# **Boosted Multi-bosons**

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23rd Mini-workshop on the frontier of LHC



### **Direct and Indirect searches**



field

tensor

field-strength

### aGCs vs VV searches



### Citius, Altius, Fortius

#### CMS Integrated Luminosity Delivered, pp



# **Pileup Mitigation**

PUPPI (PileUp Per Particle Id): based on PF paradigma general framework that determines, per particle, weight for how likely a particle is from PU



# **Boosted Technique: grooming**



### Boosted Technique: softdrop

 $\begin{array}{l} - \text{ Undo last stage of C/A clustering, label subjets j1,j2} \\ - \text{ If :} \\ \frac{min(p_{T1},p_{T2})}{p_{T1}+p_{T2}} > z_{cut} \left(\frac{\Delta R_{12}}{R_0}\right)^{\beta} \end{array}$ 

then j is soft dropped else redefine j to be the harder, and iterate

- Recovers (modified) mass drop BDRS tagger for beta=0
  - This case always removes soft radiation entirely (hence the name)



#### CMS PAS-JME-14-002

### **Boosted Technique: tagging**





N-subjettiness: How likely is a Jet to have "N" subjets

$$\tau_N = \frac{1}{d_0} \sum_k p_{T,k} \min \left\{ \Delta R_{1,k}, \Delta R_{2,k}, \cdots, \Delta R_{N,k} \right\}_{s}$$

### **Boosted Technique: mass decorrelation**

### - Explore $\tau_2/\tau_1$ kinematic dependence

- Use QCD scaling variable  $\rho^{DDT} = \log(m_{SD}^2/pT/\mu)$  to get rid of kinematic correlation:



Designing De-correlated Taggers (DDT)

### **Boosted Technique:** Calibration

### Extract scale factor, mass scale, and resolution from fit in TTbar Control Region Fit distributions (Puppi 0.35)



### **Boosted Technique: Validation**

### jet substructure observables in tt events







groomed momentum fraction PTj2/PTj0

# Background Estimations: alpha and 2/3D



- Each event contributing to a 1D/2D gaussian kernel defined by detector scale and res.

### Forward folding kernel approach to ensure smooth QCD templates

- 3D templates derived from MC
- Particle-level evts smeared using detector resolution
- same procedure for resonant bkg. (W/Z)

 $P(m_{jj}, m_{jet1}, m_{jet2}) = P_{VV}(m_{jj}) \times P_{cond,1}(m_{jet1}|m_{jj}) \times P_{cond,2}(m_{jet2}|m_{jj})$ 

# WV@13TeV: aTGC

Hadronic W/Z candidate: leading AK8 jet with p T > 200 GeV Invariant mass of the diboson system (M WZ ) > 900 GeV Puppi Softdrop mass: 65-105 GeV and N-subjettiness < 0.6

WW sensitive region:[65,85]GeVWZ sensitive region:[85,105]GeVSideband: $[40, 65] \cup [105, 150]GeV$ 





# WV@13TeV: aTGC



Post-fit mWV (upper) and PUPPI SD (lower) mass distributions.

The lower sideband, signal, and upper sideband regions are shown on the left, middle, and right.

## WV@13TeV: <u>aTGC</u>

The signal modelling function consists of terms corresp	onding to different contributions:
$F_{WV} = N_{SM}(e^{a_0 x} + e^{a_{corr} x})$	SM contribution
$+\sum_{i} (N_{c_{i},1}.c_{i}^{2}.e^{a_{i,1}x}.\frac{1+Erf((x-a_{0,i})/a_{w,i})}{2})$	pure aTGC term
$+ N_{c_i,2}.c_i.e^{a_{i,2}x})$	SM-aTGC interference
$+\sum_{i\neq j}^{i< j} (N_{c_i,c_j}.c_i.c_j.e^{a_{ij}x})$	aTGC-aTGC interference

### W+jets normalization floating freely in the fit. Dominant unc from V-tagging, PDF/Scales

	Electron channel			Muon channel			
	Pre-fit	Post-fit	Scale factor	Pre-fit	Post-fit	Scale-factor	
W+jets	2421	$3036 \pm 123$	$1.25 \pm 0.05$	4319	$4667 \pm 182$	$1.08\pm0.04$	
tī	$1491 \pm 324$	$1127 \pm 119$	$0.76 \pm 0.08$	$2632 \pm 570$	$1978\pm202$	$0.75\pm0.08$	
Single top quark	$271\pm39$	$242 \pm 26$	$0.89\pm0.10$	$509 \pm 69$	$449\pm43$	$0.88\pm0.08$	
Diboson	$314\pm314$	$267\pm102$	$0.85\pm0.32$	$\frac{552 \pm 552}{2}$	$465\pm162$	$0.84 \pm 0.29$	
Total expected	4497	$\frac{4672\pm201}{}$	$1.04\pm0.04$	8012	$7559 \pm 319$	$0.94\pm0.04$	
Data		4691			7568		

### WV@13TeV: aTGC

Parametrization	arametrization aTGC		<b>Observed</b> limit	Run I limit	
	$c_{\rm WWW}/\Lambda^2 ({\rm TeV}^{-2})$	[-1.44, 1.47]	[-1.58, 1.59]	[-2.7, 2.7]	
EFT	$c_{\rm W}/\Lambda^2 ({\rm TeV}^{-2})$	[-2.45, 2.08]	[-2.00, 2.65]	[-2.0, 5.7]	
	$c_{\rm B}/\Lambda^2~({\rm TeV}^{-2})$	[-8.38, 8.06]	[-8.78, 8.54]	[-14, 17]	
	$\lambda_{\rm Z}$	[-0.0060, 0.0061]	[-0.0065, 0.0066]	[-0.011, 0.011]	
LEP	$\Delta g_1^Z$	[-0.0070, 0.0061]	[-0.0061, 0.0074]	[-0.009, 0.024]	
	$\Delta \kappa_Z$	[-0.0074, 0.0078]	[-0.0079 <i>,</i> 0.0082]	[-0.018, 0.013]	





# VBS WV@13TeV: aQGC

Puppi AK8 Jet

tau21<0.55, PT>200 GeV

- WV with  $W \rightarrow \ell \nu$  and  $V \rightarrow J$
- ${\boldsymbol{\mathsf{ZV}}}$  with  ${\boldsymbol{\mathsf{Z}}}{\rightarrow}\ell\ell$  and  ${\boldsymbol{\mathsf{V}}}{\rightarrow}{\boldsymbol{\mathsf{J}}}$
- boosted V reconstruction
- tight VBS selections:
  - $m_{jj} > 800 \text{ GeV}, \Delta \eta_{jj} > 4.0$
  - · centrality requirements
- very large **QCD bkg** ( $\mathcal{O}(\alpha^4 \alpha_{s}^2)$  and  $\mathcal{O}(\alpha^2 \alpha_{s}^4)$ )
  - global fit of m<sub>VV</sub> distribution
  - reducible bkg measured in  $m_V$  sidebands







## VBS WV@13TeV: aQGC



### **Sideband Region**

40GeV<mv<65GeV 105GeV<mv<150GeV

### **Signal Region**

Final state	WV	ZV		
Data	347	47		
V+jets	$187\pm21$	$41.2 \pm 6.1$		
top	$120 \pm 18$	$0.16\pm0.04$		
SM QCD VV	$28 \pm 10$	$6.4 \pm 2.2$		
SM EW VV	$17\pm2$	$2.4 \pm 0.4$		
Total bkg.	$352\pm21$	$50.1 \pm 5.9$		
$f_{T2}/\Lambda^4 = -0.5, -2.5 \text{ TeV}^{-4}$	$22\pm1$	$7.6\pm0.6$		
$m_{H_5} = 500 \text{ GeV}, s_H = 0.5$	$40\pm1$	$4.3\pm0.1$		

## VBS WV@13TeV: aQGC

March 2019	ATLAS		Channel	Limits		∫ Ldt	Vs
f 1A4		-	WVY	[-1.3e+02, 1.3e+02]	-	20.2 fb1	8 TeV
M,0 //1			WVY	[-7.7e+01, 8.1e+01]		19.3 fb <sup>-1</sup>	8 TeV
			Zy	[-7.1e+01, 7.5e+01]		19.7 fb <sup>-1</sup>	8 TeV
	F		Zy	[-7.6e+01, 6.9e+01]		20.2 fb <sup>-1</sup>	8 TeV
			Wy	[-7.7e+01, 7.4e+01]		19.7 fb <sup>-1</sup>	8 TeV
	Н		ss WW	[-6.0e+00, 5.9e+00]		35.9 fb <sup>-1</sup>	13 TeV
	H		WZ	[-8.8e+00, 8.6e+00]		35.9 fb <sup>-1</sup>	13 TeV
			γγ→WW	[-2.8e+01, 2.8e+01]		20.2 fb <sup>-1</sup>	8 TeV
	H		γγ→WW	[-4.2e+00, 4.2e+00]		24.7 fb <sup>-1</sup>	7,8 TeV
	1		WV ZV	[-6.6e-01, 6.6e-01]		35.9 fb <sup>-1</sup>	13 TeV
f /A4			WVY	[-2.1e+02, 2.1e+02]		20.2 fb <sup>-1</sup>	8 TeV
'M,1 // K		- Contract (1997)	WVY	[-1.3e+02, 1.2e+02]		19.3 fb <sup>-1</sup>	8 TeV
			ZY	[-1.9e+02, 1.8e+02]		19.7 fb <sup>-1</sup>	8 TeV
			Zγ	[-1.5e+02, 1.5e+02]		20.2 fb <sup>-1</sup>	8 TeV
	-	-	Wy	[-1.2e+02, 1.3e+02]		19.7 fb <sup>-1</sup>	8 TeV
	H		ss WW	[-8.7e+00, 9.1e+00]		35.9 fb <sup>-1</sup>	13 TeV
	H		WZ	[-8.2e+00, 8.9e+00]		35.9 fb <sup>-1</sup>	13 TeV
	H		γγ→WW	[-1.1e+02, 1.0e+02]		20.2 fb <sup>-1</sup>	8 TeV
			γγ→WW	[-1.6e+01, 1.6e+01]		24.7 fb <sup>-1</sup>	7,8 TeV
			WV ZV	[-1.9e+00, 2.0e+00]		35.9 fb <sup>-1</sup>	13 TeV
f 144			WVY	[-5.7e+01, 5.7e+01]		20.2 fb <sup>-1</sup>	8 TeV
M,2 //1			Zγ	[-3.2e+01, 3.1e+01]		19.7 fb <sup>-1</sup>	8 TeV
			ZY	[-2.7e+01, 2.7e+01]		20.2 fb <sup>-1</sup>	8 TeV
			WY	[-2.6e+01, 2.6e+01]		19.7 fb <sup>-1</sup>	8 TeV
6 / 1 4			WVY	[-9.5e+01, 9.8e+01]		20.2 fb <sup>-1</sup>	8 TeV
M,3 //	F		Zy	[-5.8e+01, 5.9e+01]		19.7 fb <sup>-1</sup>	8 TeV
			Zγ	[-5.2e+01, 5.2e+01]		20.2 fb <sup>-1</sup>	8 TeV
			Wy	[-4.3e+01, 4.4e+01]		19.7 fb <sup>-1</sup>	8 TeV
f /A4		-	WVy	[-1.3e+02, 1.3e+02]		20.2 fb <sup>-1</sup>	8 TeV
M.4 77			Wγ	[-4.0e+01, 4.0e+01]		19.7 fb <sup>-1</sup>	8 TeV
f. /A4			WVY	[-2.0e+02, 2.0e+02]		20.2 fb <sup>-1</sup>	8 TeV
M.5 77%			WY	[-6.5e+01, 6.5e+01]		19.7 fb <sup>-1</sup>	8 TeV
f /A4		-	WY.	[-1.3e+02, 1.3e+02]		19.7 fb <sup>-1</sup>	8 TeV
T <sub>M,6</sub> /A		as WW	[-1.2e+01, 1.2e+01]		35.9 fb <sup>-1</sup>	13 TeV	
			WV ZV	[-1.3e+00, 1.3e+00]		35.9 fb <sup>-1</sup>	13 TeV
f /A <sup>4</sup>			Wγ	[-1.6e+02, 1.6e+02]		19.7 fb <sup>-1</sup>	8 TeV
'M,7	H		ss WW	[-1.3e+01, 1.3e+01]		35.9 fb <sup>-1</sup>	13 TeV
1 1			wv zv	[-3.3e+00, 3.3e+00]	1	35.9 fb <sup>-1</sup>	13 TeV
16 19	-200 0	200		400	600	2011	800
	200 0	200		400	000		000
				aOGC Limits	@95	% C I	[TeV <sup>-4</sup>
				udado Linno	000	10 U.L	[

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#### Most Stringent limits.

More can be found from the twiki

Limits also set on (d-)charged Higgs



### WWW: SM and BSM

Recent updates on SM measurement from both <u>ATLAS</u> (3.3sigma, 79.8fb-1) and <u>CMS</u> (0.6sigma, 35.9fb-1) Direct search for WWW resonance on going, inspired by <u>the model</u>



# Future: Deep AK8

### DeepAK8



CMS-DP-2017-049



CMS

(13 TeV)

### Future: <u>Deep Flavor</u>



### Future: <u>Deep Learning on WLWL scattering</u>

### More details can be found from talk by <u>Junho Lee (PKU)</u>



WW scattering: Phys. Rev. D 99, 033004 (2019) ZZ scattering and aQGC: to appear soon





### Summary

Over the last year(s) many developments happened: deep  $\rightarrow$  deeper  $\rightarrow$  deepest



Indirect and Direct searches: rich results ahead, new idea welcome!

### **Background estimation**

Signal peaks in both m<sub>wv</sub> and m<sub>jet</sub>

 $P_{sig}\left(m_{WV}, m_{jet} \middle| \theta(M_X)\right) = P_{WV}(m_{WV} \middle| \theta_1(M_X)) \times P_j(m_{jet} \middle| \theta_2(M_X))$ 

Fit both dimensions



double crystal-ball functions, for LP additional exponential is used for m<sub>iet</sub> mass tail

Interpolate using polynomials as a function of the resonance mass hypothesis (M<sub>x</sub>)

#### Non-resonant background: W+jets

Conditional probability of m<sub>WV</sub> as function of m<sub>jet</sub>:

 $P_{W+jets}(m_{WV}, m_{jet}) = P_{WV}(m_{WV}|m_{jet}, \theta_1) \times P_j(m_{jet}|\theta_2)$ 

- P<sub>WV</sub> templates created using kernel method starting from particle level, clustering as for reconstructed jets
- Determine scale and resolution as function of true jet p<sub>T</sub> (encode uncertainties by varying those)
- Populate templates as sums of 2D gaussian templates in bins of m<sub>iet</sub>
- Smoothen mWV from 2.5 TeV as function of mWV fitting exponential from 2 TeV to avoid empty bins

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### **Background estimation**

#### Resonant background: W+V

Conditional probability of m<sub>WV</sub> as function of m<sub>jet</sub>:

 $P_{W+V}(m_{WV}, m_{jet}|\theta) = P_{WV}(m_{WV}|\theta_1) \times P_j(m_{jet}|\theta_2(m_{WV}))$ 

- P<sub>WV</sub> templates created using kernel method as for W+jets (1D)
- Smoothen  $m_{WV}$  from 1.2 TeV as function of  $m_{WV}$  fitting exponential
- m<sub>jet</sub> template described by W and top mass peaks





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CMS-B2G-17-001 CMS-EXO-17-001

**Mass Decorrelation** 

In some cases, the new taggers have inconvenient behavior for practical use

- Tagger outputs can sculpt background distributions
  - Do not want to look for peaks on top of peaks



Aim to make NN outputs mass-independent through decorrelation procedures

#### W+jets Z+jets

77.3 fb<sup>-1</sup> (13 TeV)

200 m<sub>jet1</sub> [GeV]

27

B2G-18-002

QCD Pythia8



The key feature of our approach is that the application of the substructure requirement preserves the shape of the soft-drop jet mass distribution. Improving on the decorrelation procedure proposed in Ref. [62], we apply a DDT (designed decorrelated tagger) transformation of  $N_2^1$  to  $N_2^{1,DDT}$ . It is defined as  $N_2^{1,DDT}(\rho, p_T) \equiv N_2^1(\rho, p_T) - X_{(5\%)}(\rho, p_T)$ , where  $X_{(5\%)}$  is derived from the simulated  $N_2^1$  distribution and illustrated in Fig. 2] We require events to pass

### **Adversarial Training**

- Version of DeepAK8 applies an adversarial network to penalize the machine for accurately predicting the jet mass
  - Slight loss in performance





CMS-DP-2018-046

