



第十四届TeV物理工作组学术研讨会

# Polarization fraction measurement in same sign WW scattering using deep learning

[arXiv:1812.07591](https://arxiv.org/abs/1812.07591)

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2019.04.20

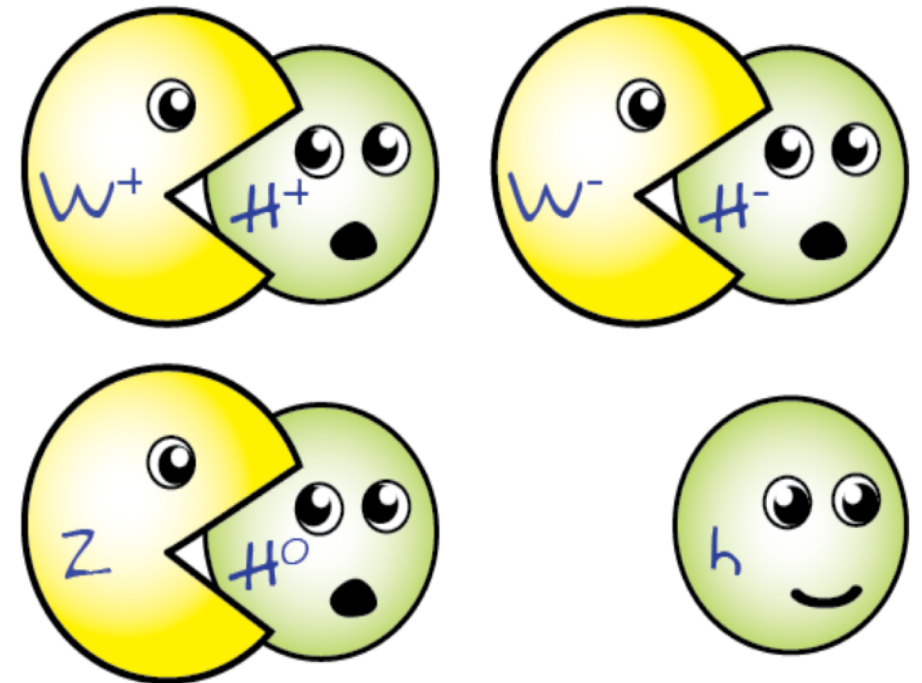
# Outline

- 1. Higgs and vector boson
- 2. Vector boson scattering (VBS)
- 3. VBS same-sign WW
- 4. Polarization fraction measurement in VBS same-sign WW
- 5. Polarization fraction measurement in VBS ZZ (on-going)
- 6. Conclusion



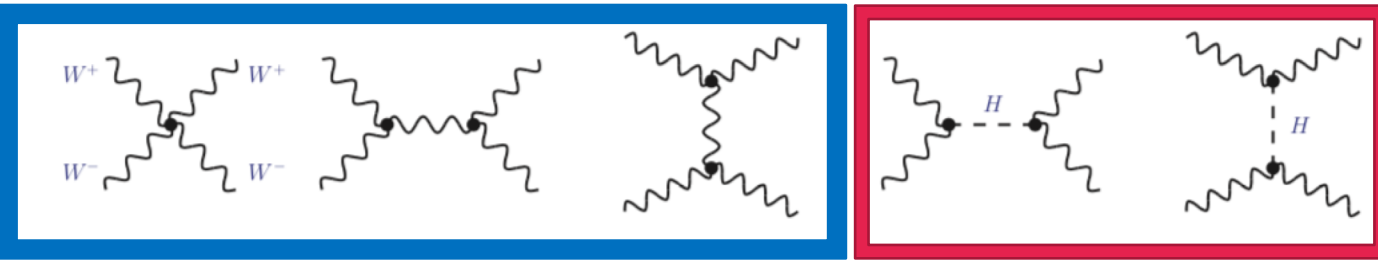
# Higgs and longitudinal fraction of vector boson

- Without Higgs, gauge bosons are massless in Standard Model (SM) with gauge symmetry.
- Higgs mechanism put forwarded
  - Breaking gauge symmetry, attaining mass of gauge bosons.
  - For Electroweak sector, Electroweak symmetry breaking
    - Massive vector bosons ( $W^+$ ,  $W^-$ , and  $Z$  boson)
    - Transverse and **longitudinal** polarization fraction
    - Additional massive scalar boson : Higgs boson.



# VBS and Unitarity violation

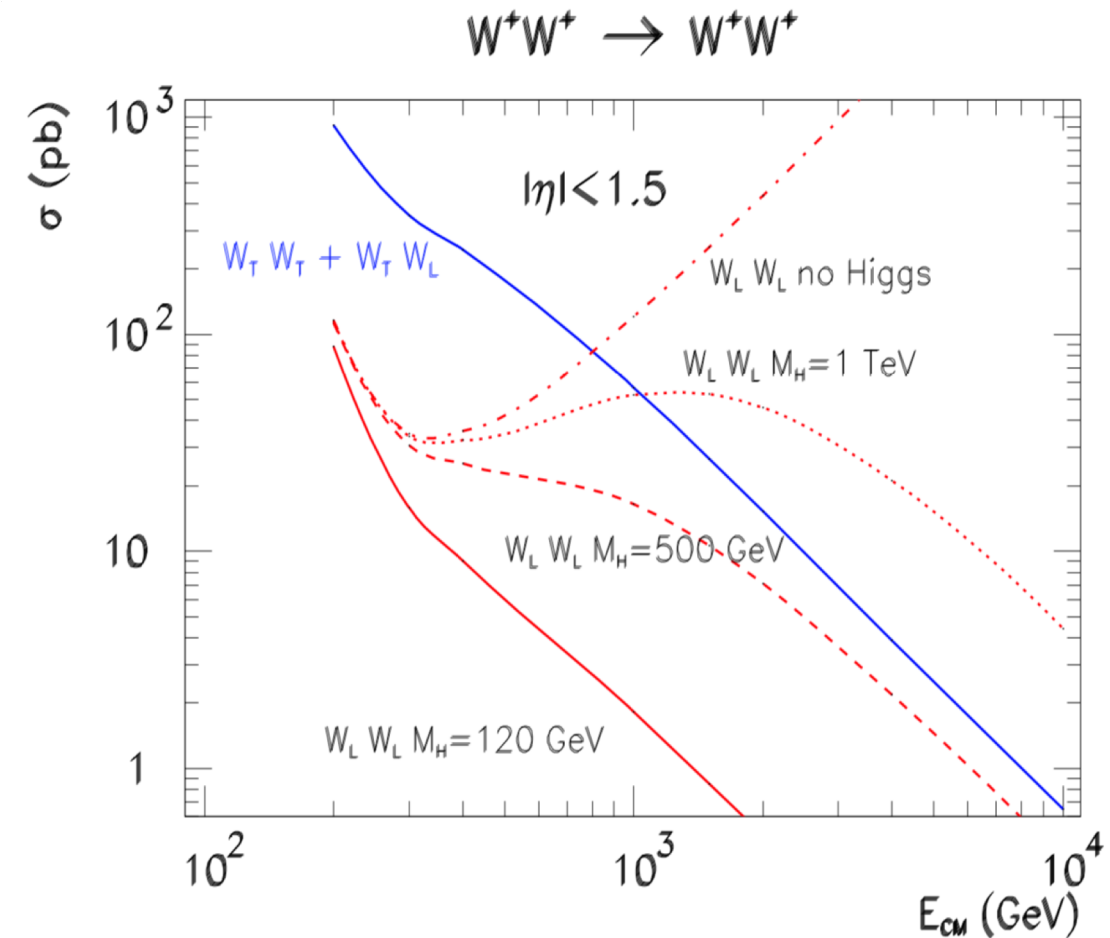
- If there is no Higgs boson  
→ Cross-section of vector boson scattering diverges.



- If Higgs boson is too heavy ( $> 1 \text{ TeV}$ )  
→ Diverge

→ Unitarity violation

- $V_L V_L \rightarrow V_L V_L$  scattering is crucial.



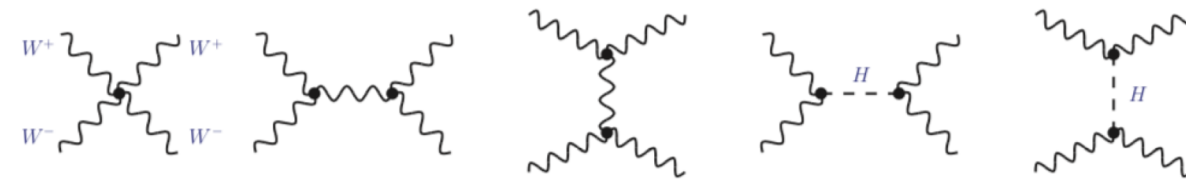
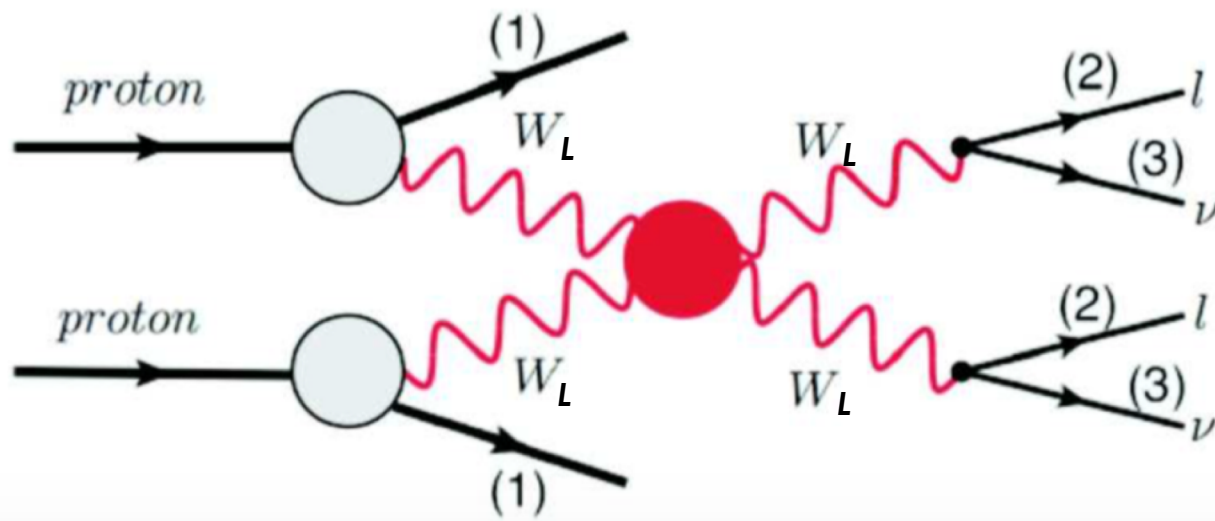
arXiv:1412.8367

# Higgs boson and vector boson scattering (VBS)

- SM Higgs boson found around mass of  $\sim 125\text{GeV}$ .
- Higgs boson unitarization can be tested by VBS process ( $V_L V_L \rightarrow V_L V_L$ )
  - VBS same-sign WW scattering is one of the most promising channel

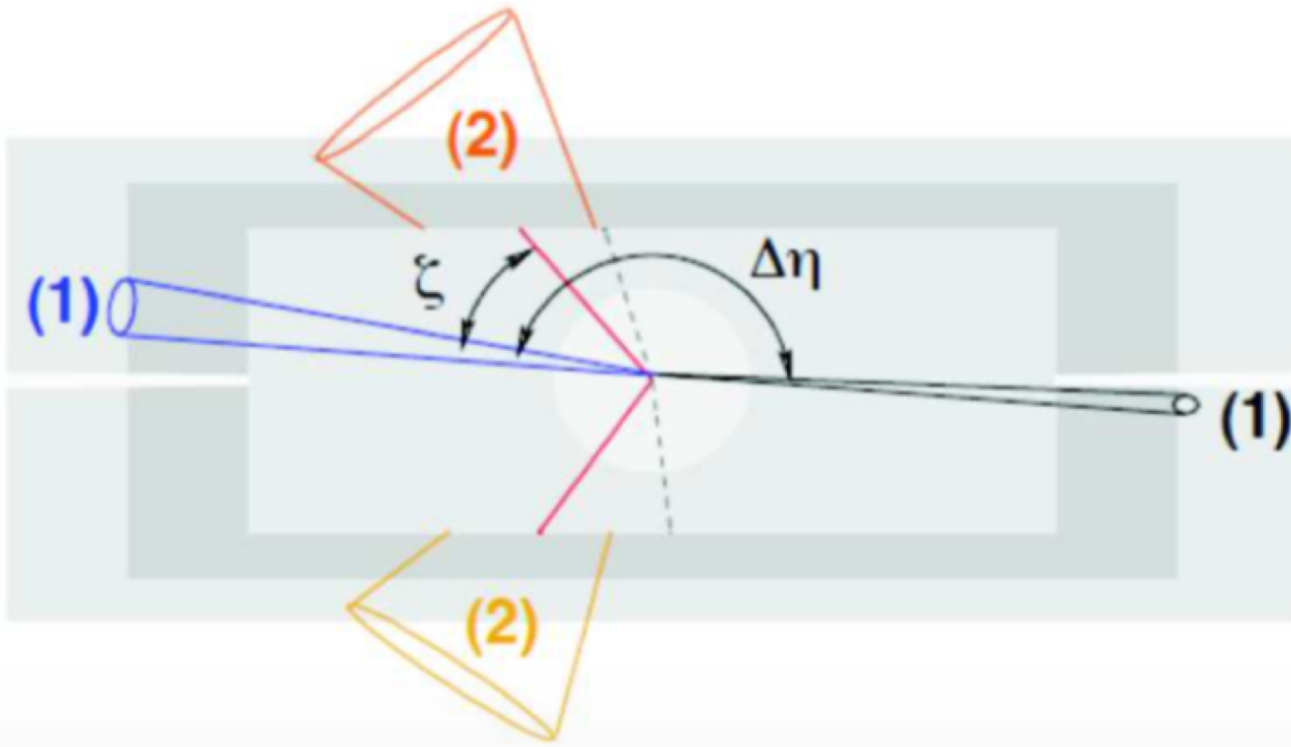
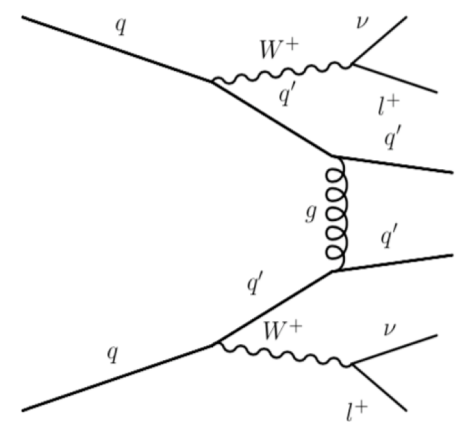
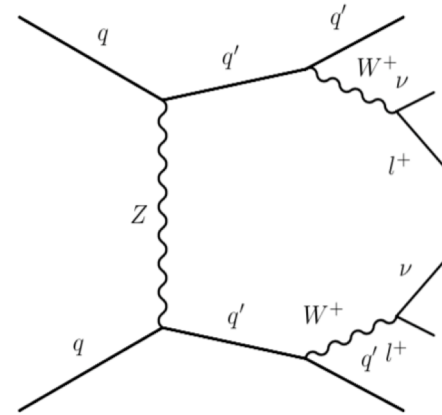
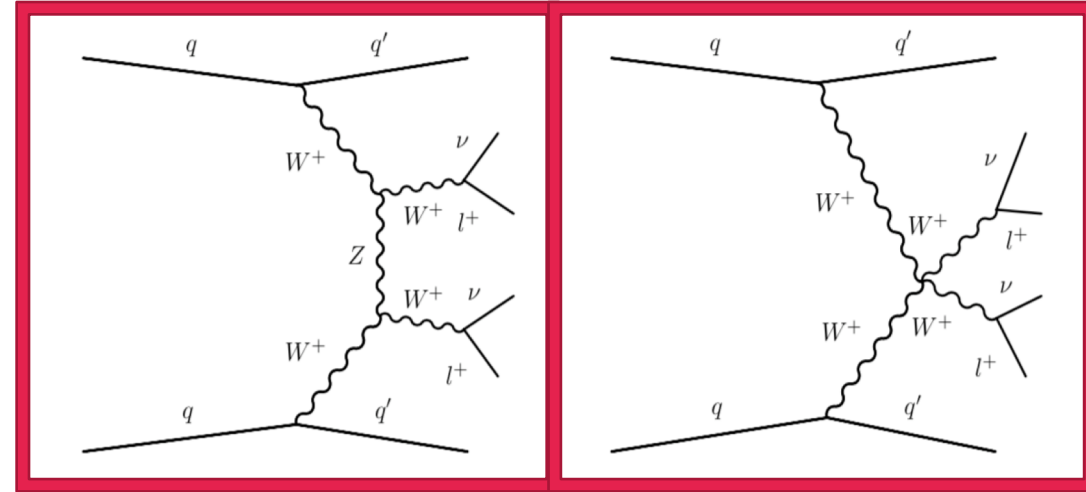
**Standard Model of Elementary Particles**

	three generations of matter (fermions)			interactions / force carriers (bosons)	
	I	II	III		
mass	$\approx 2.2 \text{ MeV}/c^2$	$\approx 1.28 \text{ GeV}/c^2$	$\approx 173.1 \text{ GeV}/c^2$	0	$\approx 124.97 \text{ GeV}/c^2$
charge	$\frac{2}{3}$	$\frac{2}{3}$	$\frac{2}{3}$	0	0
spin	$\frac{1}{2}$	$\frac{1}{2}$	$\frac{1}{2}$	1	0
	<b>u</b> up	<b>c</b> charm	<b>t</b> top	<b>g</b> gluon	<b>H</b> higgs
	<b>d</b> down	<b>s</b> strange	<b>b</b> bottom	<b><math>\gamma</math></b> photon	
	<b>e</b> electron	<b><math>\mu</math></b> muon	<b><math>\tau</math></b> tau	<b>Z</b> Z boson	
	<b><math>\nu_e</math></b> electron neutrino	<b><math>\nu_\mu</math></b> muon neutrino	<b><math>\nu_\tau</math></b> tau neutrino	<b>W</b> W boson	



# Vector boson scattering

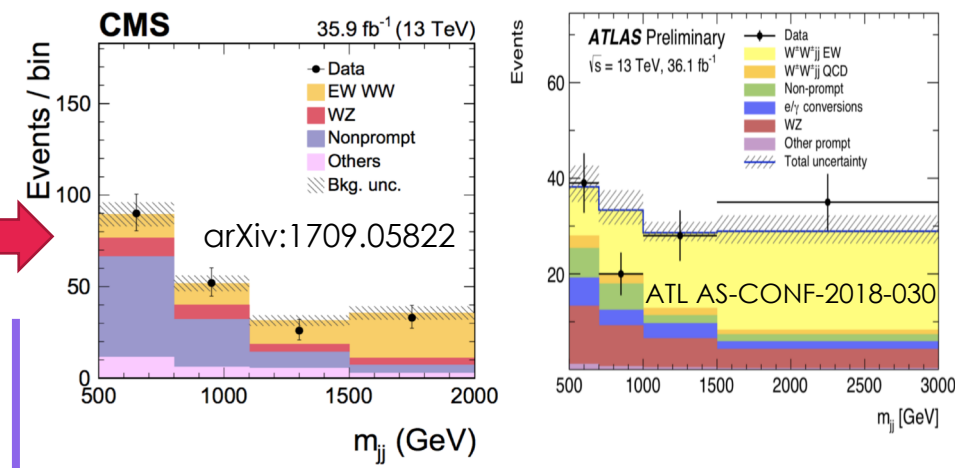
- Two energetic jets in forwarded region
- Relatively pure EWK region in between the two jets
  - Profits from low background





# VBS Same-sign WW scattering

- The process ( $WW \rightarrow WW$ ) has been observed by both ATLAS and CMS with luminosity of  $\sim 36 fb^{-1}$ , at  $\sqrt{s} = 13 TeV$ .

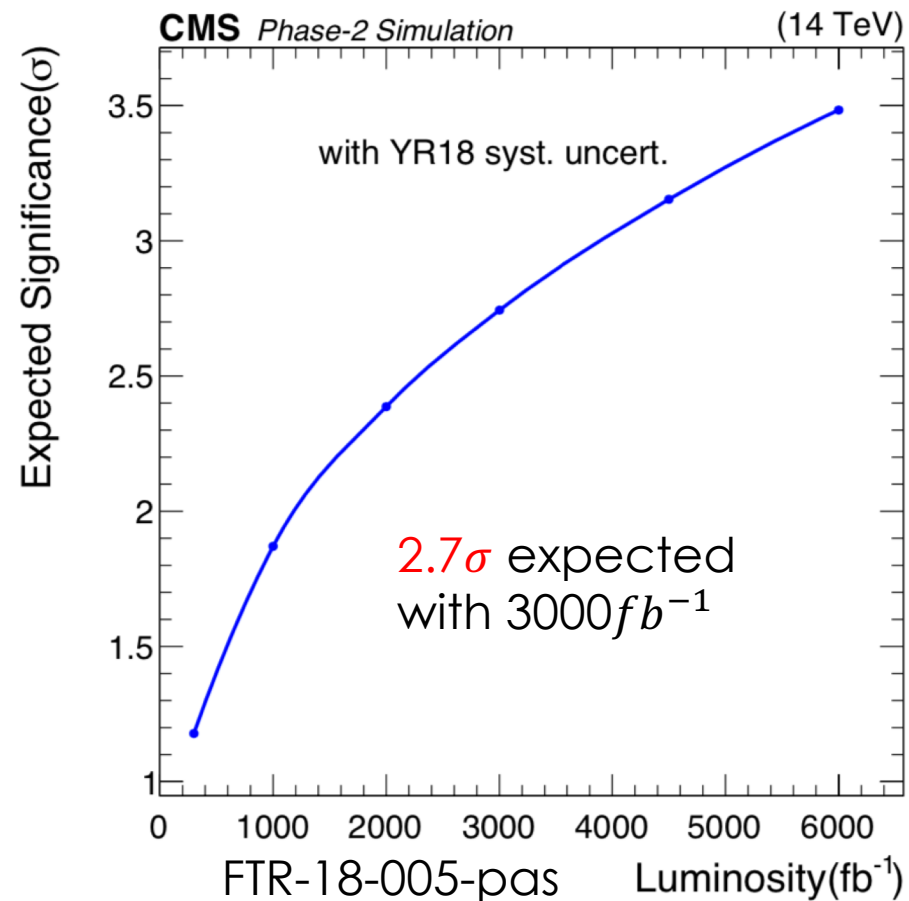
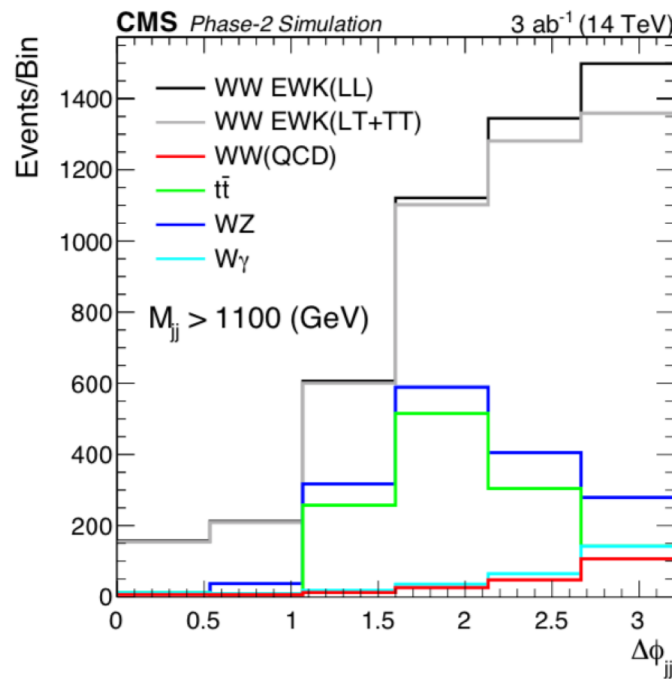
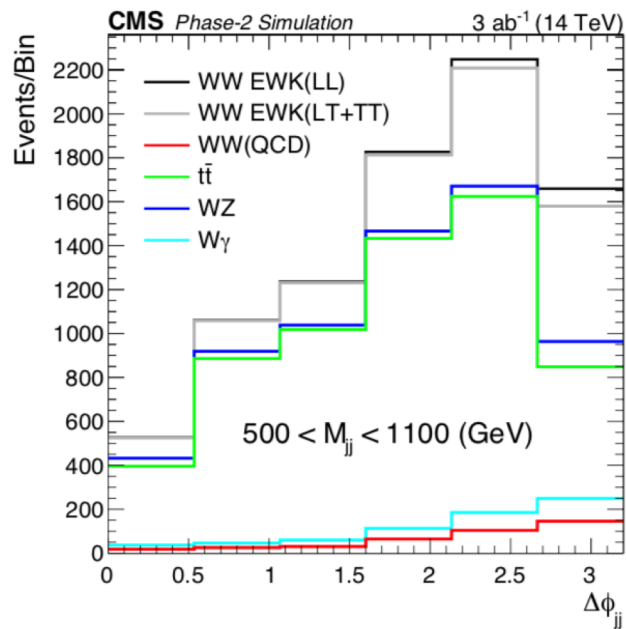


- Longitudinal fraction of vector boson only takes  $\sim 6\%$   
 $\rightarrow$  Not enough data for measuring  $W_L W_L \rightarrow W_L W_L$  with current Data.

$\rightarrow$  High Luminosity LHC, prediction on  $W_L W_L \rightarrow W_L W_L$

- $\sqrt{s} = 14 TeV$
- Lumi =  $3000 fb^{-1}$

**Multivariate analysis?**



# VBS Same-sign WW private event production

## MC production pipe line

MadGraph5\_ aMC@NLO

DECAY

Pythia & Delphes

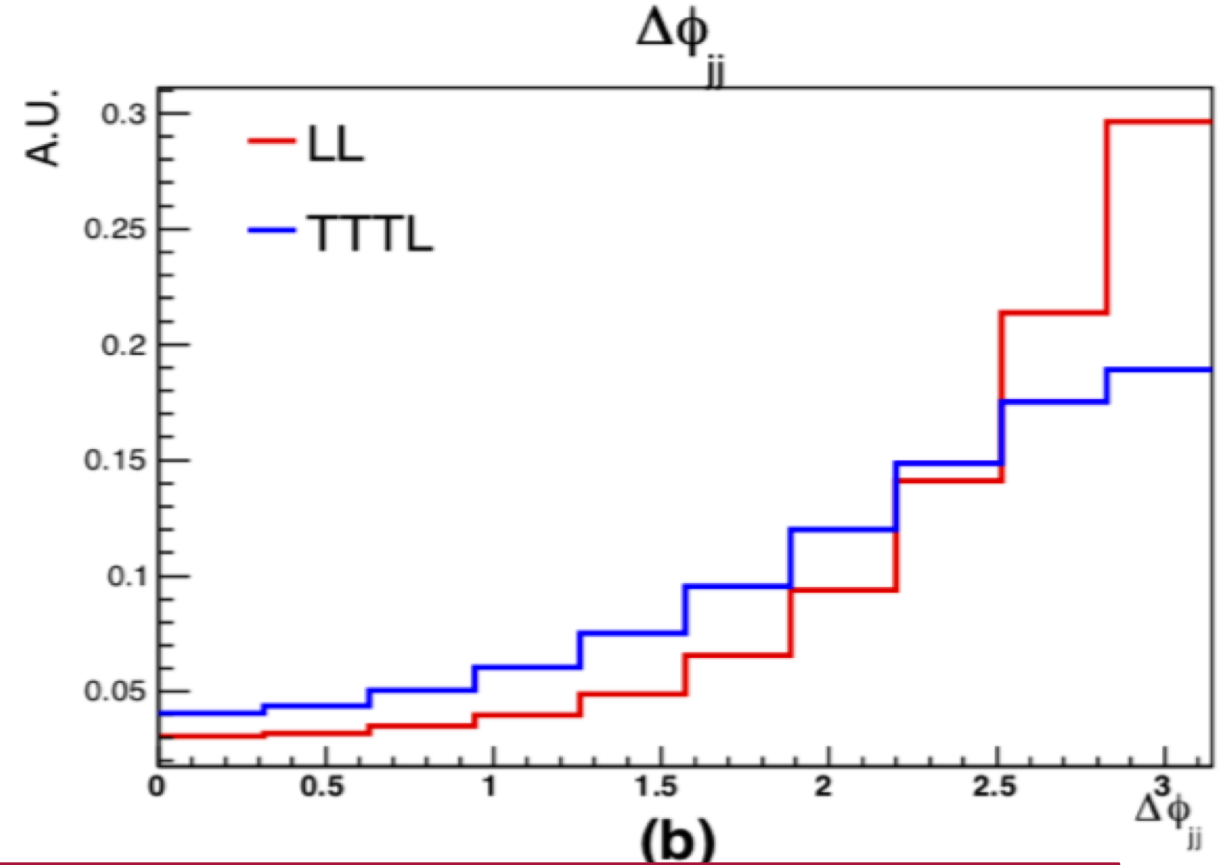
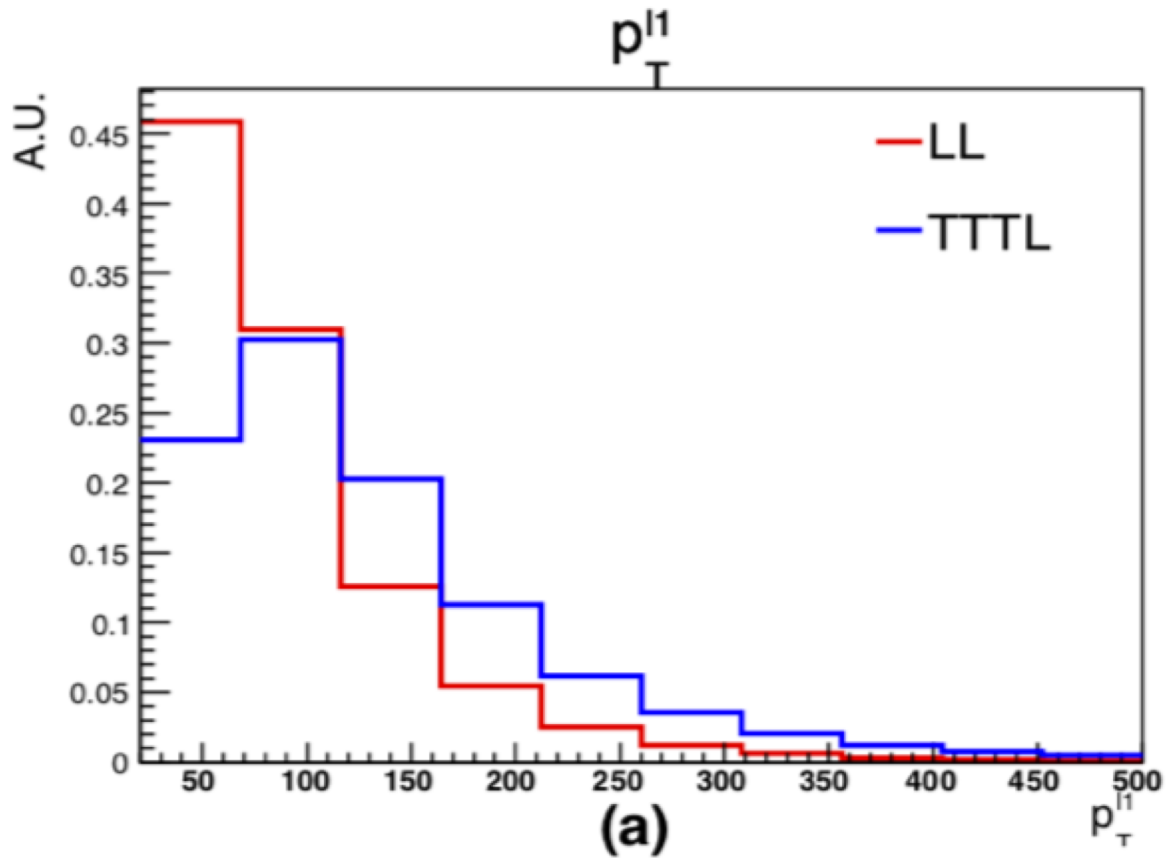
Event selection

- Charged lepton
  - Charged lepton number  $\geq 2$
  - Same electrical charge
  - $P_T > 20$  GeV
  - $|\eta| < 2.4$
  - Z veto ( $40 < M_{ll} < 70$ , or  $M_{ll} > 110$ )
  - $\Delta\eta_{ll} < 2.0$
- Missing transverse momentum
  - $P_T > 40$  GeV
- Jet
  - Jet number  $\geq 2$
  - $P_T > 30$  GeV
  - $|\eta| < 4.7$
  - $M_{jj} > 850$  GeV
  - $\Delta\eta_{jj} > 2.5$
- Other
  - B jet veto

# Typical kinematic distribution :

$$P_T^{l1}, \Delta\phi_{jj}$$

- $V_L V_L \rightarrow V_L V_L \rightarrow \underline{LL}$
- “ $V_T V_T \rightarrow V_T V_T$ ” & “ $V_T V_L \rightarrow V_T V_L$ ”  $\rightarrow \underline{TTTL}$



Not enough discriminating power ➔ Idea :: Go for **multivariate classification**

# DNN dense model

Dataset

Train Dataset

Obtain Trained DNN model  
→ LL and TTTL classifier

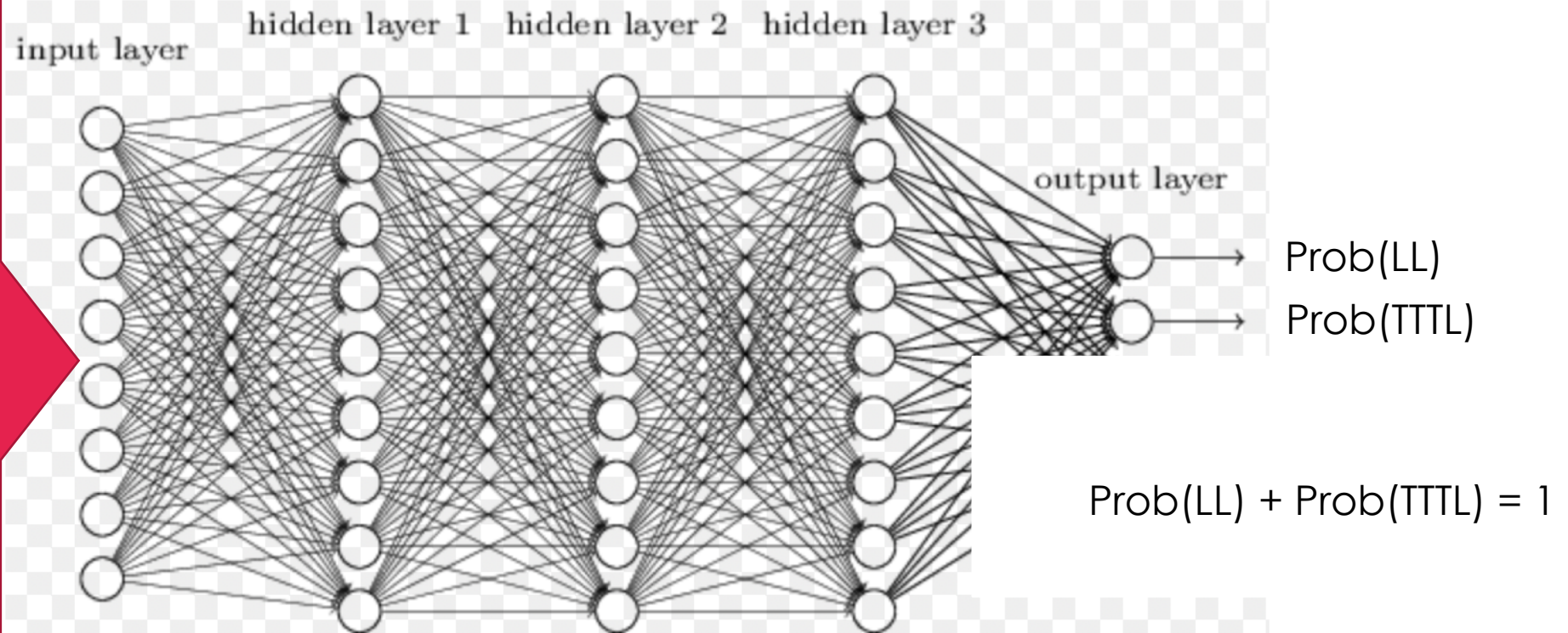
Test Dataset

Test performance of the model

Low level:

lep1pt,  
lep1eta,  
lep1phi,  
lep2pt,  
lep2eta,  
lep2phi,  
jet1pt,  
jet1eta,  
jet1phi,  
jet1M  
jet2pt,  
jet2eta,  
Jet2phi,  
jet2M,  
MET,  
METphi

High level:  
dr\_ll\_jj,  
dphijj,  
detajj,  
Zeppen\_lep1,  
Zeppen\_lep2

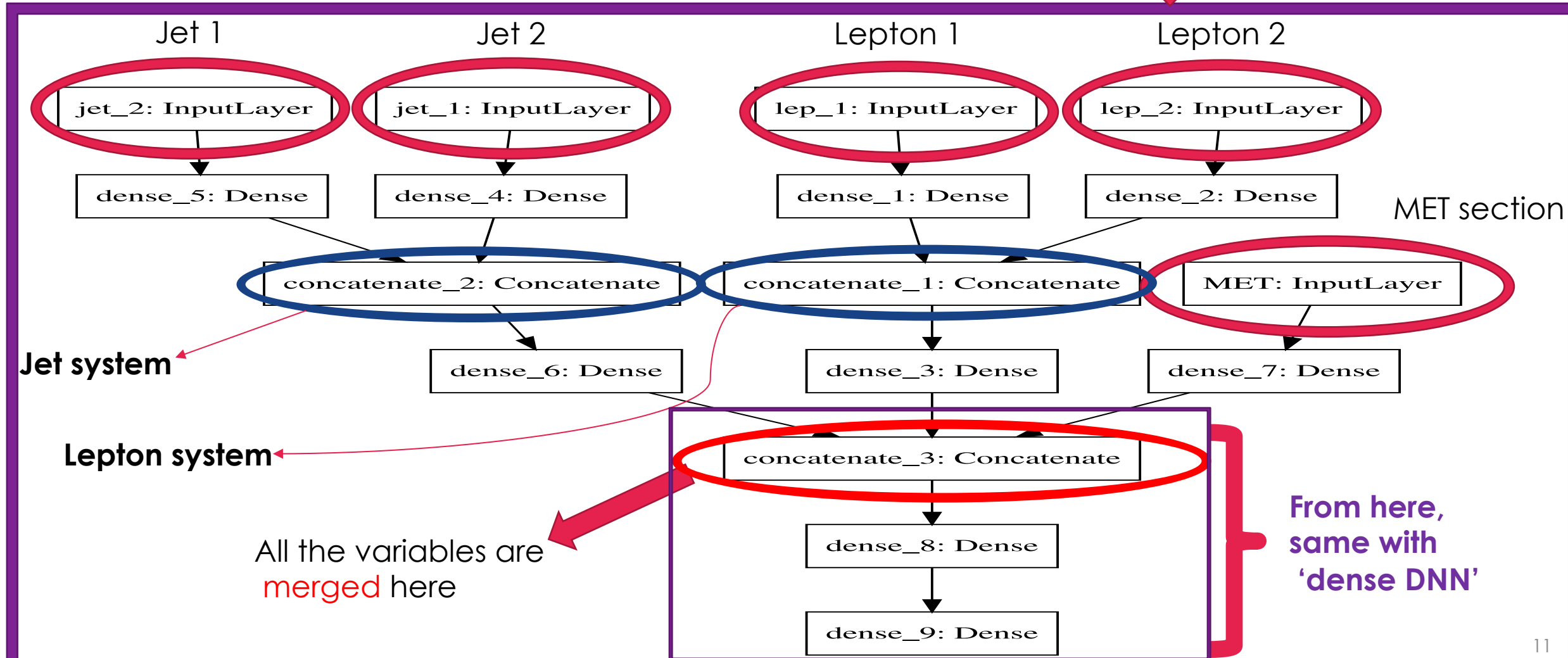


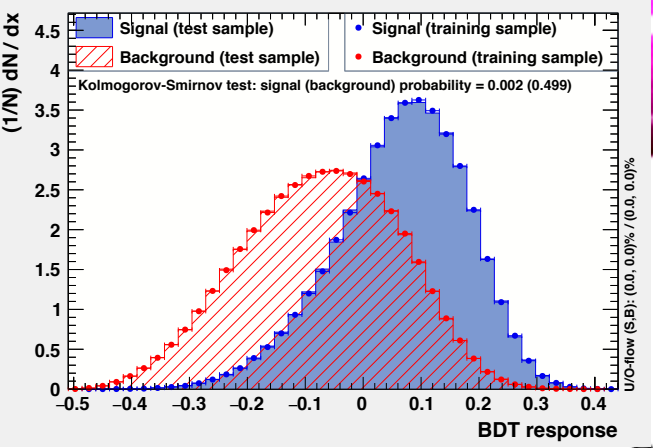


# DNN particle-based model

Polarization might be highly correlated with angular variable of **each particle**

Separate each particle and train!





BDT

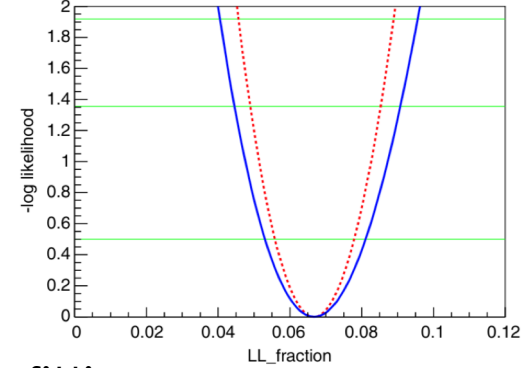
DNN

# DNN performance

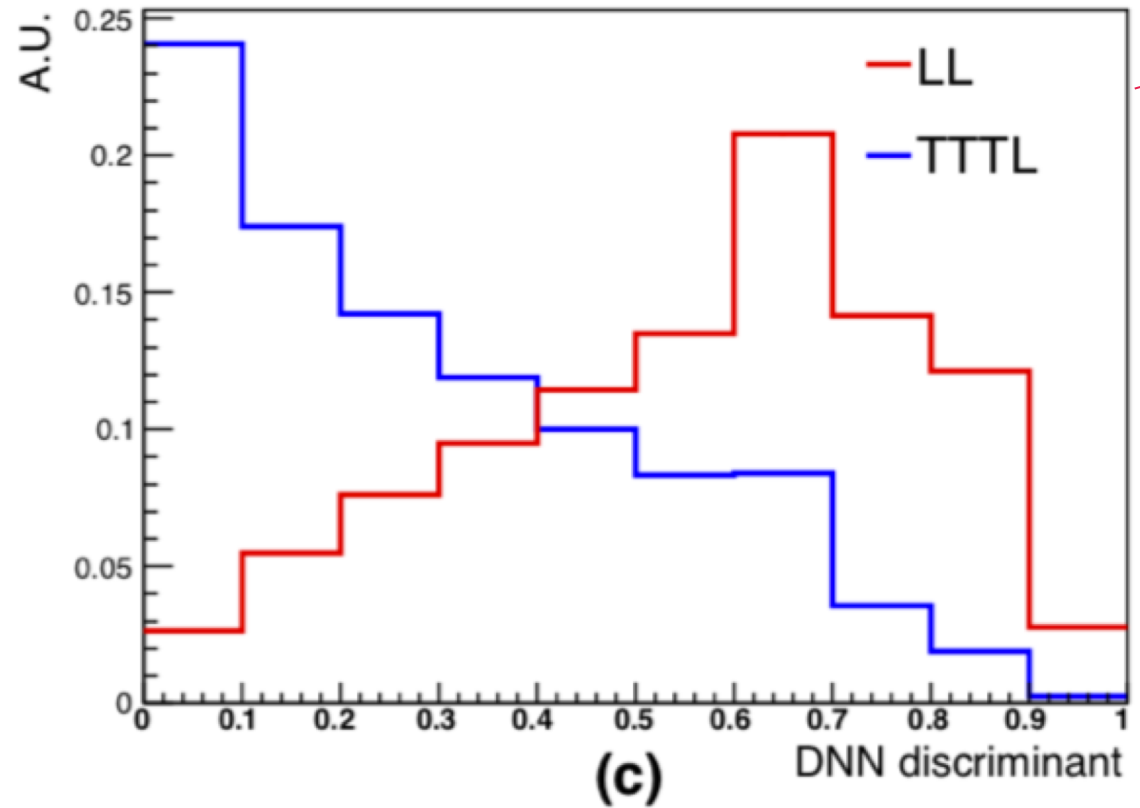
One event in, one discriminant value out

Multiple events in, multiple discriminant values out

Discriminant distribution

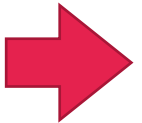
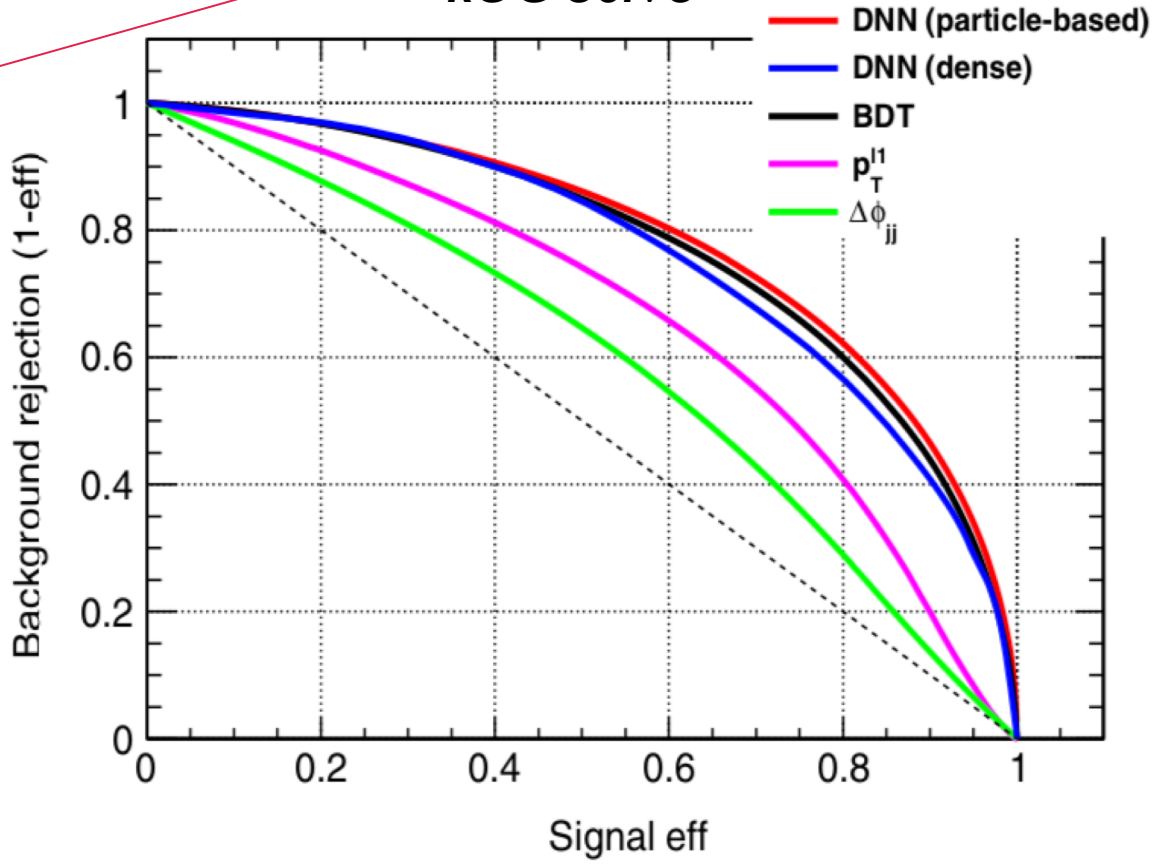


fitting ( $M_{jj} > 1.5 \text{ GeV}$ )

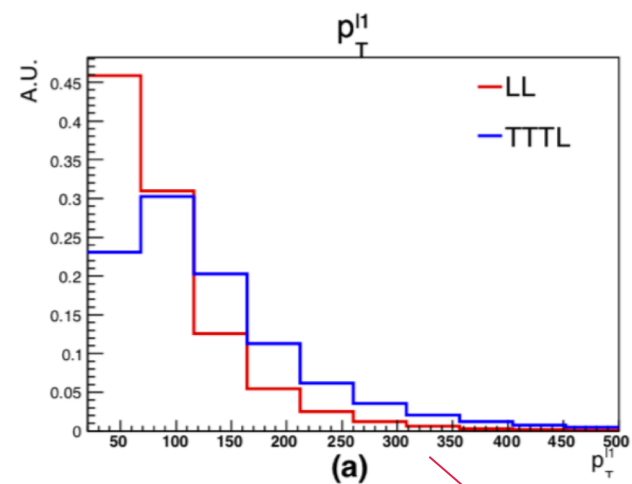


(c)

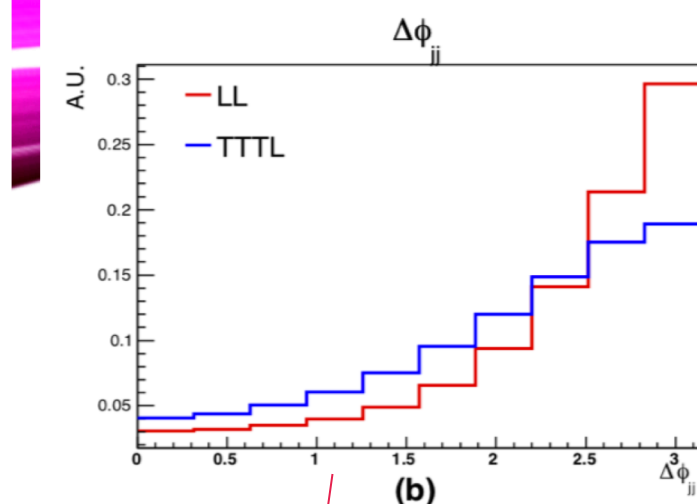
ROC curve



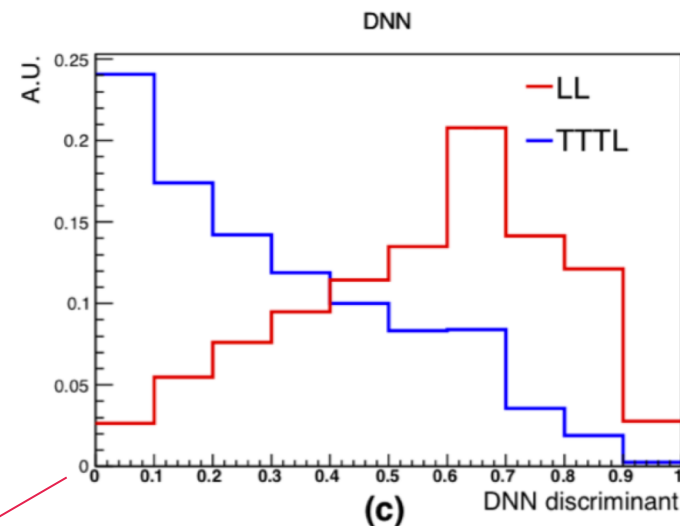
# VBS-SSWW Results



(a)

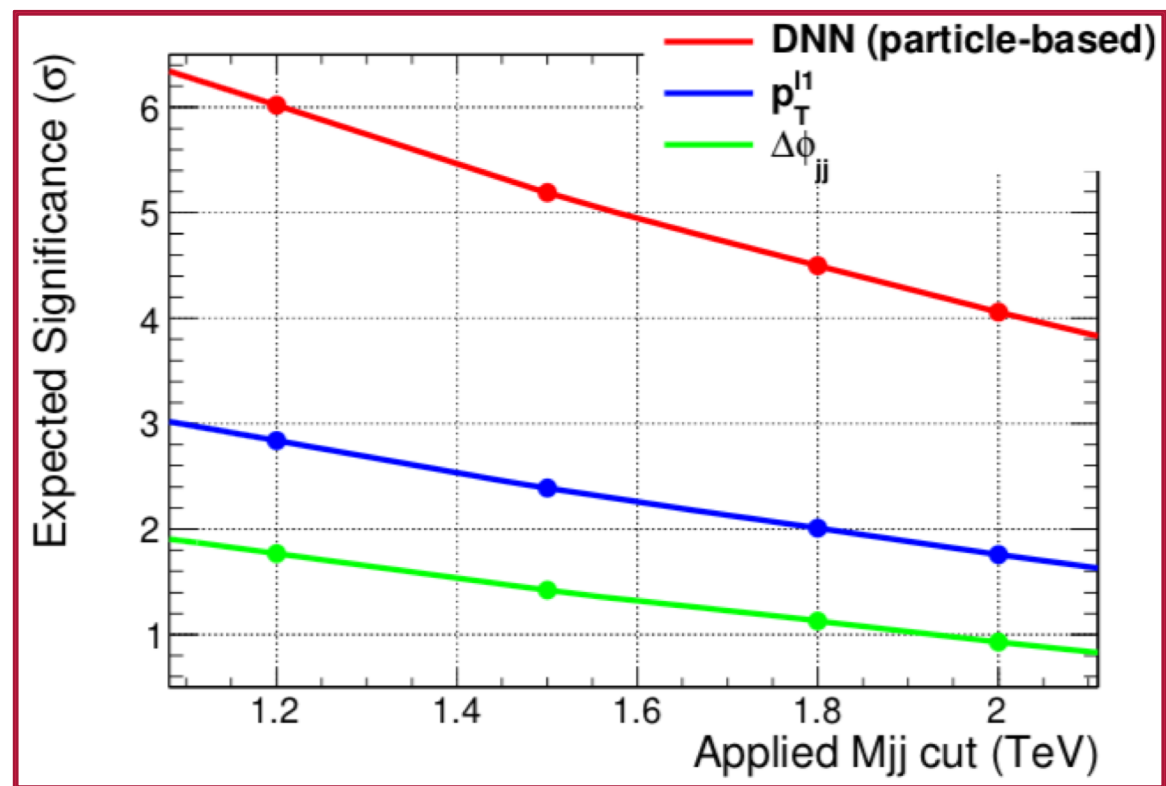


(b)

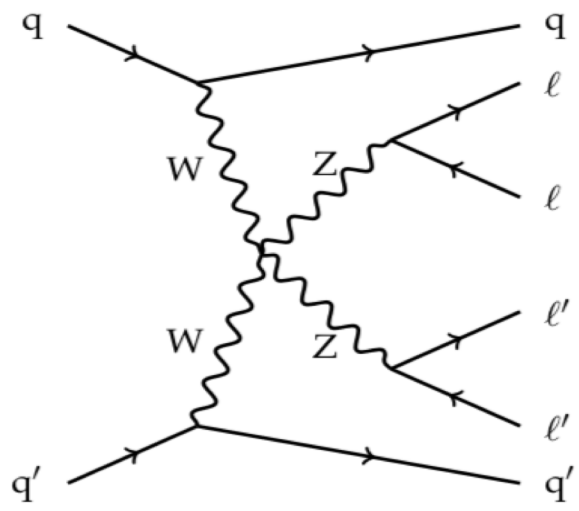


(c)

$m_{jj}$ cut	True Fraction	$p_T^{l1}$	$\Delta\phi_{jj}$	DNN
$> 850$ GeV	6.66%	$6.67\% +1.95\%$ $-1.90\%$	$6.67\% +2.80\%$ $-2.76\%$	$6.66\% +1.11\%$ $-1.04\%$
$> 1200$ GeV	6.68%	$6.70\% +2.26\%$ $-2.22\%$	$6.70\% +3.29\%$ $-3.25\%$	$6.68\% +1.26\%$ $-1.20\%$
$> 1500$ GeV	6.67%	$6.71\% +2.62\%$ $-2.57\%$	$6.68\% +3.85\%$ $-3.80\%$	$6.67\% +1.44\%$ $-1.37\%$
$> 1800$ GeV	6.69%	$6.70\% +3.02\%$ $-2.96\%$	$6.68\% +4.48\%$ $-4.42\%$	$6.69\% +1.63\%$ $-1.56\%$
$> 2000$ GeV	6.66%	$6.67\% +3.34\%$ $-3.27\%$	$6.66\% +4.98\%$ $-4.93\%$	$6.66\% +1.79\%$ $-1.71\%$



Higher significance achievable!



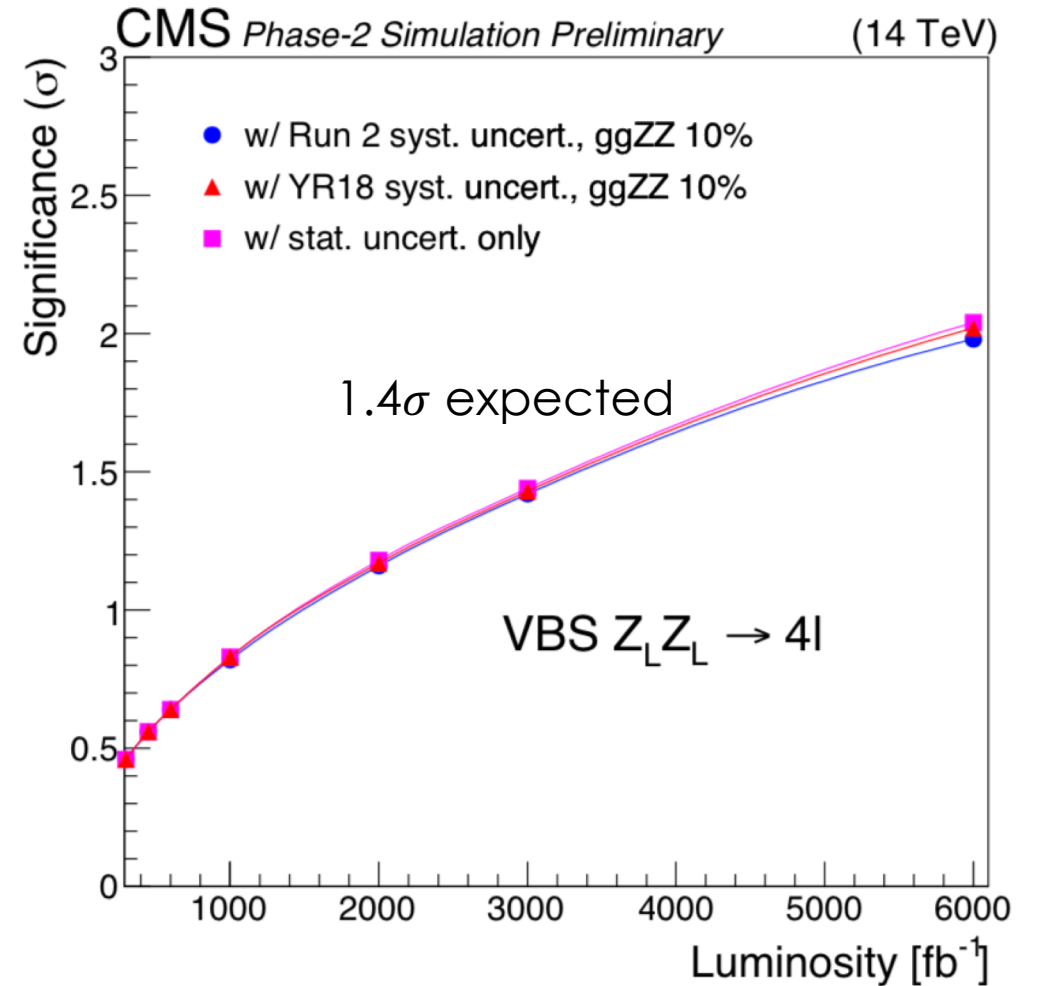
# Polarization Fraction Measurement in VBS ZZ (on-going)

**Advantages** comparing with VBS Same-sign WW:

- No missing transverse momenta  
→ Particle-based DNN
- Easy to modeling background from other process

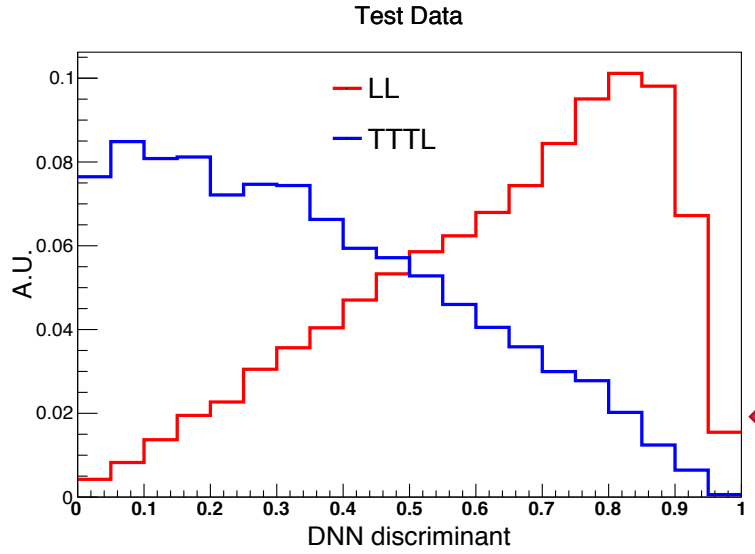
**Disadvantage :**

- Low cross-section  
→ Lower yield for signal MC

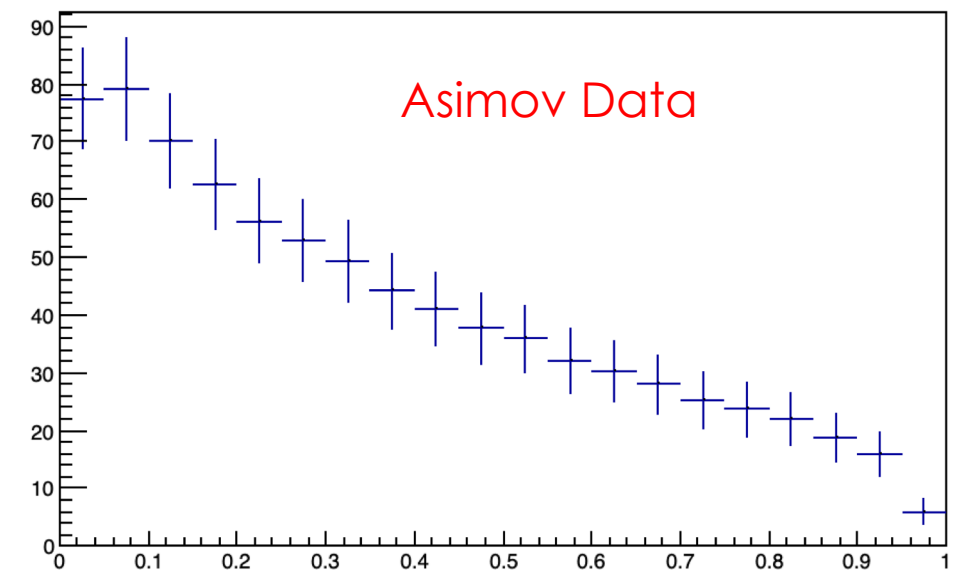
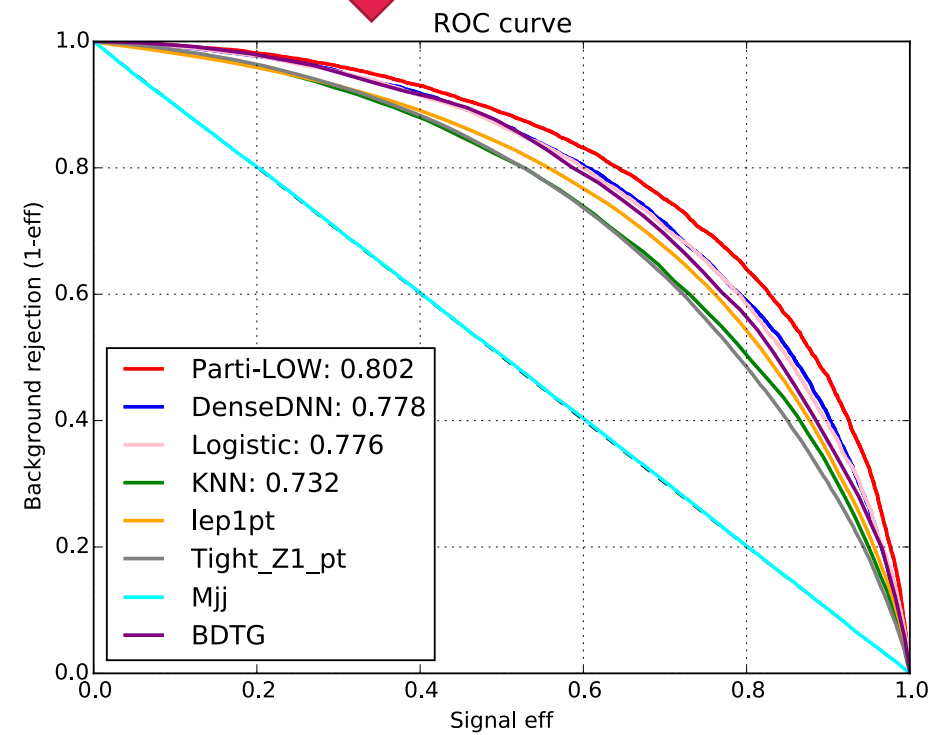
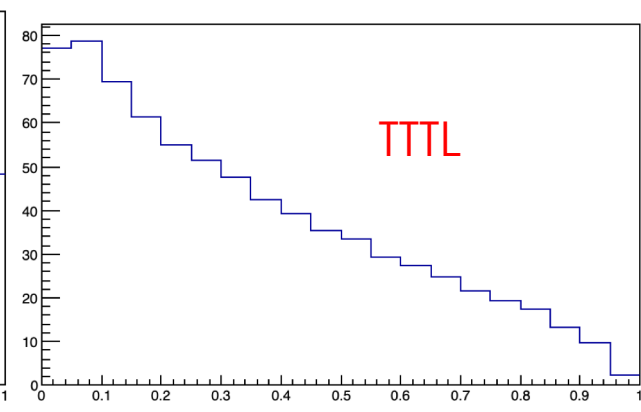
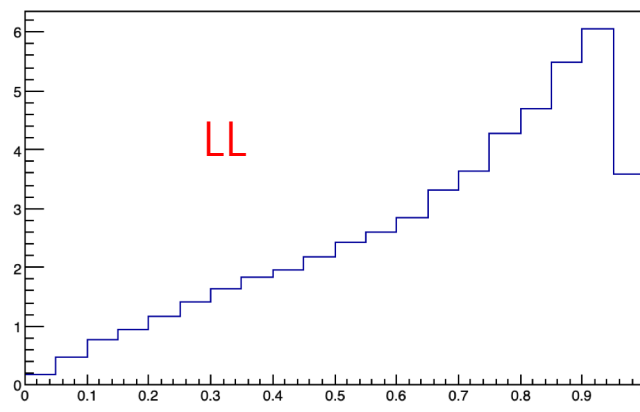




# ROC curve & Asimov Data



Trained Model



# Summary

- Longitudinally polarized vector boson scattering ( $V_L V_L \rightarrow V_L V_L$ ) is crucial for testing Higgs unitarization.
- Within VBS same-sign WW channel, which is one of the most promising VBS channel, we need further more data or advanced technique for observing  $V_L V_L \rightarrow V_L V_L$ .
- DNN can be applied to improve sensitivity.
  - Particle-based DNN could be tried for further improvement.
- Particle-based DNN model might be able to apply on other similar analysis.



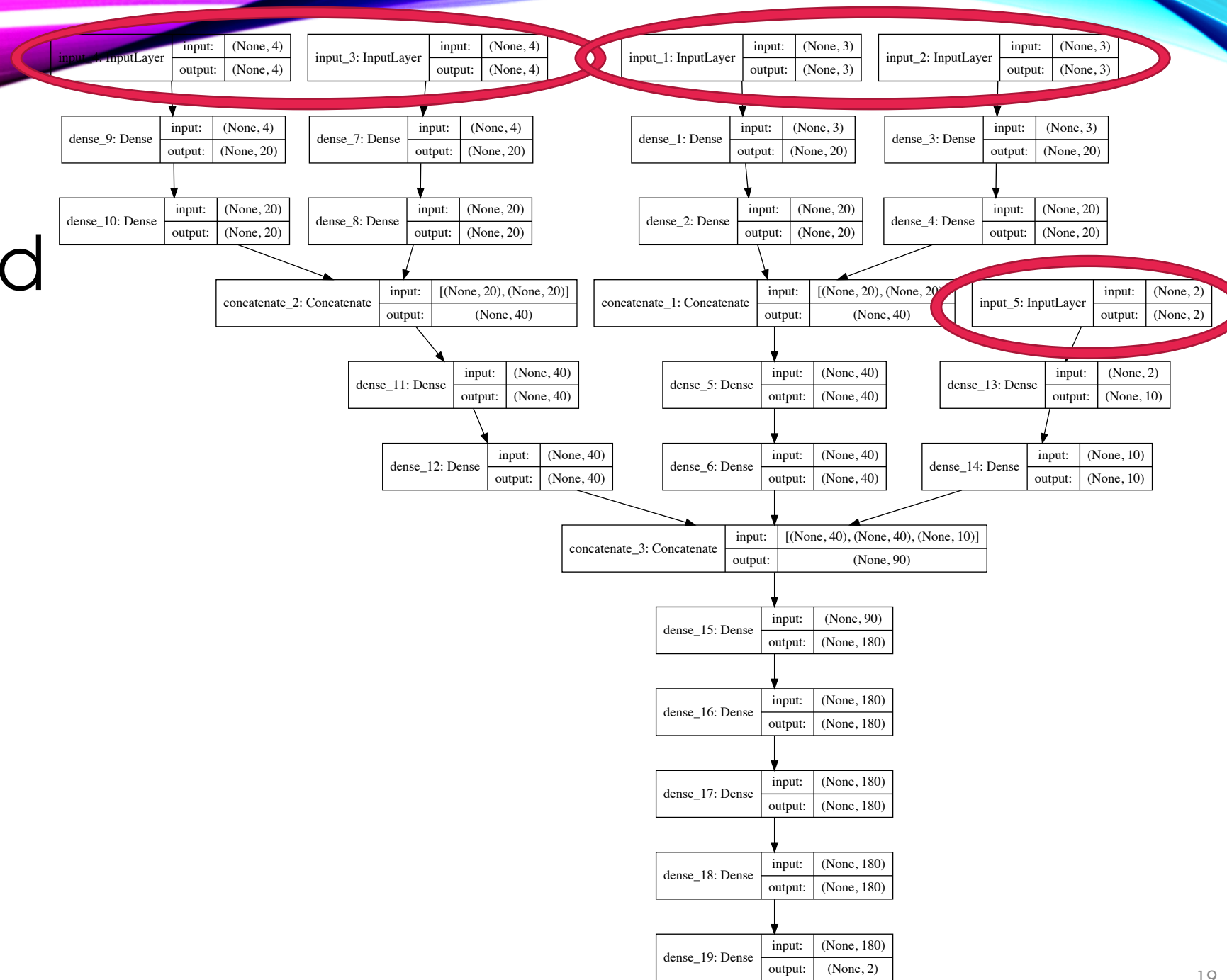
Thank you!



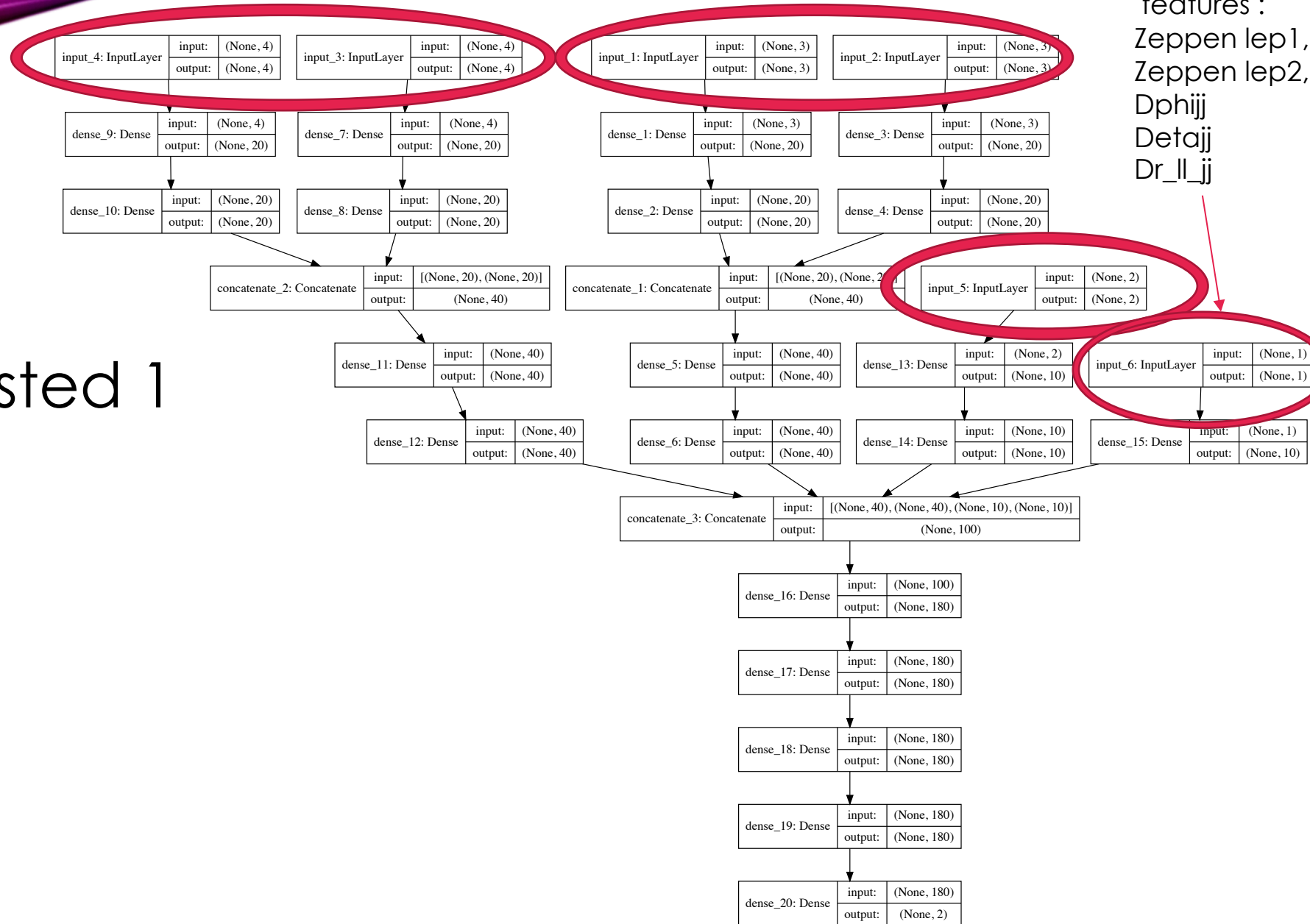
Back-up



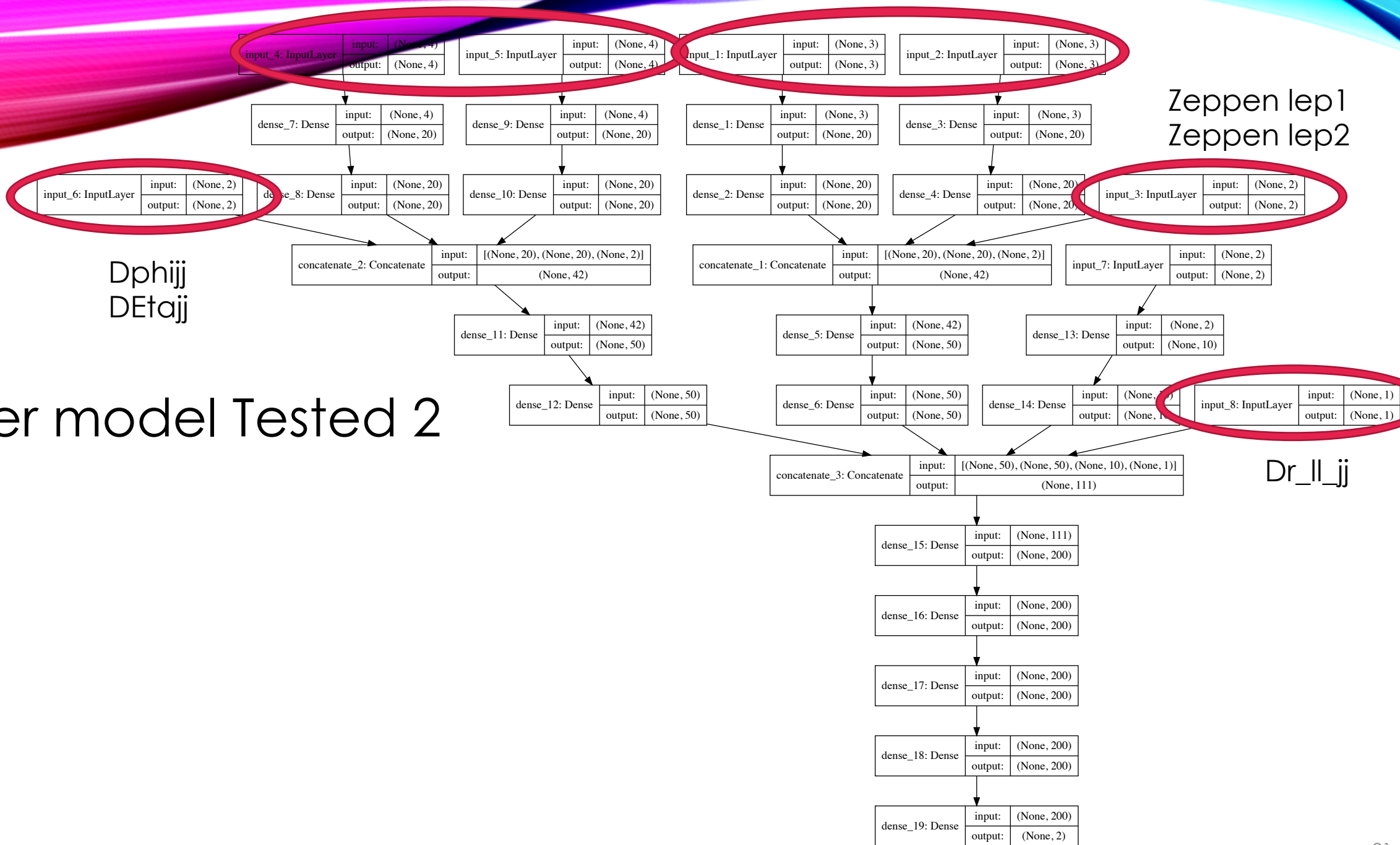
Real model used  
: default model



# Another model Tested 1



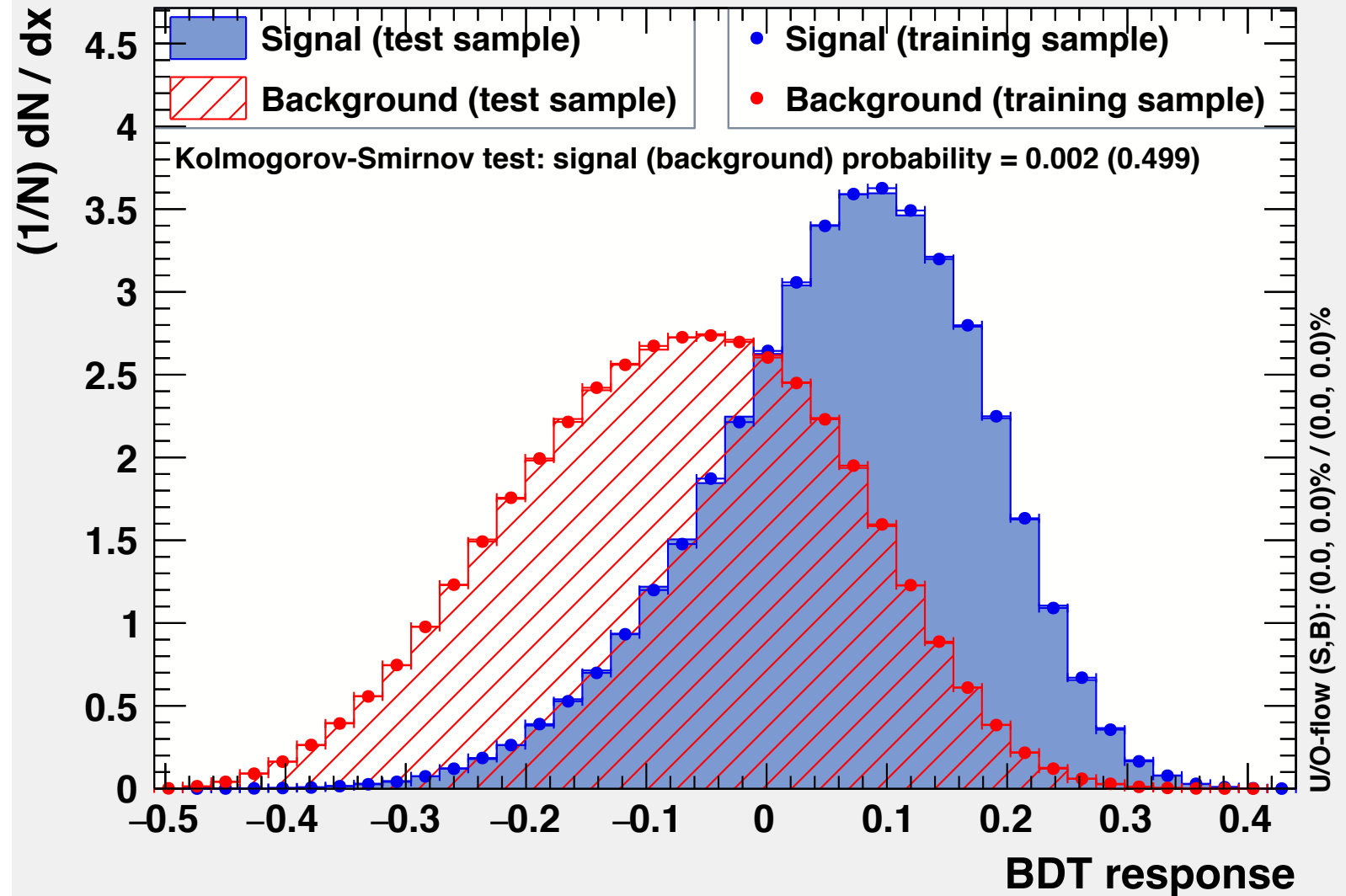
High-level features :  
 Zeppen lep1,  
 Zeppen lep2,  
 Dphijj  
 Detajj  
 Dr\_ll\_jj



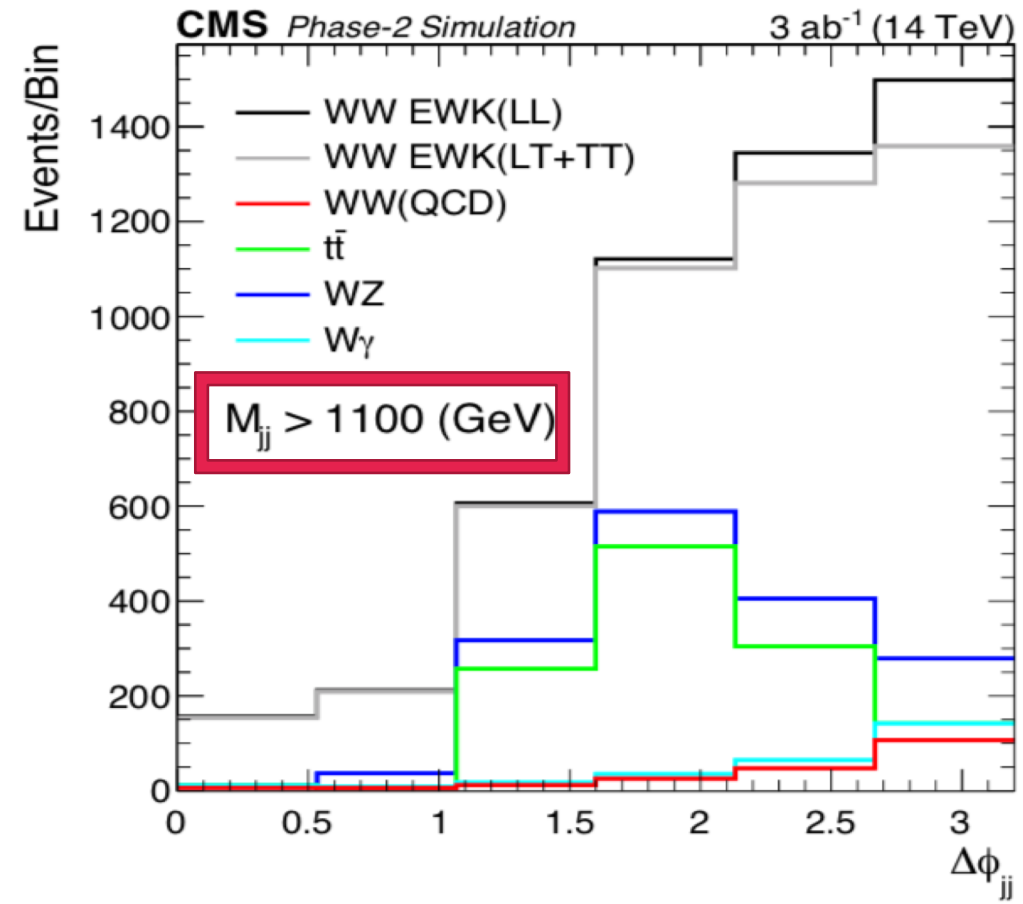
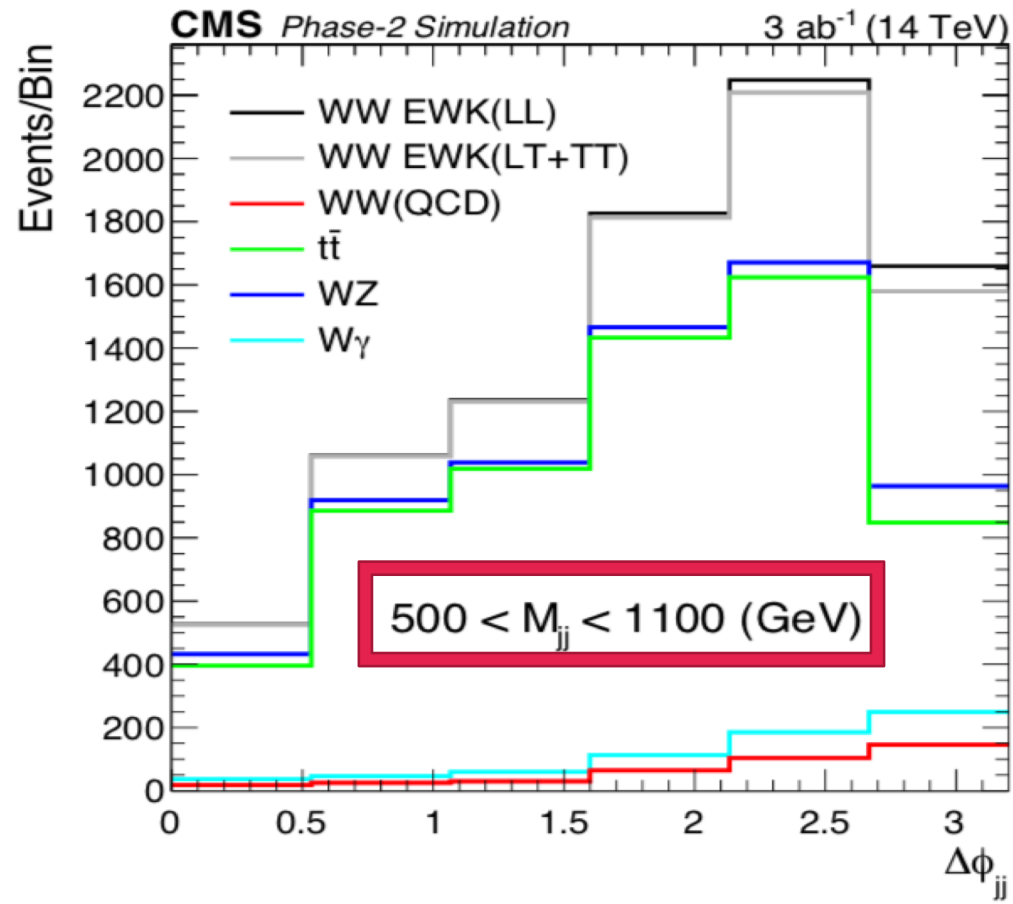
Another model Tested 2

1000 trees of 5 maximum depth,  
'Adaptive Boost' used for boosting  
(Gradient optimizer tested as well)

### TMVA overtraining check for classifier: BDT



# SSWW Background samples



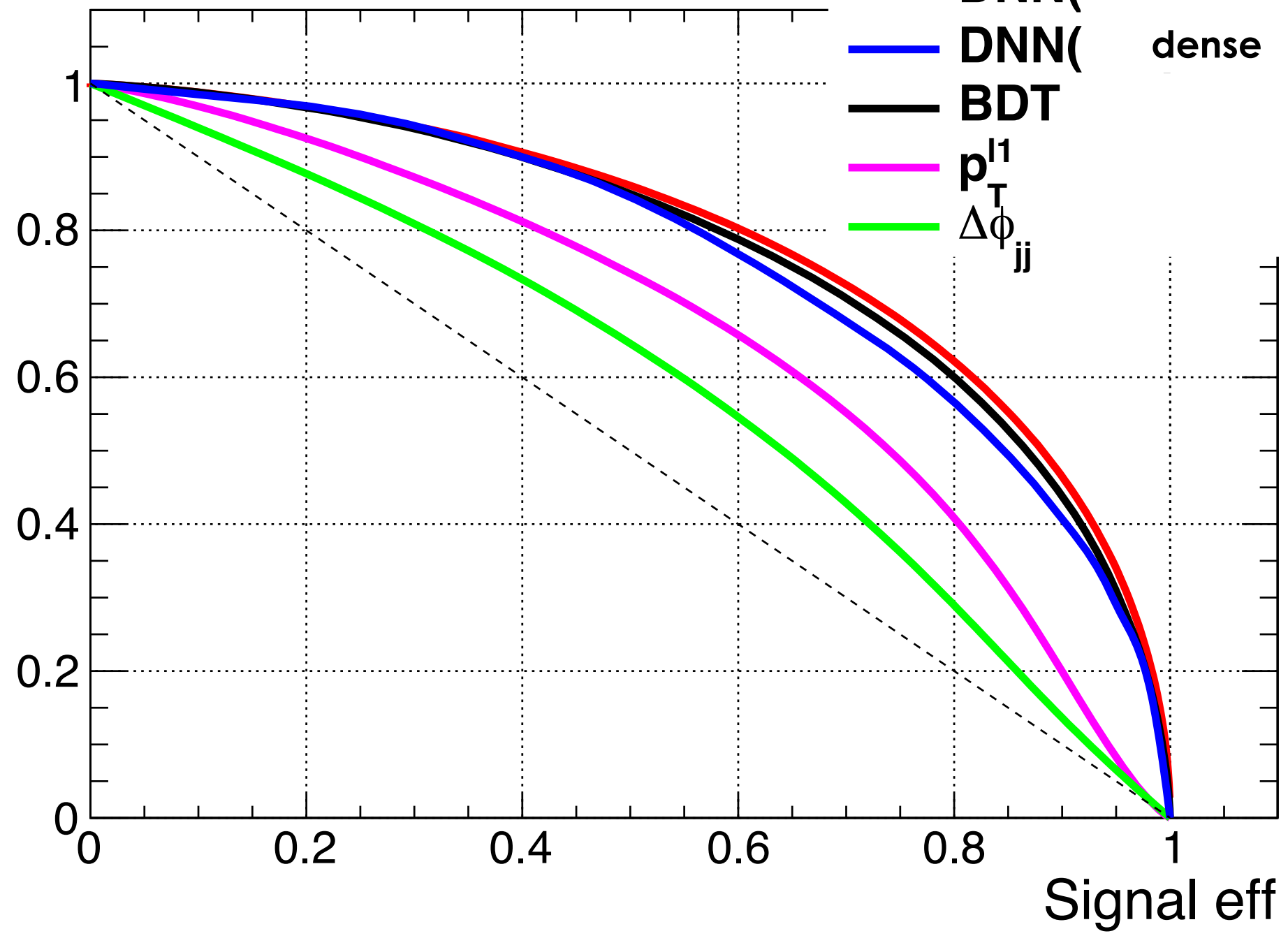
Plots are from FTR 18-005 : Clearly showing dominant backgrounds (ttbas & WZ) are being suppressed in high  $M_{jj}$  region  $\longrightarrow$   $M_{jj} > 1.5 \text{ TeV}$ ,  $2.0 \text{ TeV}$   $\rightarrow$  background would be negligible



Background rejection(1-eff)

- DNN( particle-based )
- DNN( dense )
- BDT
- $p_T^{l1}$
- $\Delta\phi_{jj}$

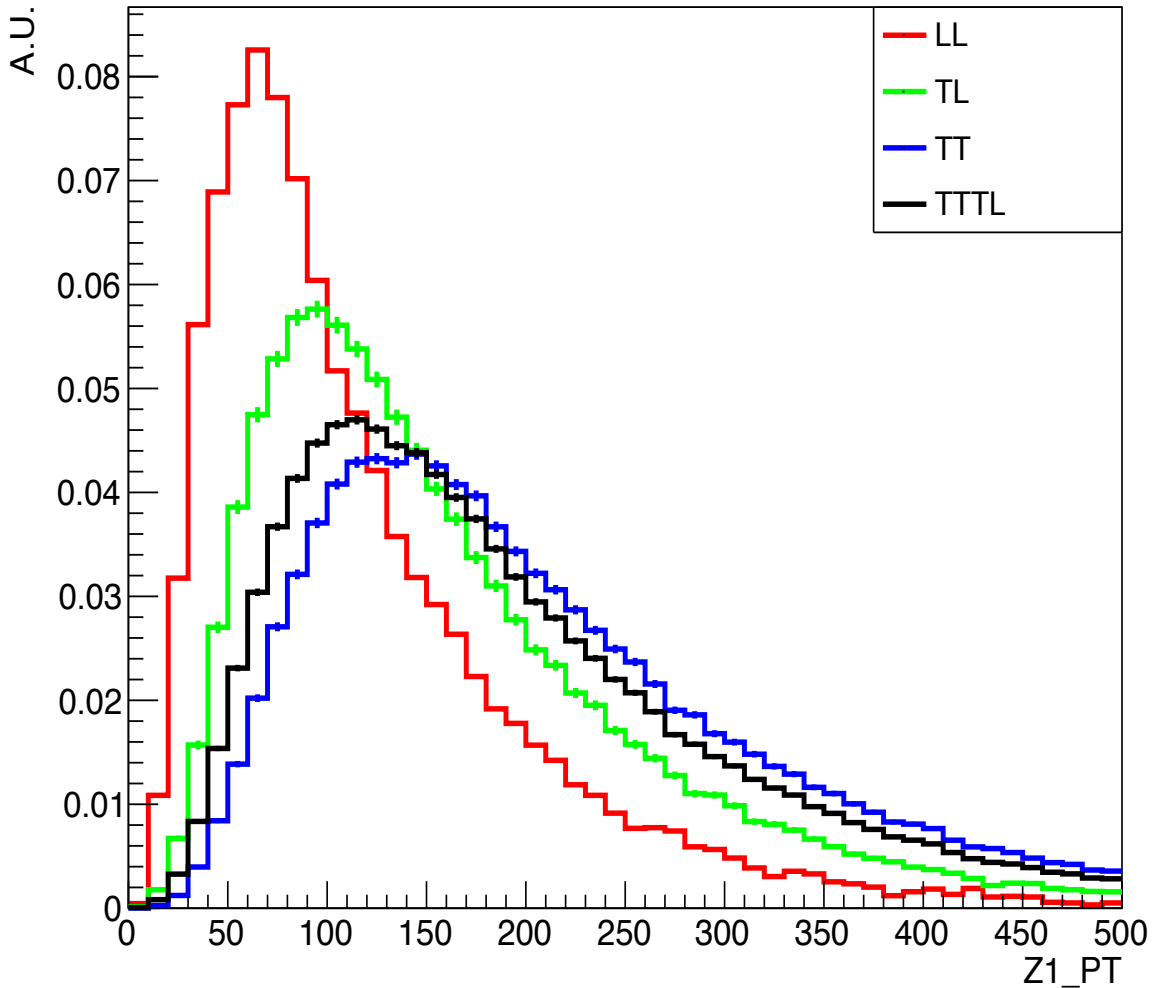
SSWW ROC



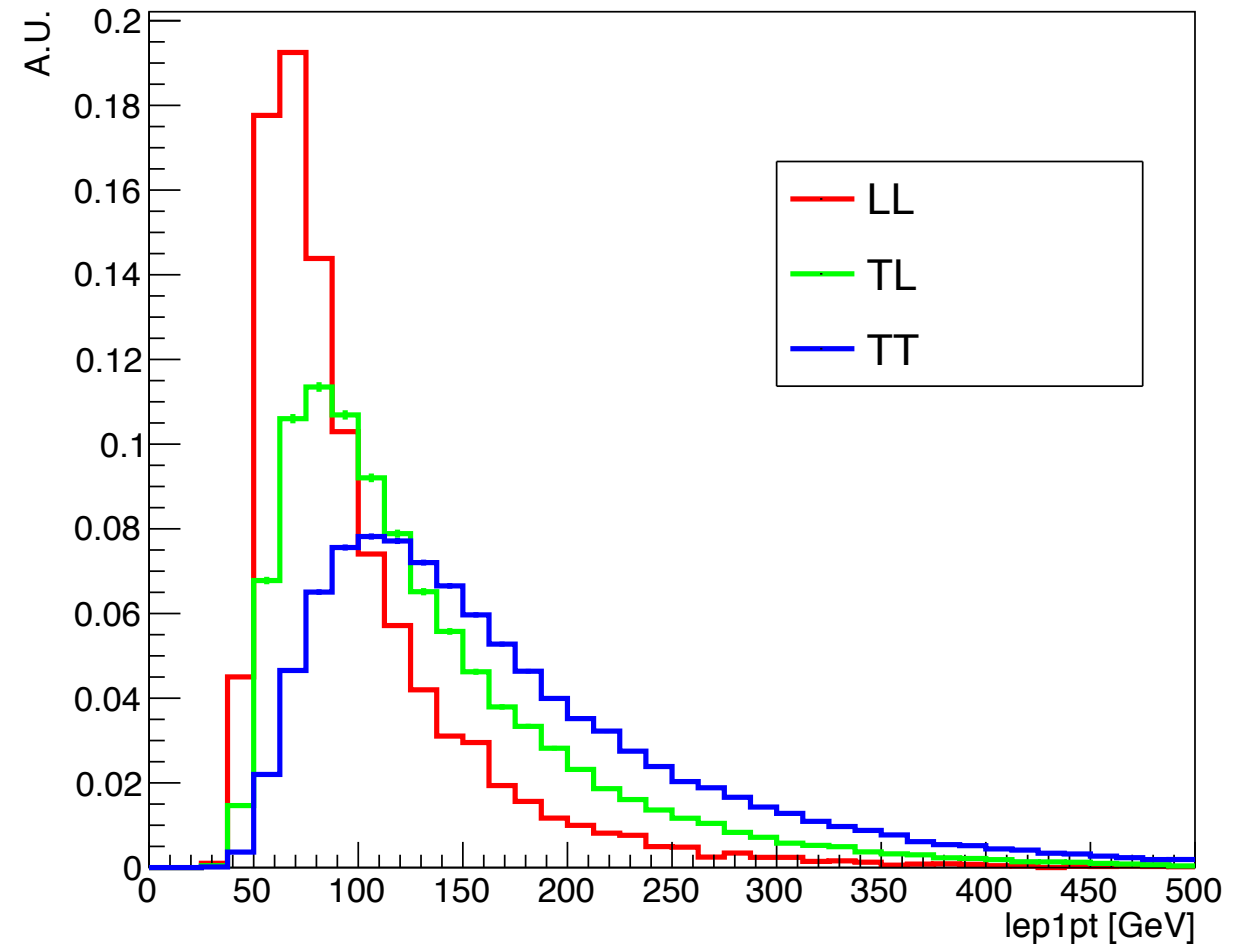
	AUC
DNN Gradual :	0.788
DNN Sequential :	0.762
BDT :	0.776
Lep1pt :	0.666
Dphijj :	0.591

# VBS ZZKinematic distribution : Z1\_PT, lep1pt

Z1\_PT



lep1pt

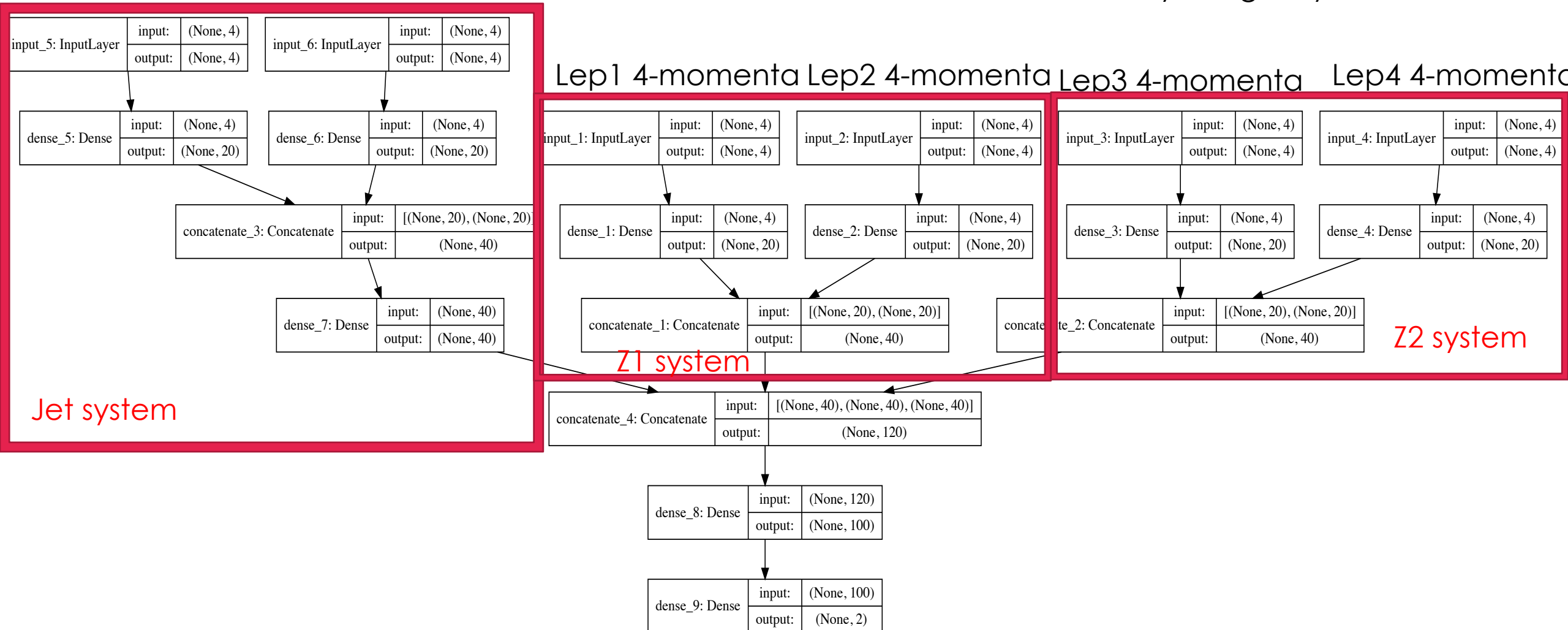


# Particle-based DNN

- Separate inputs by particle
- Gradually merge layers

Jet1 4-momenta Jet2 4-momenta

Lep1 4-momenta Lep2 4-momenta Lep3 4-momenta Lep4 4-momenta



# Particle-based DNN

arxiv: 1812.07591

VBS Same-sign WW study

