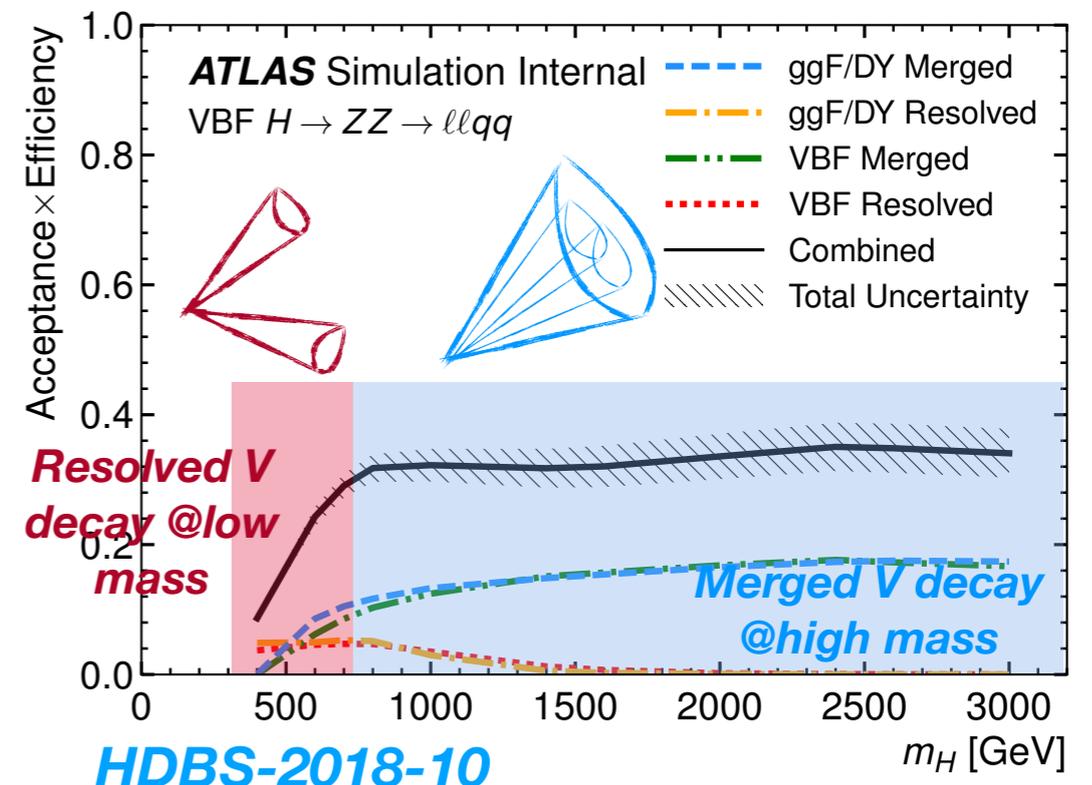
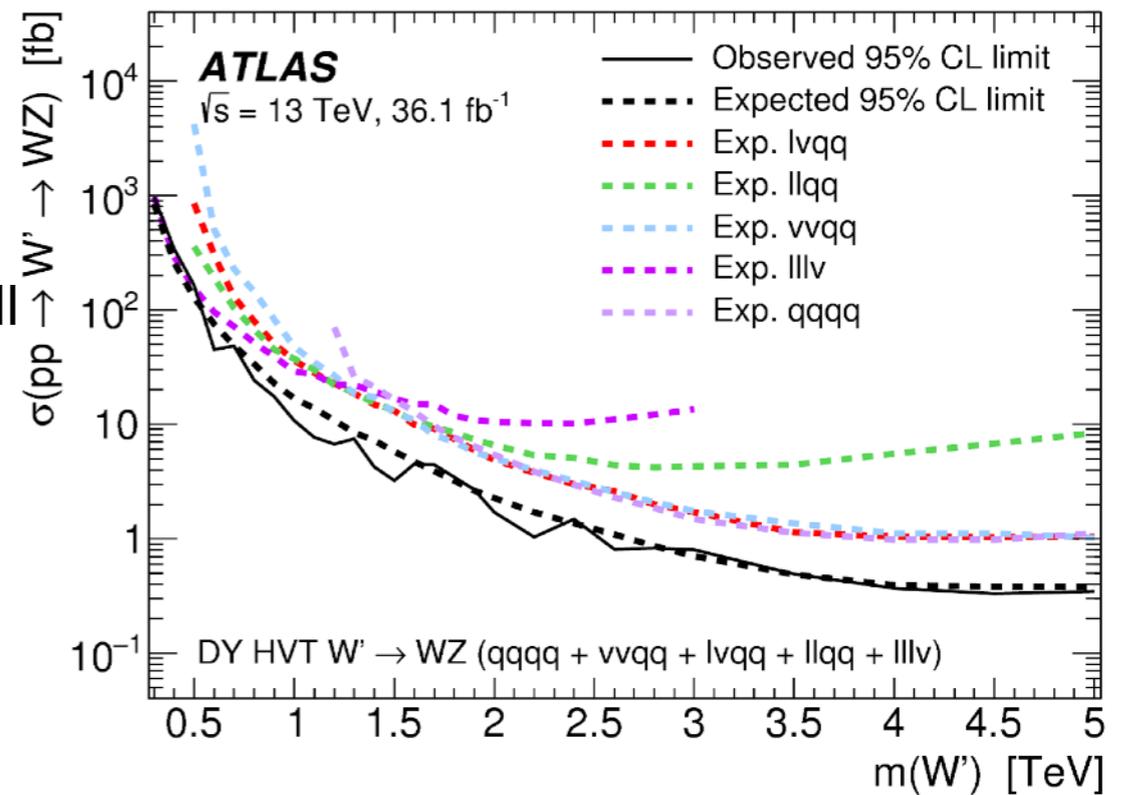


# Resonant $VV$ search: semi-leptonic

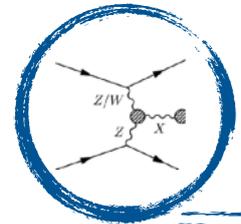
EXOT-2017-31

Search for new physics decaying into diboson in semi-leptonic final states.

- 3 leptons channel going to be combined:
  - ▶  $ZV \rightarrow \nu\nu qq$ ,  $WV \rightarrow l\nu qq$ ,  $ZV \rightarrow ll qq$
  - ▶ good compromise between the low BR of the full leptonic and the more background of the full hadronic channels.
- 2 categories based on the production mechanism are studied:
  - ▶ VBF vs ggF/DY
- 2 different techniques to reconstruct the  $V \rightarrow qq$  decay dedicated to lower (**resolved**) and higher (**merged**) mass regions.
- Interpretations
  - ▶ Spin-0: Randall Sundrum (RS) Radions
  - ▶ Spin-1: Heavy Vector Triplet,  $W'$ ,  $Z'$
  - ▶ Spin-2: Randall Sundrum (RS) Gravitons

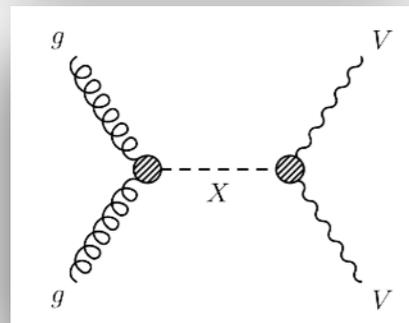
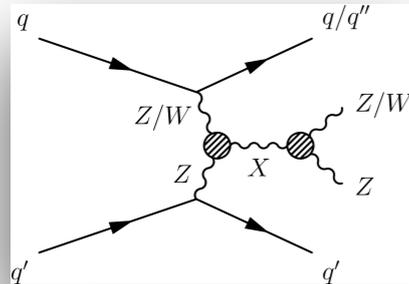


HDBS-2018-10



# Resonant $V$ analysis in a nutshell

Machine Learning approach here



$Z \rightarrow \nu\nu$   
 $W \rightarrow l\nu$   
 $Z \rightarrow ll$

Leptonic  $V$  selection

Binary classification problem performed with cut based approach in previous paper, R&D to development of new techniques

- [June 2019, HDBS & Exotics Workshop](#)
- [November 2019, 4th ATLAS ML Workshop](#)
- [CDS. 2743418 thesis](#)

VBF/ggF classification

Merged Selection

Resolved Selection

Control Regions

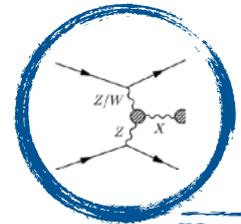
Merged Selection

Resolved Selection

Control Regions

Main analyser in this analysis ([HDBS-2018-10](#)) during my PhD:

- trigger studies ([TRIG-2018-05](#))
- analysis optimisation
- MC modelling
- ML approaches

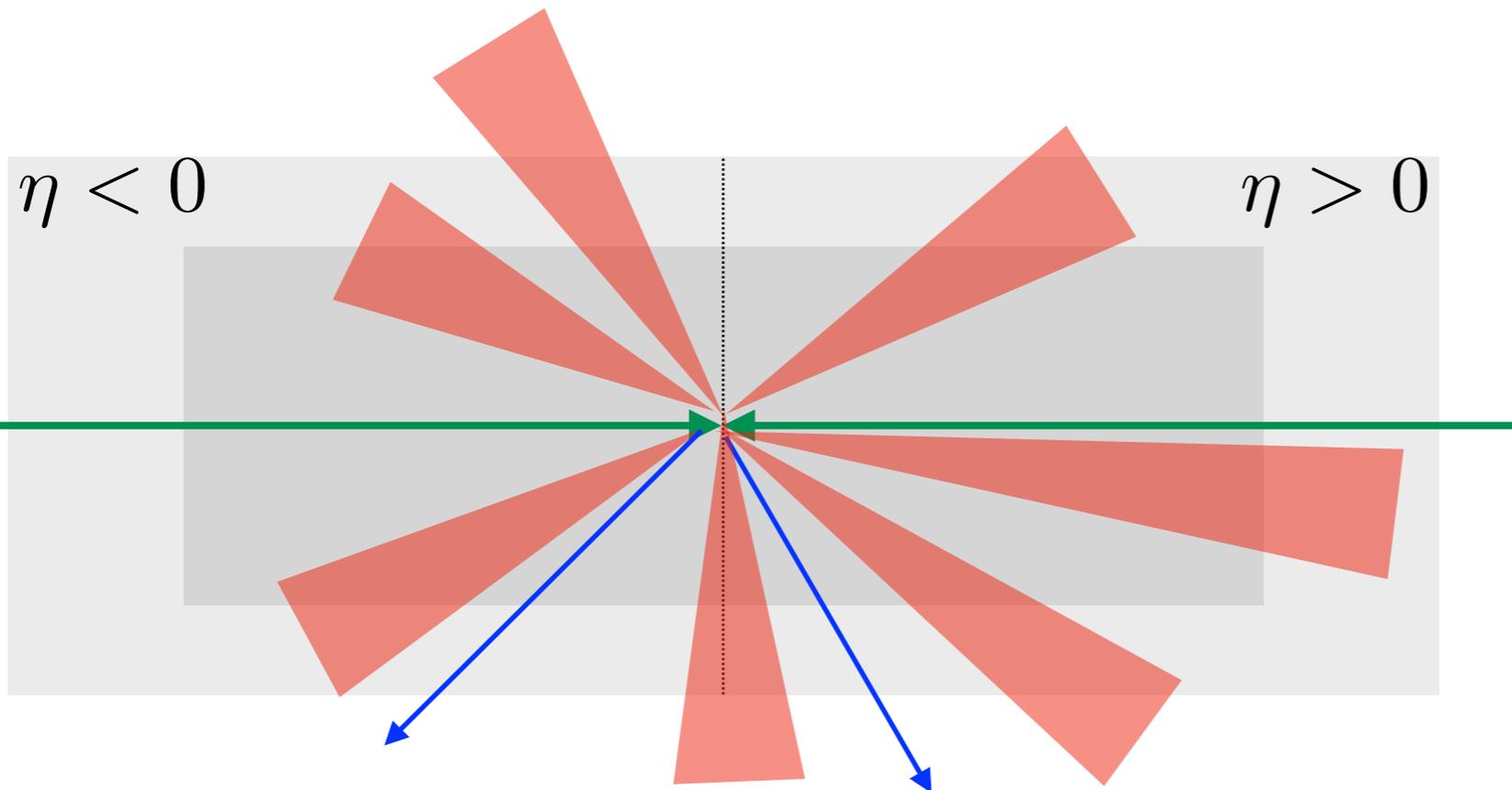
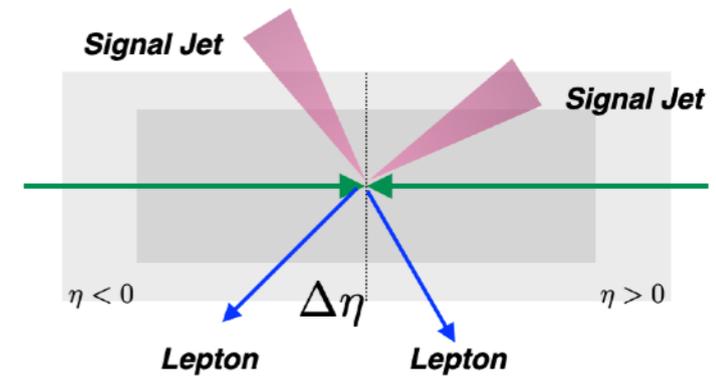
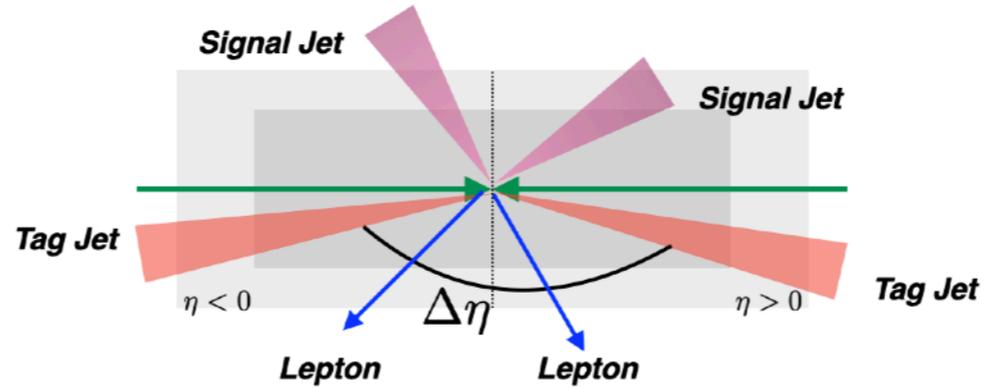


# VBF vs ggF topologies

How does the detector see these events?

Feynman LO diagrams

- + >LO corrections,
- + PileUp interactions,
- + underlying interactions



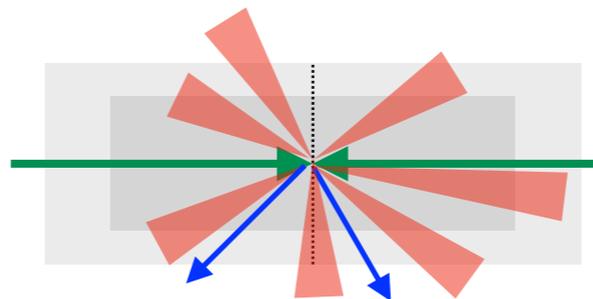
VBF or ggF?



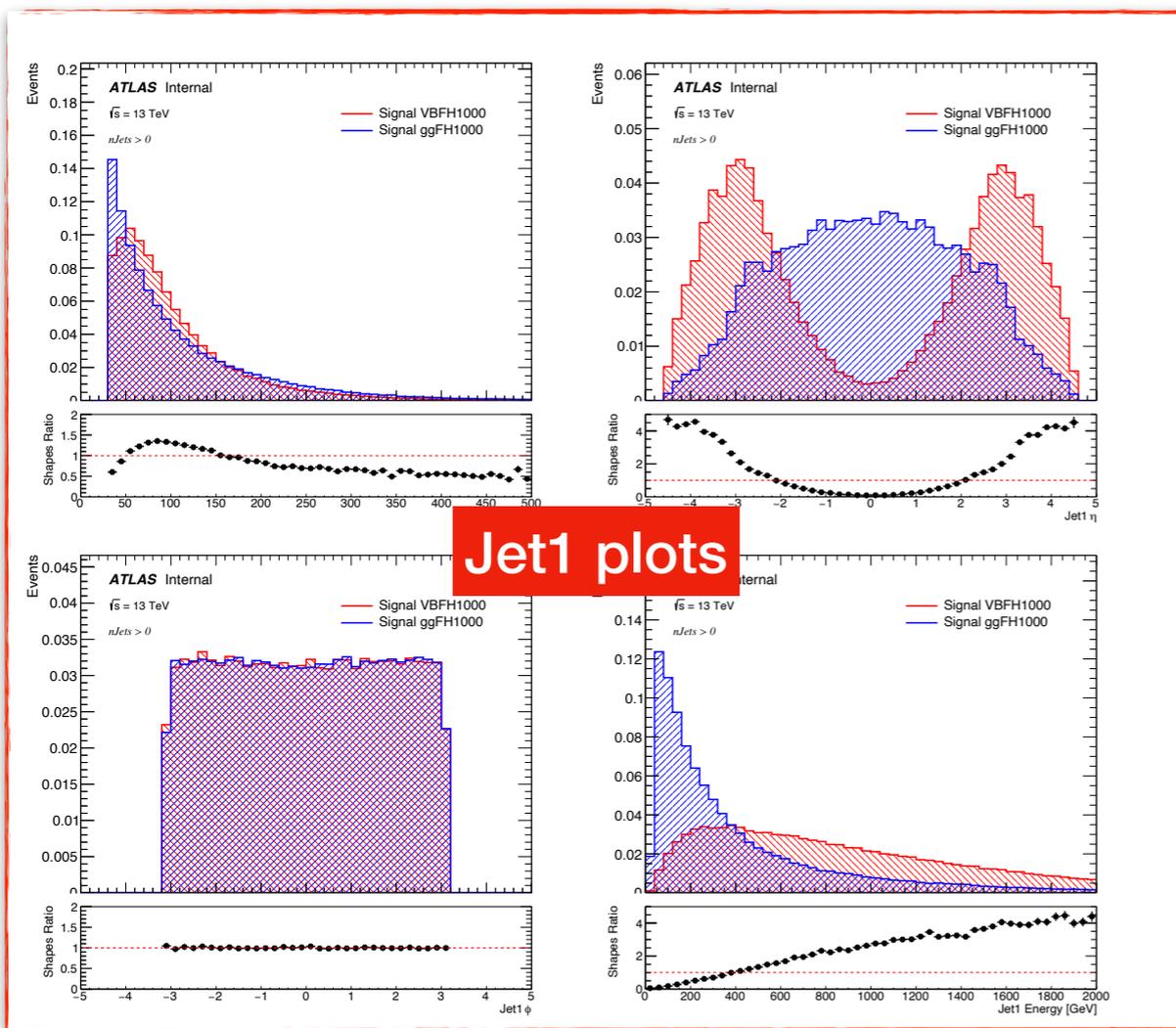
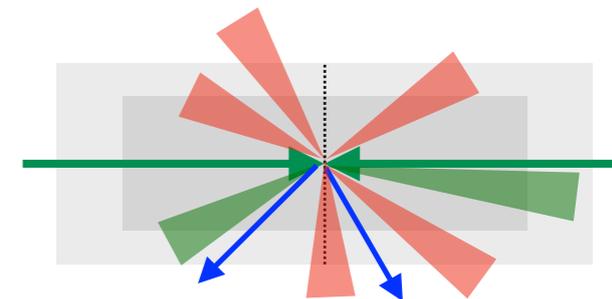
# NN approach: DL & input variables

- **High-level approach:**
  - build high-level variables starting from the two tag jets
- **Low-level approach:**
  - use all the jets and the 4-momentum components

All jets used for low-level approach

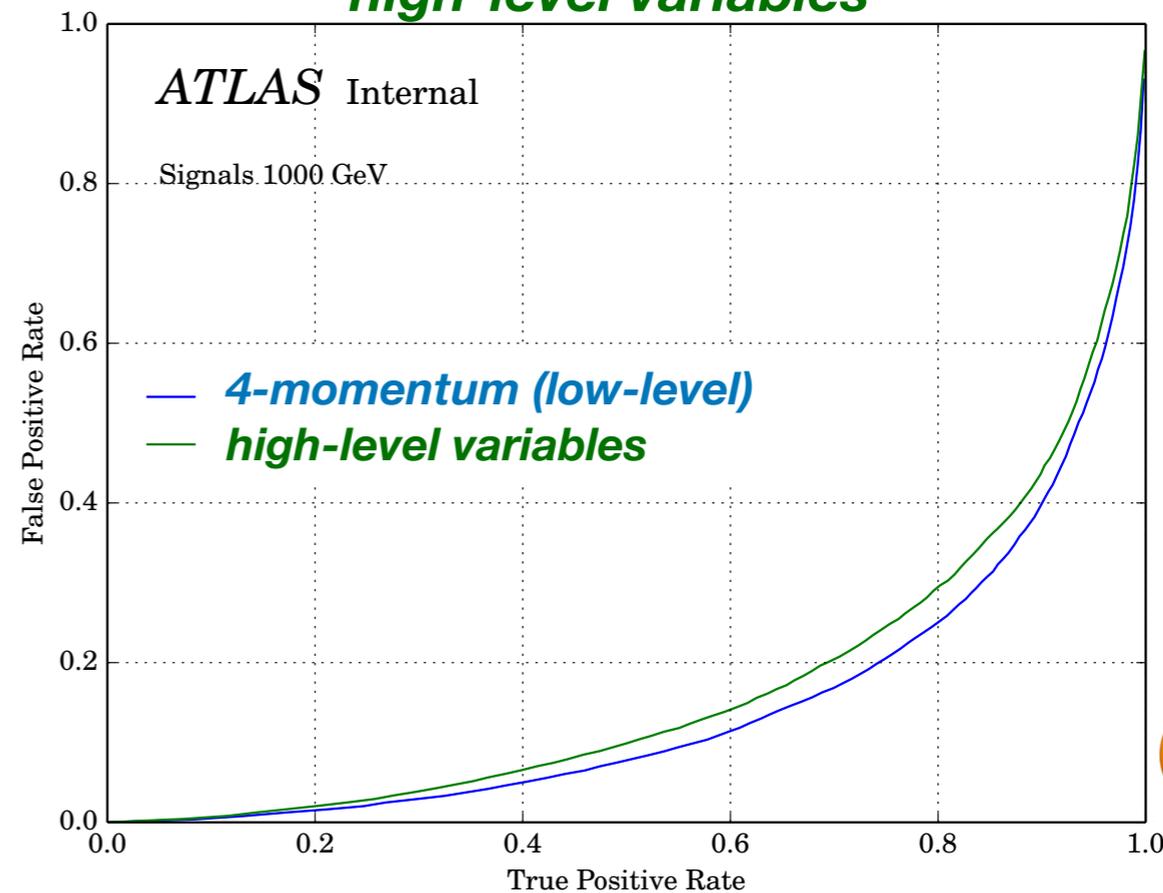


2 jets tagged for the high-level approach



**xN jets**

**4-momentum (low-level) better than high-level variables**



General deep learning result, [arXiv:1402.4735](https://arxiv.org/abs/1402.4735)

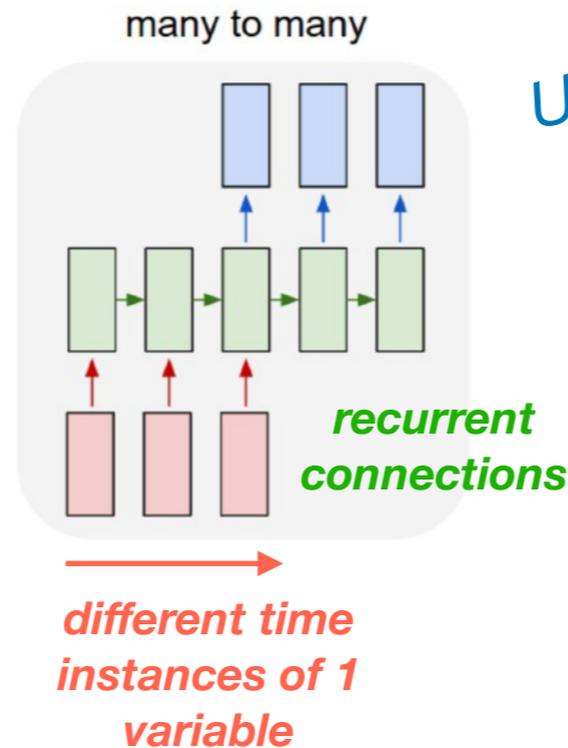


# The VBF-RNN architecture

Look at more info:

- [RNN Lecture](#)
- [RNN paper](#)
- [RNN Tutorial](#)

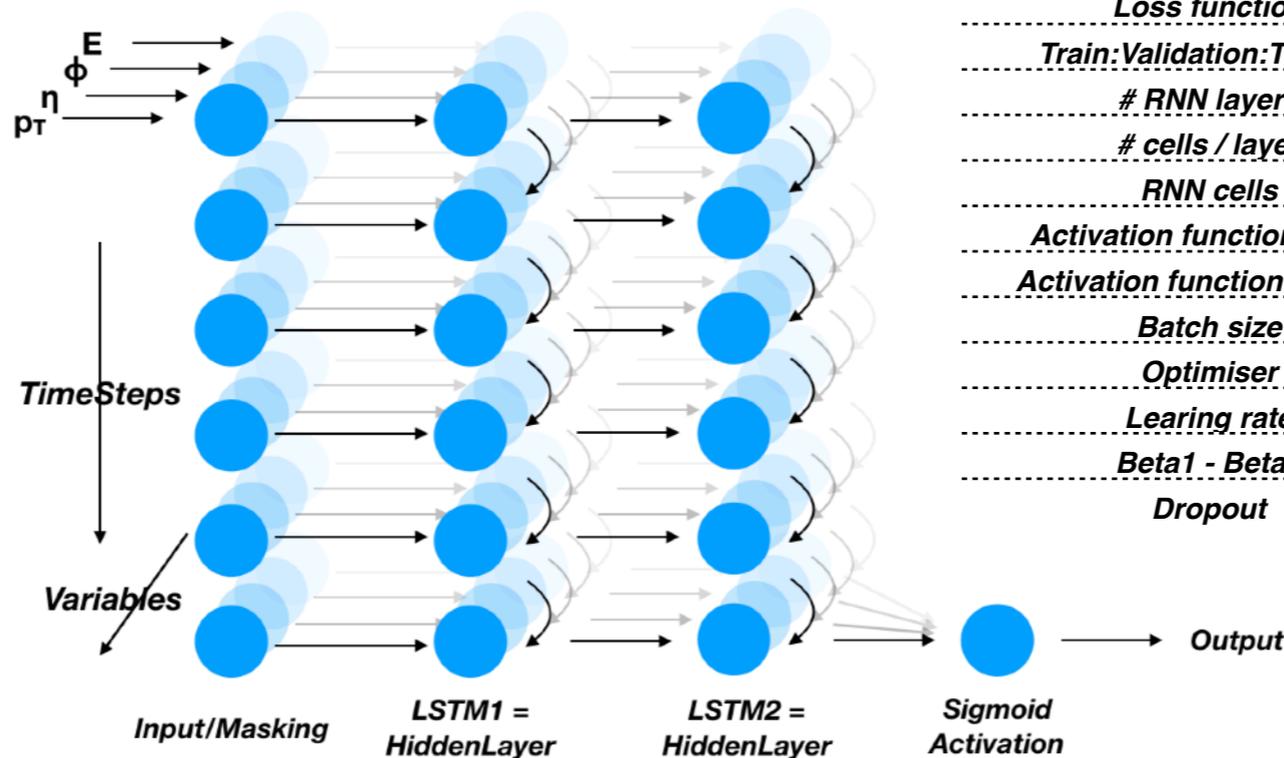
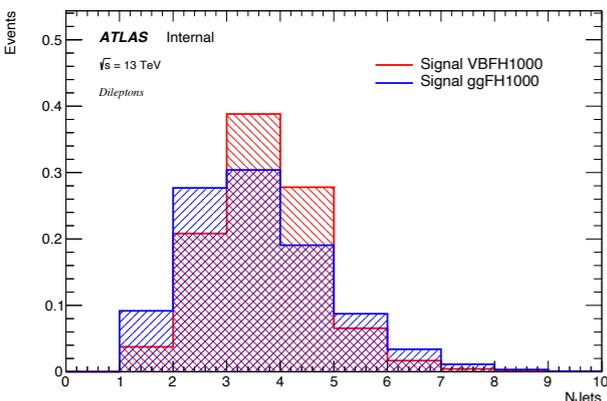
- Main idea: deal with **variable-length input set** (1, 2, 3... N jets).
- Which is the best NN architecture?
  - **RNN seem to fit for our problem!**
- An input set (the 4 variables of the 4-momentum) is repeated at different "Time-steps" that could be variables (our number of jets).
- 4 variables used ( $p_T$ ,  $\eta$ ,  $\phi$ ,  $E$ ).



Usual applications of RNN

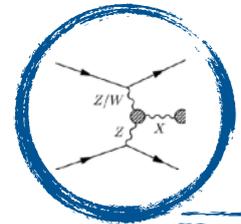
Applications of Recurrent Neural Networks include:

- Machine Translation.
- Robot control.
- Time series prediction.
- Speech recognition.
- Speech synthesis.
- Time series anomaly detection.
- Rhythm learning.
- Music composition.

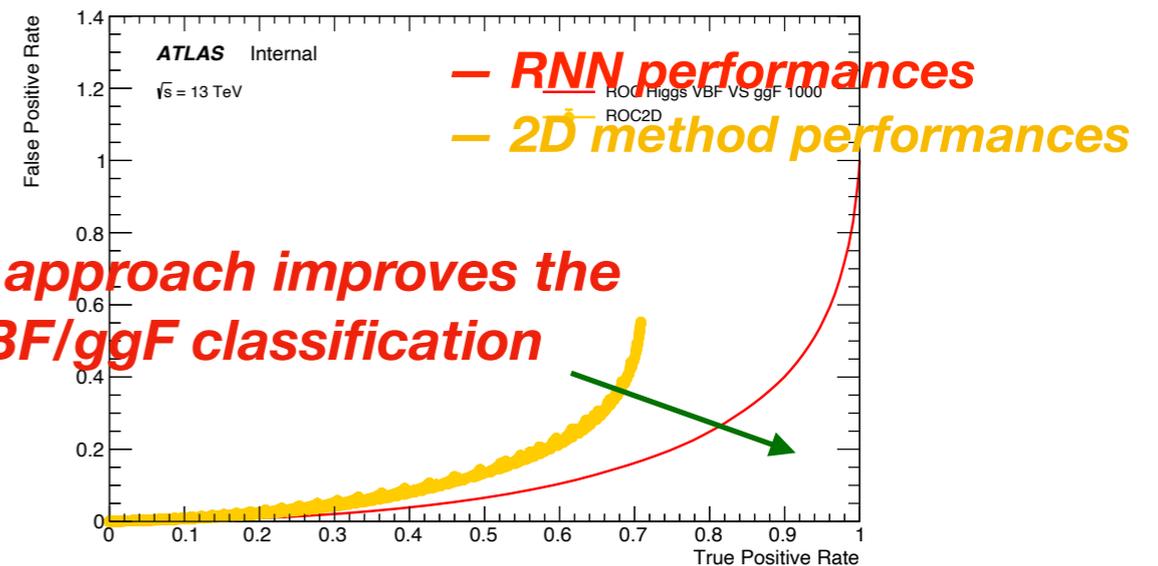
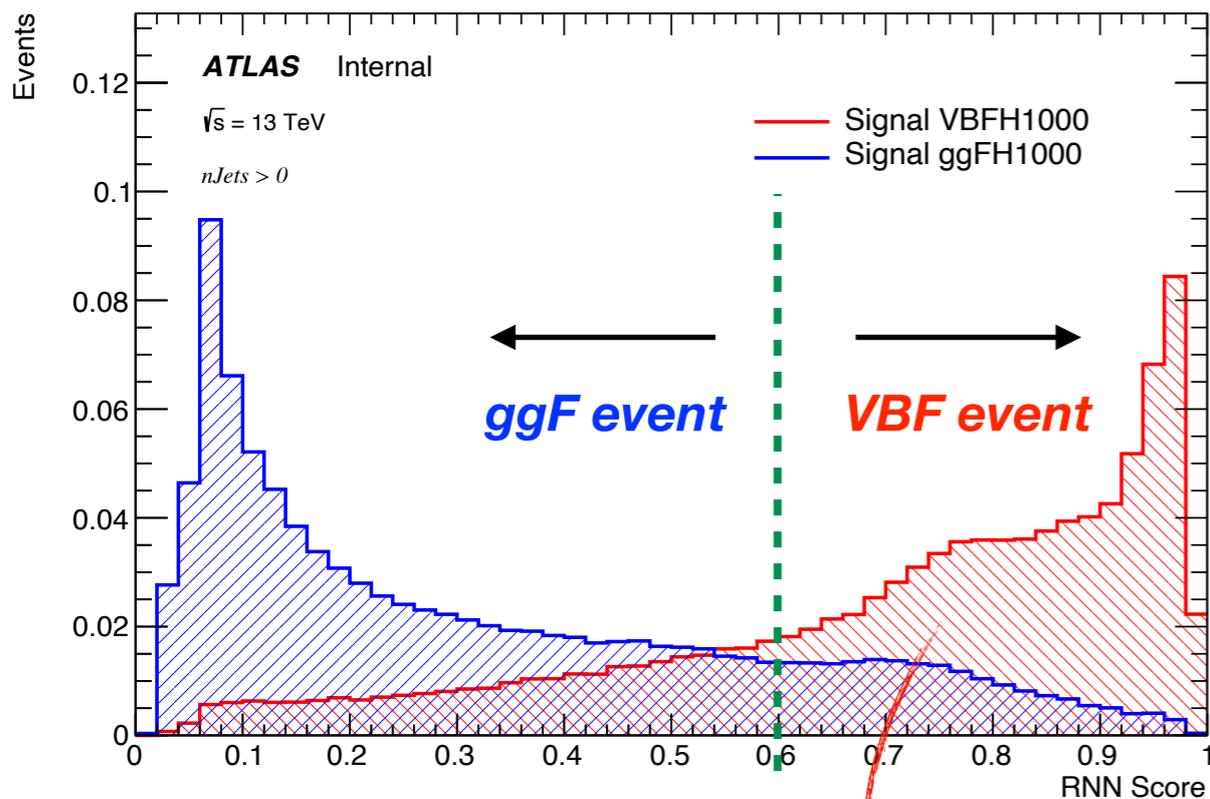


<b>Loss function</b>	binary cross entropy
<b>Train:Validation:Test (%)</b>	56:14:30
<b># RNN layers</b>	2
<b># cells / layer</b>	25
<b>RNN cells</b>	LSTM
<b>Activation function (RNN)</b>	tanh
<b>Activation function (output)</b>	sigmoid
<b>Batch size</b>	512
<b>Optimiser</b>	Adam
<b>Learning rate</b>	0,001
<b>Beta1 - Beta2</b>	0,9 - 0,999
<b>Dropout</b>	0,3



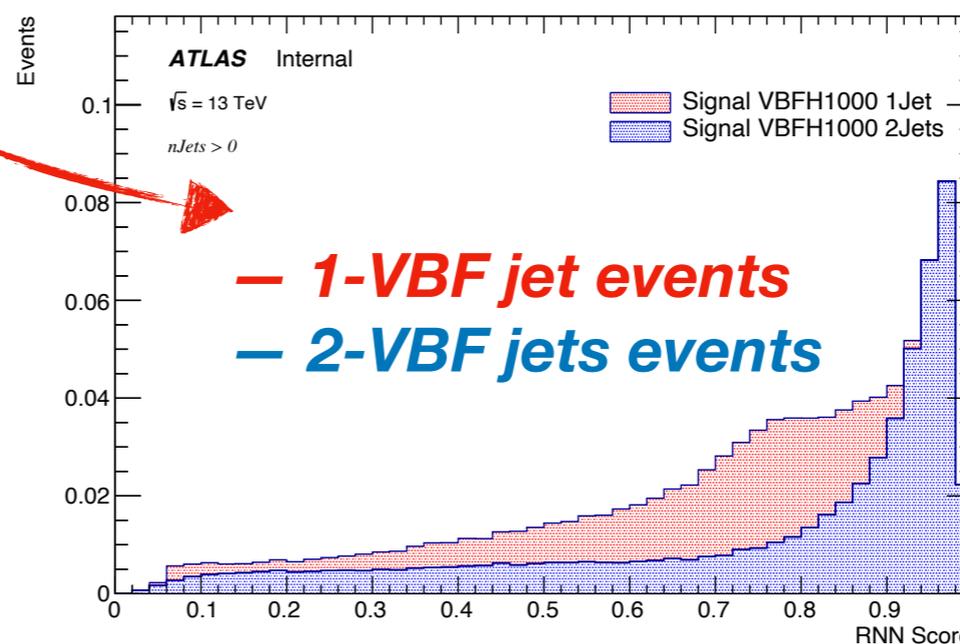
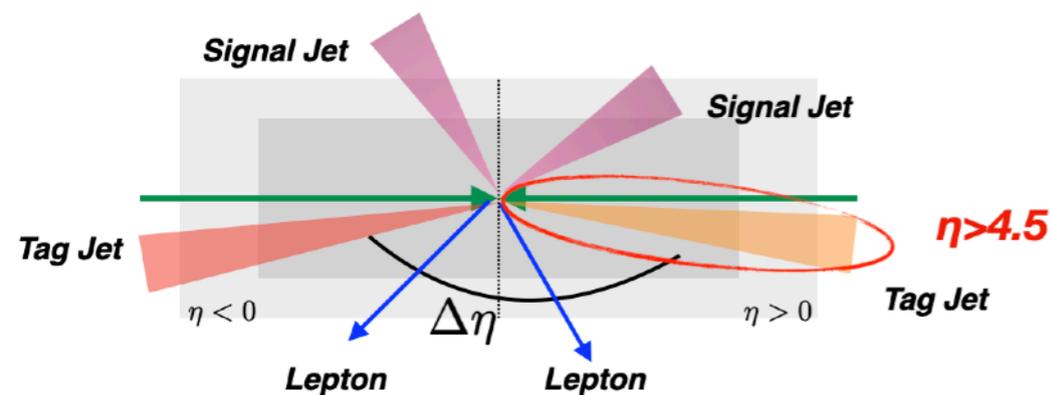


# RNN approach: performances



	Std Categ	NNScore > 0.6	NNScore > 0.7	NNScore > 0.8
VBF H 1000	37,8%	67,2%	57,6%	42,7%
ggF H 1000	6,1%	14,8%	9,6%	4,6%

What happens if 1 VBF jet is outside  $\eta$ -acceptance?



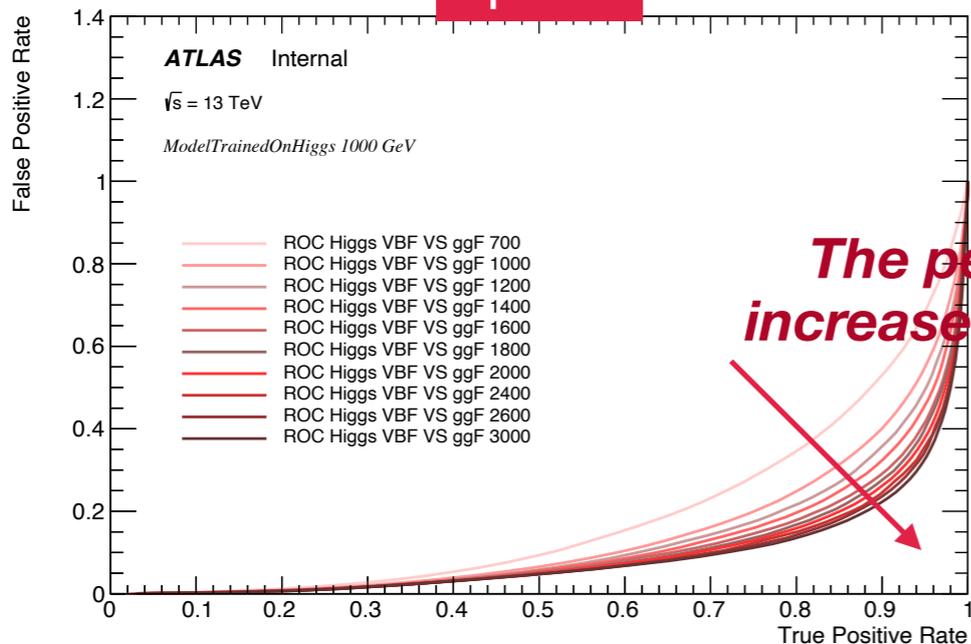
- 1-VBF jet events
- 2-VBF jets events

The RNN is able to classify also events with 1 VBF jet that have never used with cut-based approach

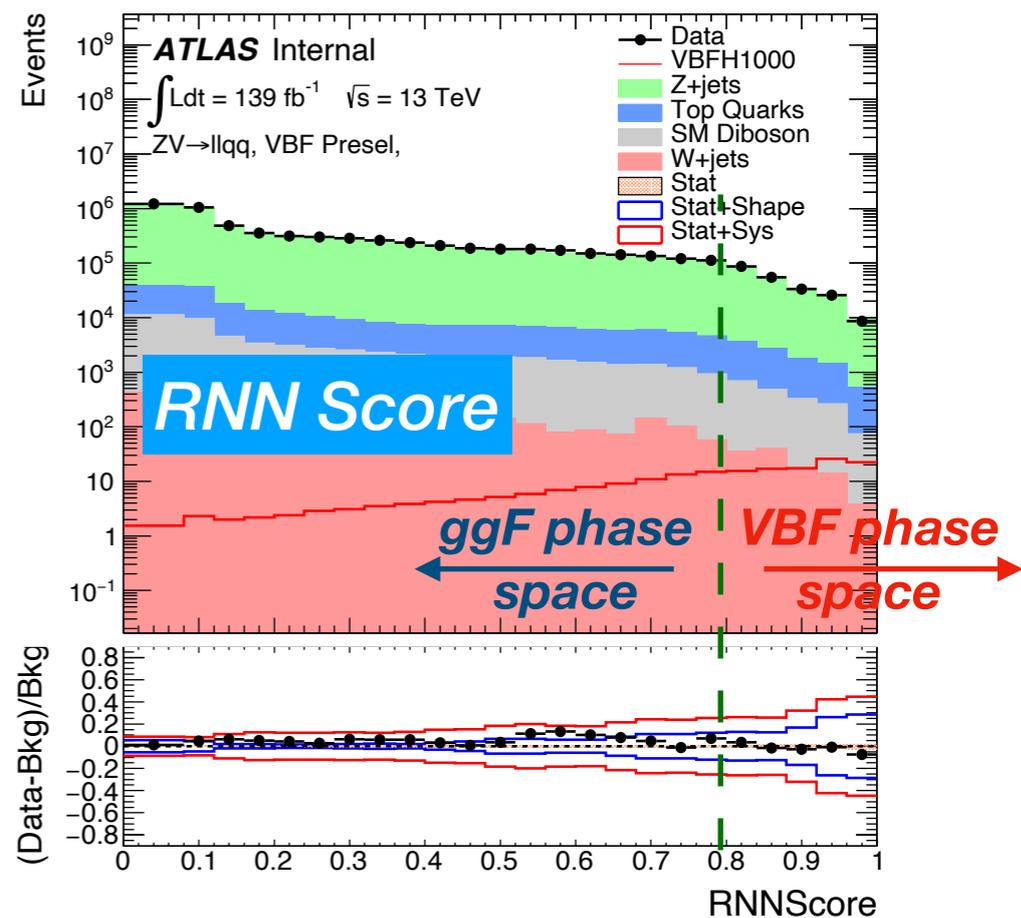


# RNN: masses, spins, leptons channel, data...

**Spin-0**



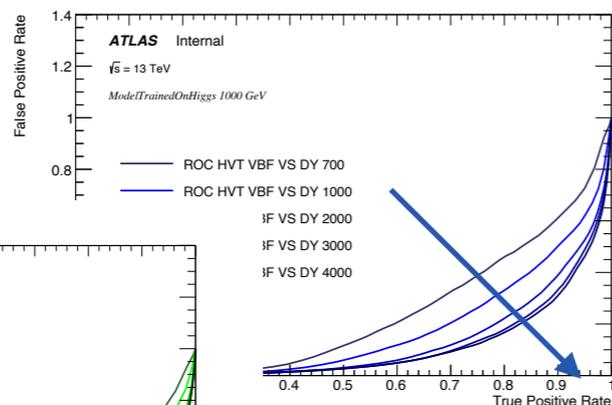
*The performances increase with the mass*



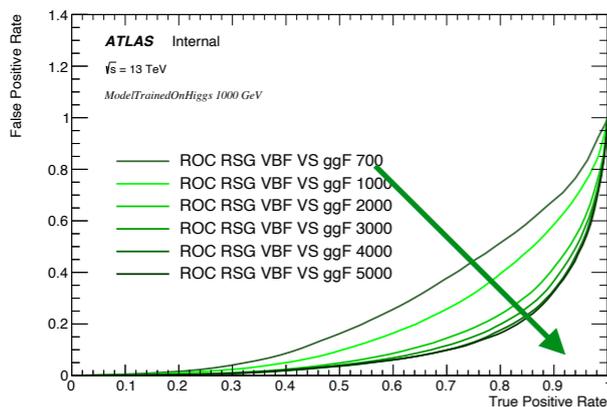
*Stable performances for different leptons channels*

**0/1/2 leptons**

**Spin-1**



**Spin-2**



*Different spin models shows consistent behaviour with respect to the spin-0 RNN model*

