



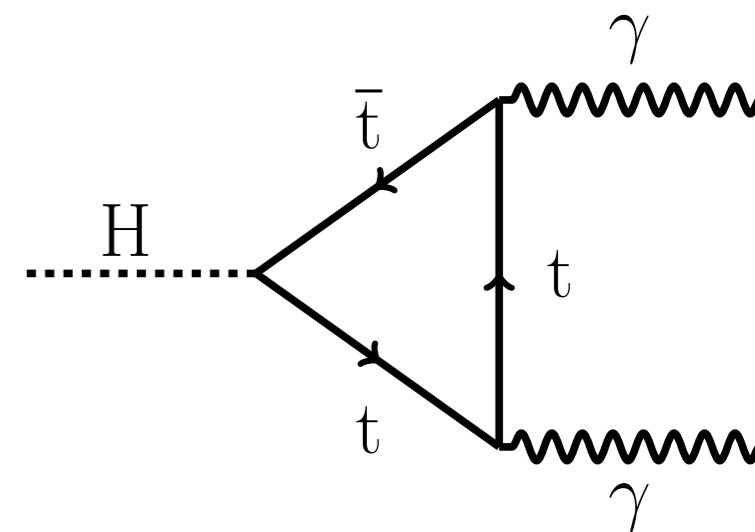
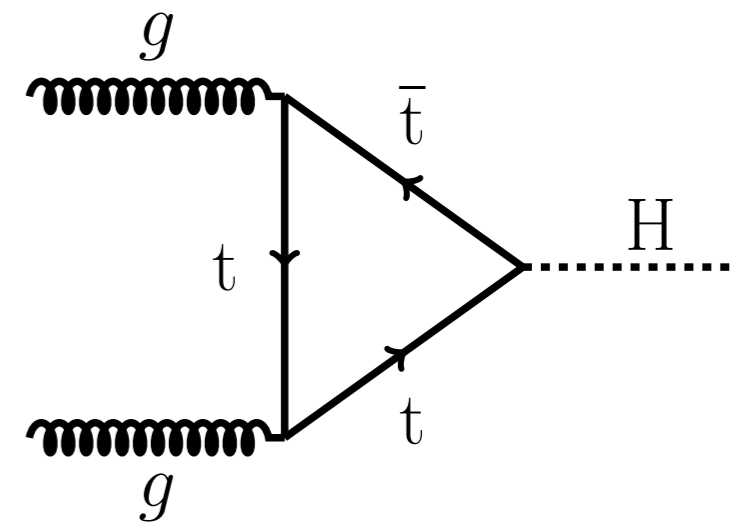
# Searches for $t\bar{t}H(bb)$ production

Gregor Kasieczka for the CMS Collaboration  
Higgs Couplings 2016



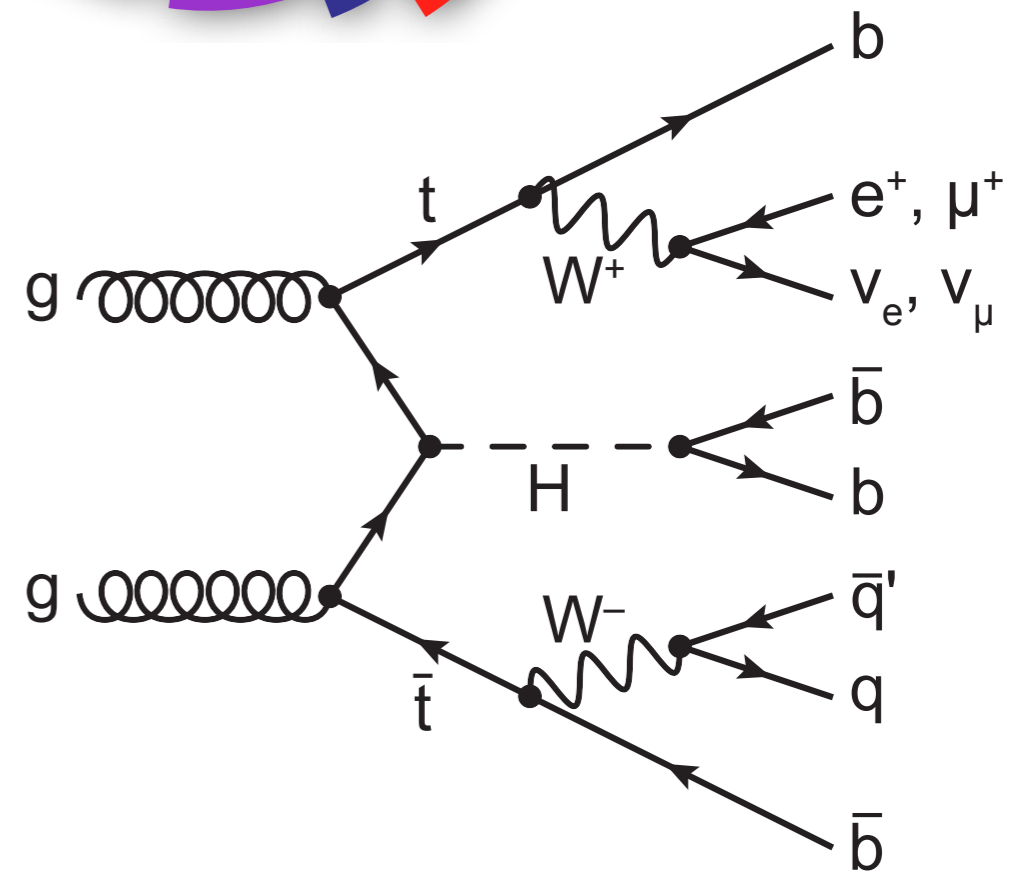
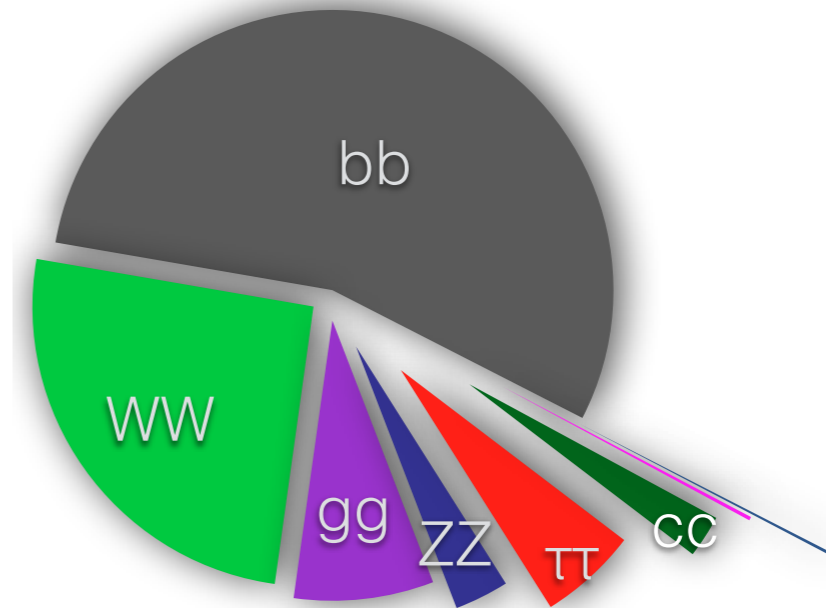
# Why $t\bar{t}H$ ?

- Large top quark mass:
  - expect top quark Yukawa ( $Y_t$ ) coupling to be of order one
  - too large to observe Higgs-to-top decay
- $Y_t$  also contributes to
  - fermion loop in H production from gluons
  - H decay to photons
- But due to potential BSM physics contributing to the loop they can't be used to measure  $Y_t$  directly
- $t\bar{t}H$  allows direct measurement of  $Y_t$ 
  - Deviation from SM prediction could hint at heavy top-partners



# Why $H(bb)$ ?

- Advantages:
  - Highest branching fraction
  - Fermion-only production and decay
- Disadvantages:
  - complicated final state
  - large backgrounds
  - irreducible  $t\bar{t}bb$  background has large theory uncertainties



# Overview

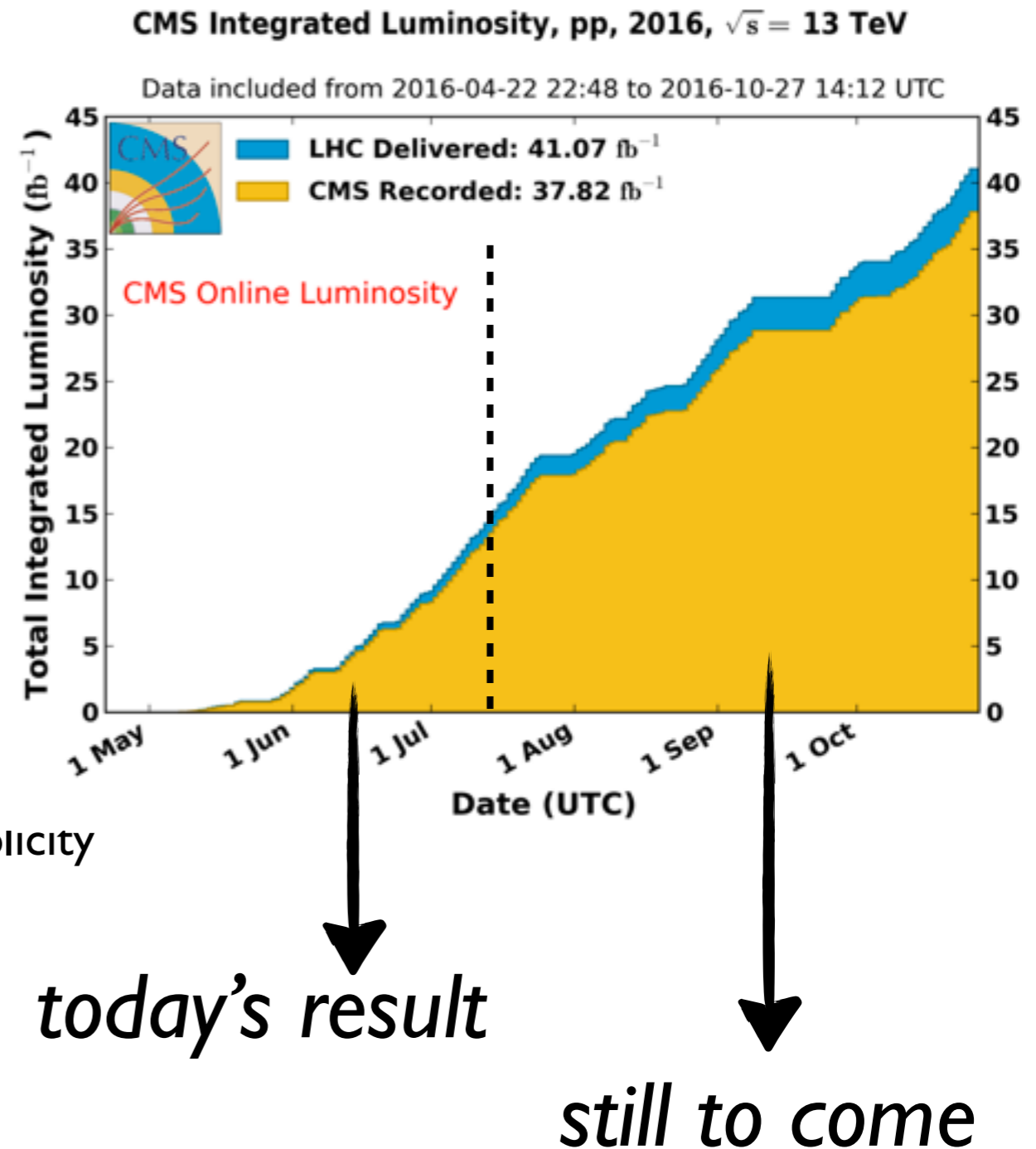
- Up to **12.9 fb<sup>-1</sup>** at 13 TeV
- Details: CMS PAS HIG-16-038
- Strategy:
  - I. Select events compatible with  $tt \rightarrow \text{dilepton} / \text{lepton} + \text{jets}$  and  $H \rightarrow bb$  decay
  - II. Categorize according to jet and b-tag multiplicity
  - III. Discriminate between signal/background with BDTs and MEM
  - IV. Extract limit by combined fit to data in all categories

# I: Event Selection

- Jets: anti- $k_T$  ( $R=0.4$ ) using CHS input
  - $\geq 4$  with  $p_T > 30$  GeV for Lepton+Jets
  - $\geq 2$  with  $p_T > 30$  GeV ( $p_T > 20$  GeV subleading) for Dilepton
- Leptons:
  - Exactly one electron ( $p_T > 30$  GeV) OR muon ( $p_T > 25$  GeV) for Lepton+Jets
  - Exactly two opposite-sign leptons. Leading  $p_T > 25$  GeV sub-leading  $p_T > 15$  GeV
- Corrections:
  - Pile up reweighting
  - Lepton scale factors
  - Jet energy scale and resolution corrections
  - b-tag discriminator

# I: Samples

- Data:
  - Lepton+Jets:  $12.9 \text{ fb}^{-1}$
  - Dilepton:  $12.9 \text{ fb}^{-1}$  ( $\mu\mu, e\mu$ ) /  $11.4 \text{ fb}^{-1}$  ( $ee$ )
- Signal and  $t\bar{t}$  background MC:
  - Powheg Box V2 + Pythia 8
  - New CMS tune: CUETP8M2T4
    - $\alpha_{\text{ISR}} = 0.118$  and  $h_{\text{damp}} = 272.2$
    - Improves data/MC agreement for jet multiplicity



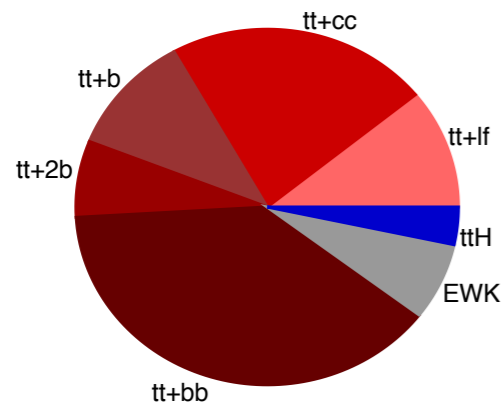
# II: Categories

**CMS**

*Simulation*

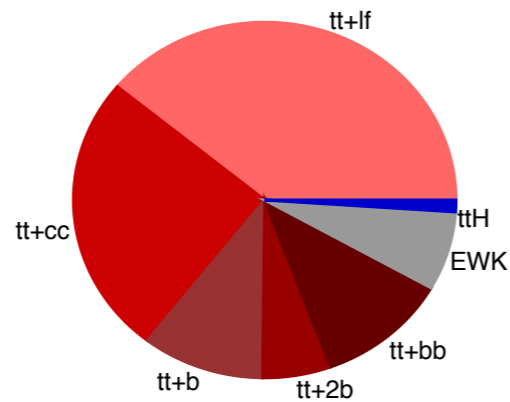
**Lepton+Jets Channel**

**≥ 6 jet, ≥ 4 b-tags**



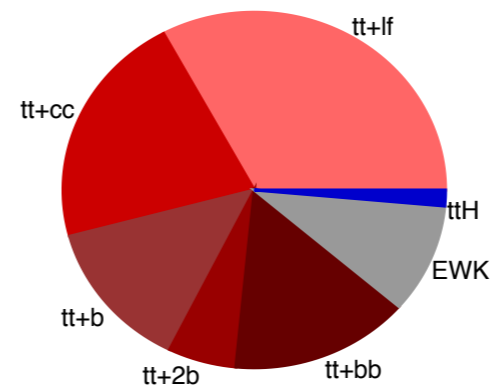
$S/B=0.035, S/\sqrt{B}=0.973$

**≥ 6 jets, 3 b-tags**



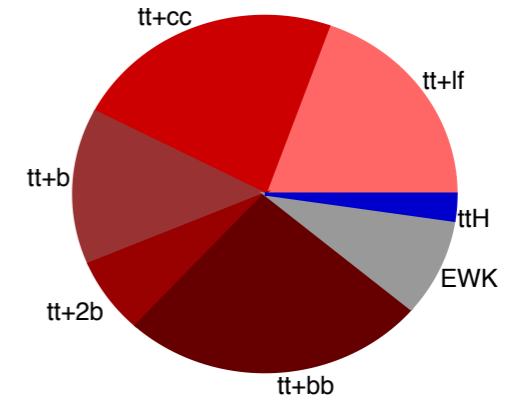
$S/B=0.011, S/\sqrt{B}=0.895$

**4 jets, 4 b-tags**



$S/B=0.015, S/\sqrt{B}=0.242$

**5 jets, ≥ 4 b-tags**



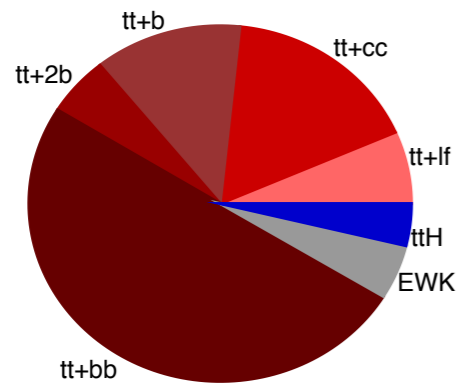
$S/B=0.024, S/\sqrt{B}=0.532$

**CMS**

*Simulation*

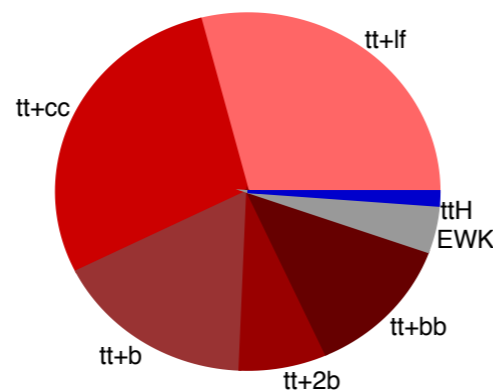
**Dilepton Channel**

**≥ 4 jets, ≥ 4 b-tags**



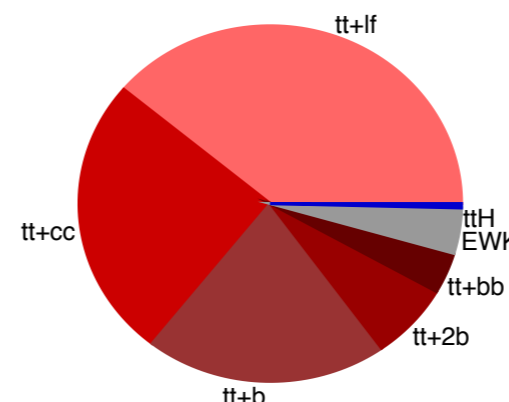
$S/B=0.040, S/\sqrt{B}=0.417$

**≥ 4 jets, 3 b-tags**



$S/B=0.012, S/\sqrt{B}=0.453$

**3 jets, 3 b-tags**



$S/B=0.004, S/\sqrt{B}=0.084$



# III: Boosted Decision Tree

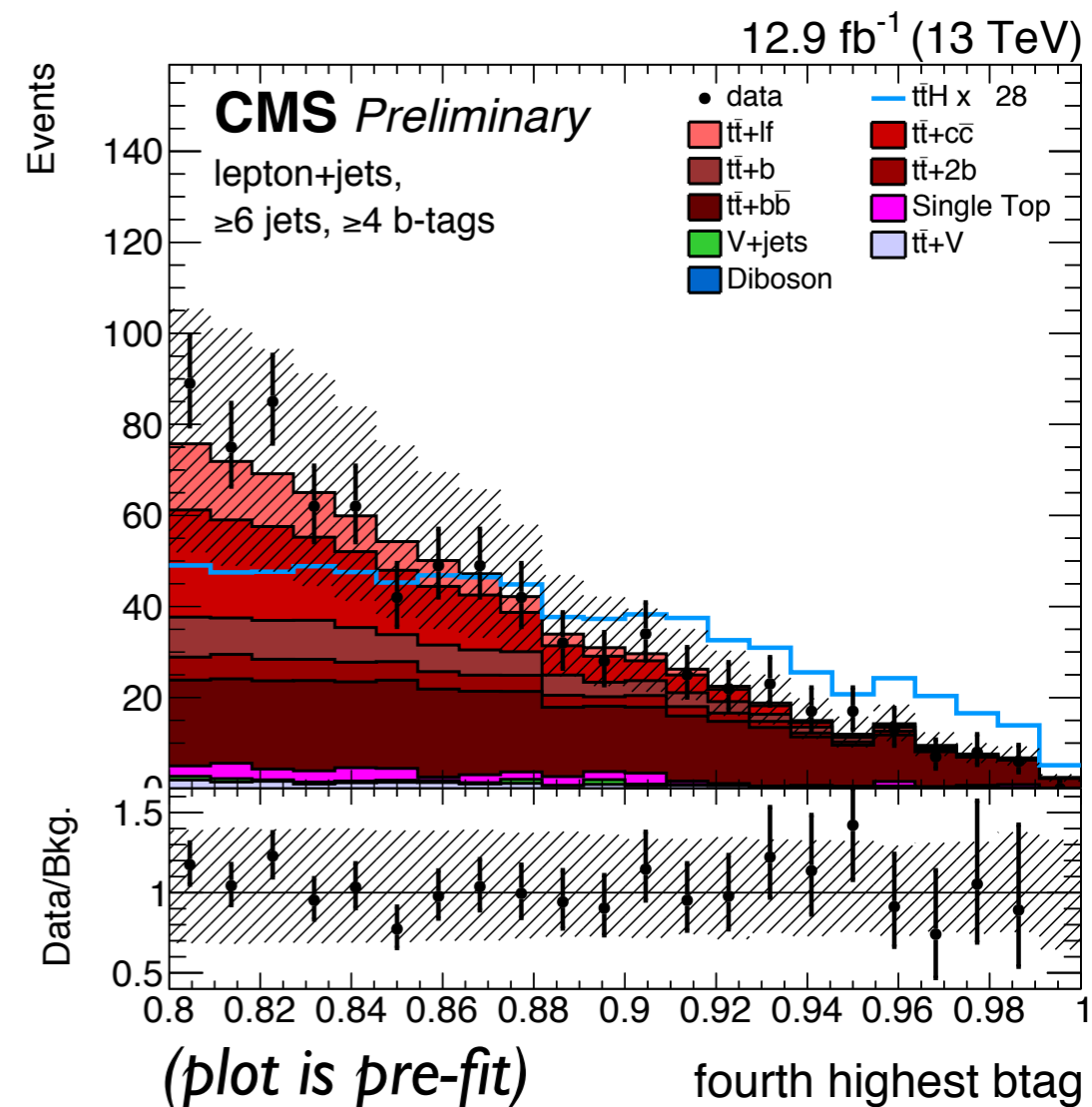
- Gradient boosting decision trees
- Train for  $t\bar{t}H(bb)$  vs sum-of-backgrounds
- Individual training and variable selection for each jet/b-tag category
- Hyperparameters and selection of variables optimized using particle swarm algorithm
- Only consider well modeled variables

*Example:*

BDT input in Lepton+jets  $\geq 6$  jets  $\geq 4$  tags:

- best Higgs mass
- $M_2(\text{tag}, \text{tag})$  closest to 125 GeV
- $M(\text{jets}, \text{lepton}, \text{MET})$
- 4th and 5th highest b-tag discriminator score
- $\sum p_T(\text{jets}, \text{lepton}, \text{MET})$

8





# III: Matrix Element for $t\bar{t}H(bb)$ vs $t\bar{t}bb$

*Numerical integration*
*Momentum conservation*
*Resolution function (allow ISR)*

$$w(\vec{y}|\mathcal{H}) = \sum_{i=1}^{N_a} \int \frac{dx_a dx_b}{2x_a x_b s} \int \prod_{k=1}^8 \left( \frac{d^3 \vec{p}_k}{(2\pi)^3 2E_k} \right) (2\pi)^4 \delta^{(E,z)} \left( p_a + p_b - \sum_{k=1}^8 p_k \right) \mathcal{R}^{(x,y)} \left( \vec{\rho}_T, \sum_{k=1}^8 p_k \right) \times$$

$$g(x_a, \mu_F) g(x_b, \mu_F) |\mathcal{M}_{\mathcal{H}}(p_a, p_b, p_1, \dots, p_8)|^2 W(\vec{y}, \vec{p}),$$

*Parton density functions*
*LO Scattering amplitude (Open Loops)*
*Detector transfer function*

$$P_{s/b} = \frac{w(\vec{y}|t\bar{t}H)}{w(\vec{y}|t\bar{t}H) + k_{s/b} w(\vec{y}|t\bar{t}+b\bar{b})}$$

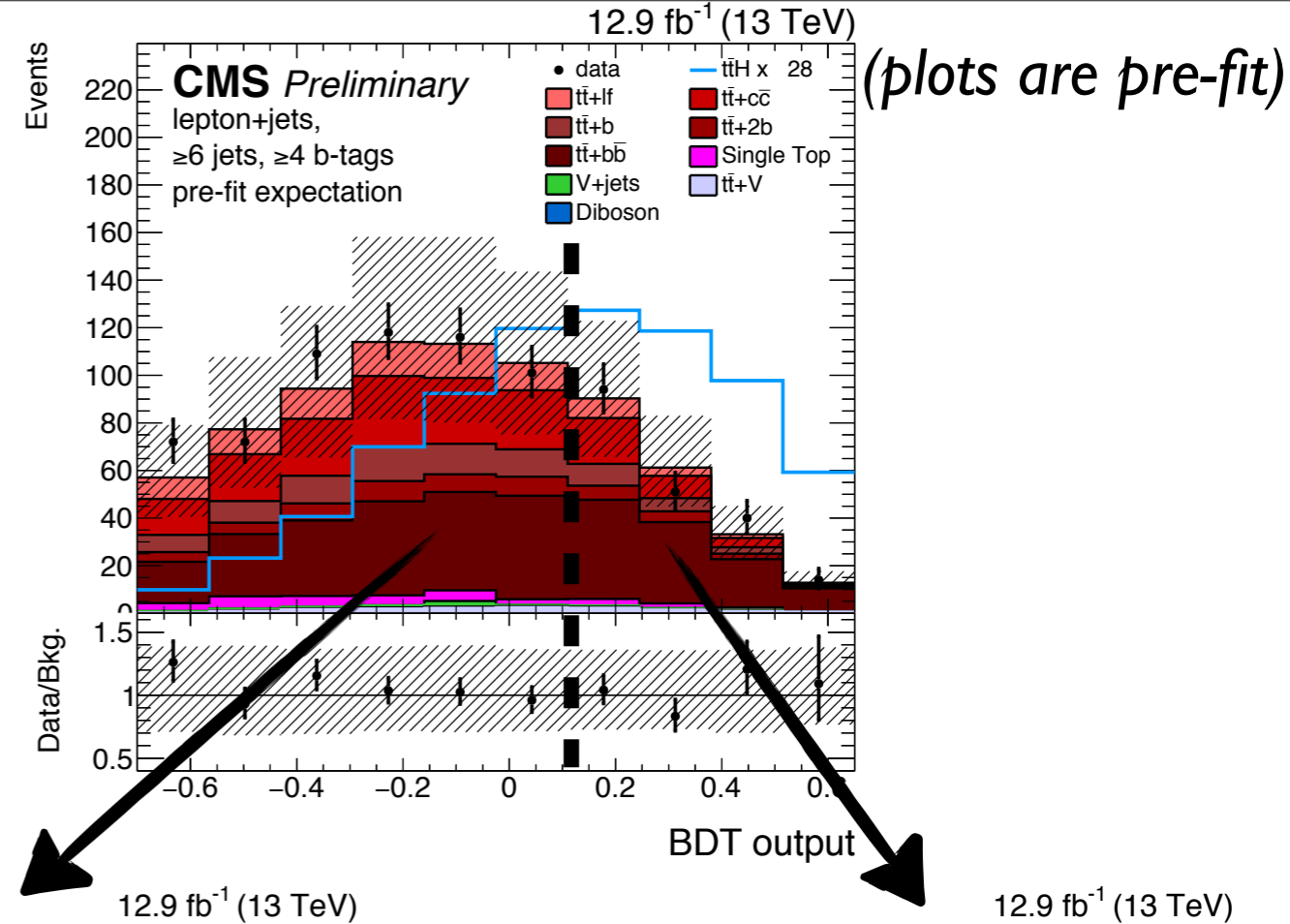
Construct per-event signal/background probability using full kinematic information in an analytical approach

Works best for final states with many reconstructed objects.

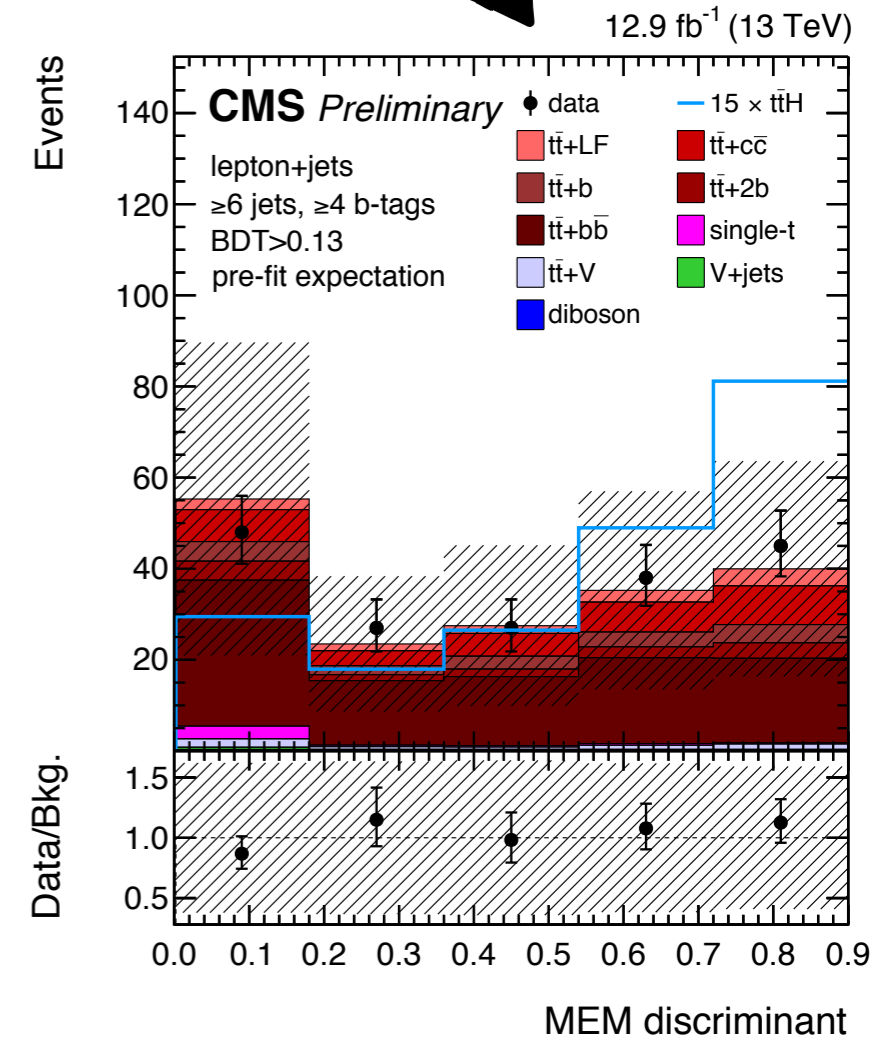
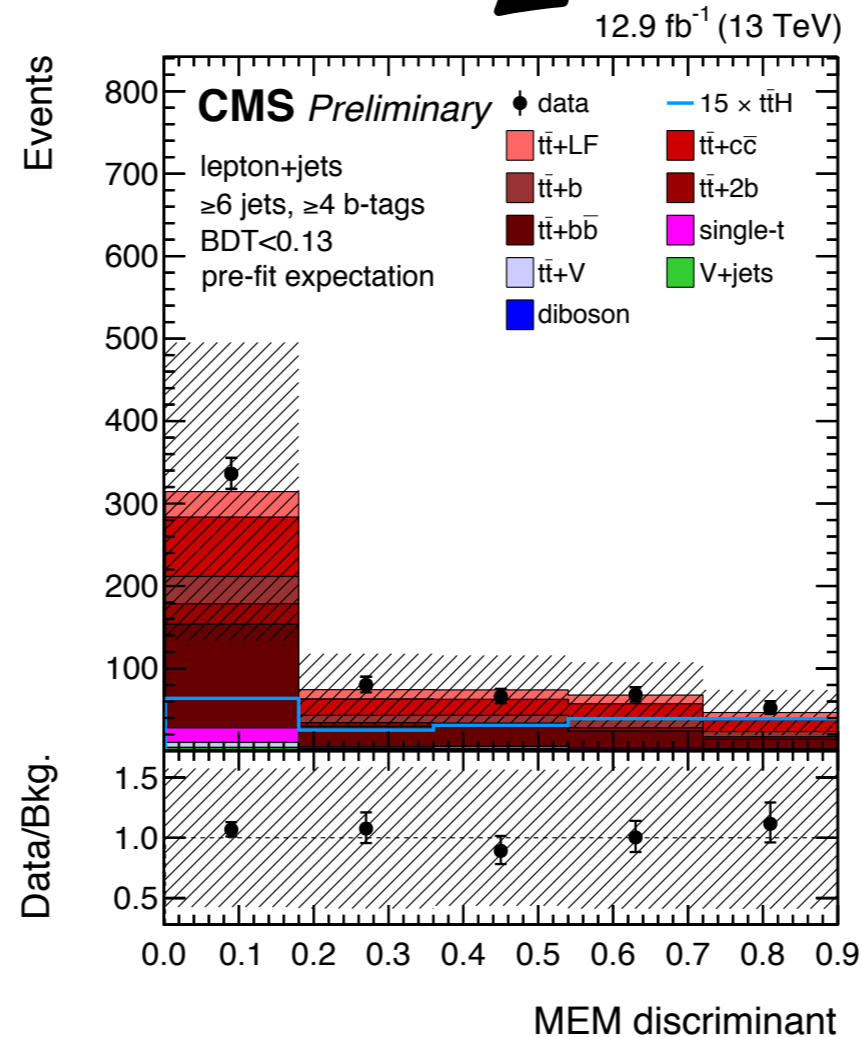
Possible but computationally expensive to *integrate* over missing jets

# IV: Lepton+Jets fit

	4 jets	5 jets	$\geq 6$ jets
3 tags			low/high BDT
$\geq 4$ tags	low/high BDT	low/high BDT	low/high BDT



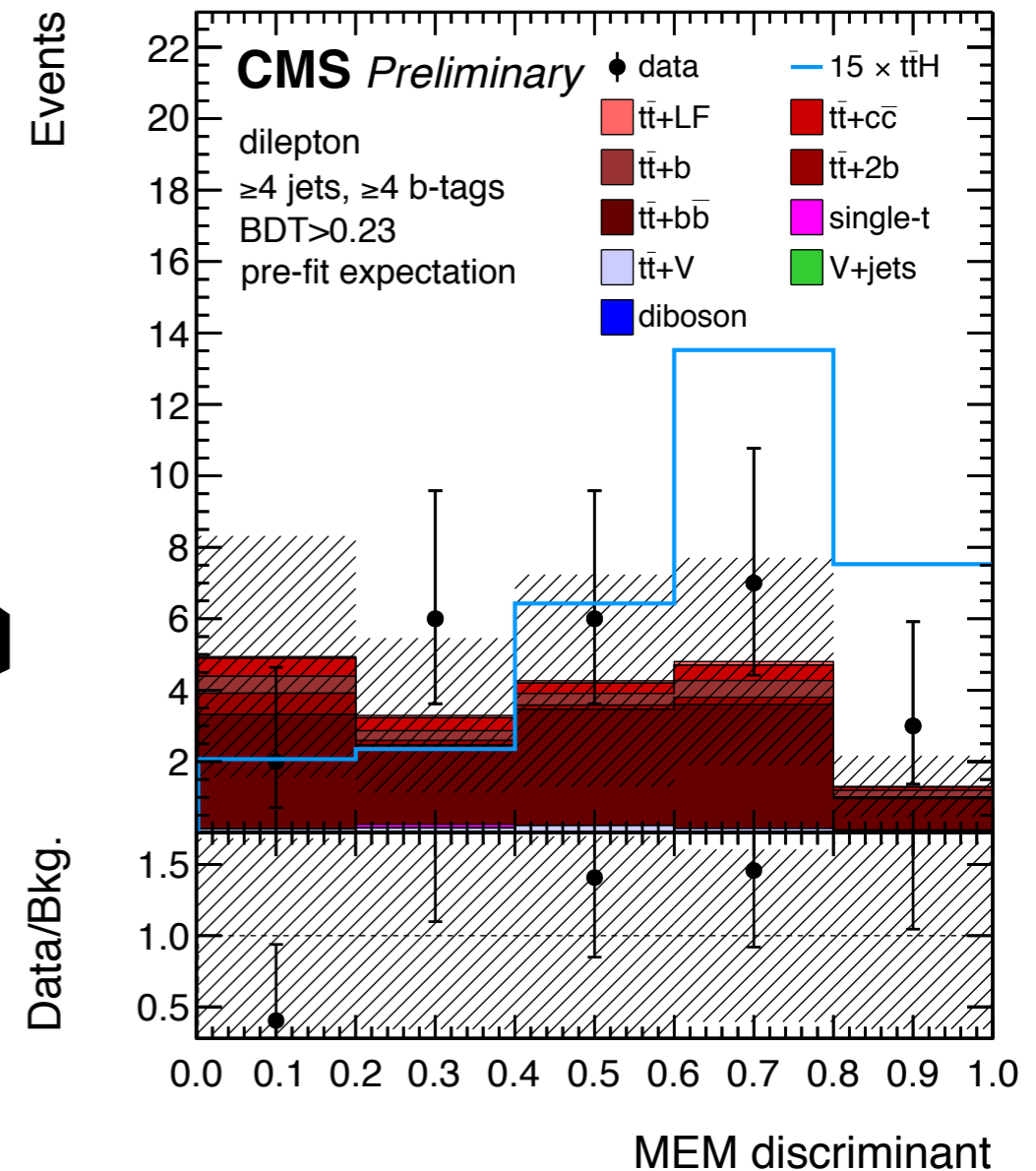
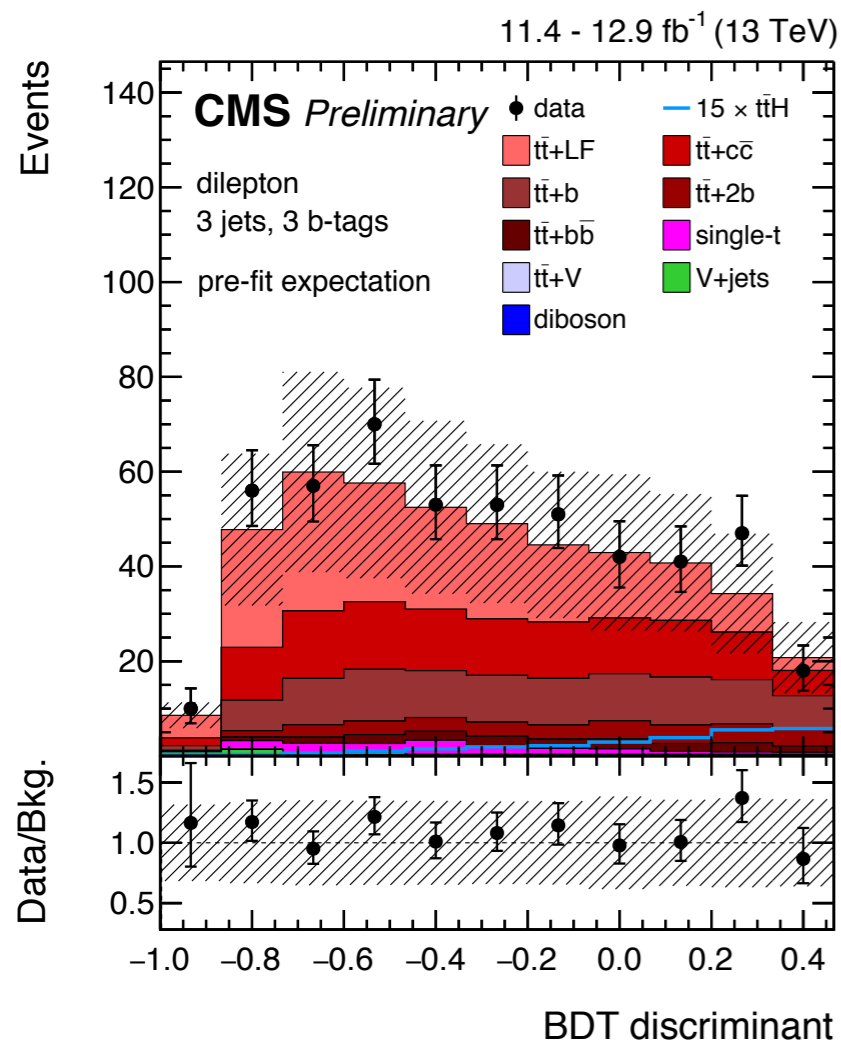
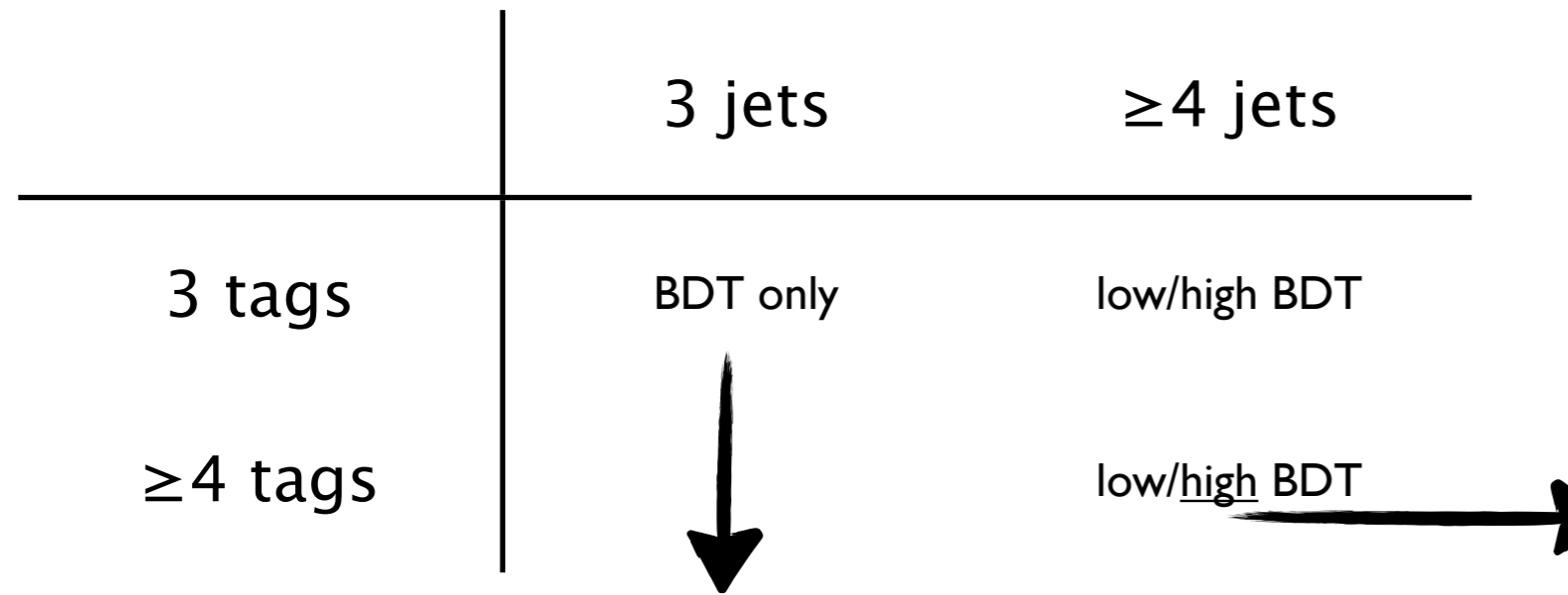
- Divide events by jet/tag multiplicity
- Subdivide by low/high BDT
- Fit MEM discriminant



# IV: Dilepton fit

(plots are pre-fit)

11.4 - 12.9 fb<sup>-1</sup> (13 TeV)

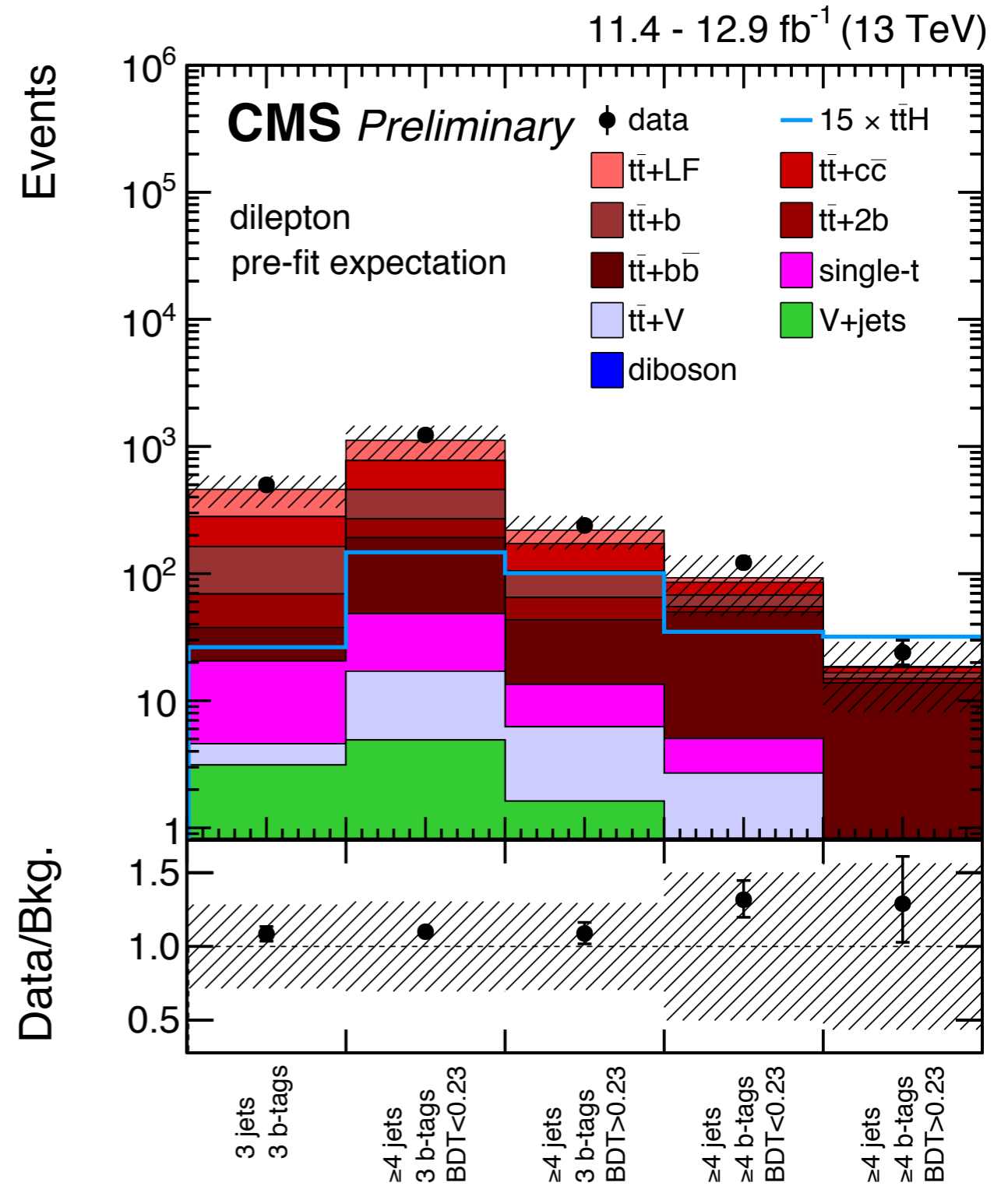
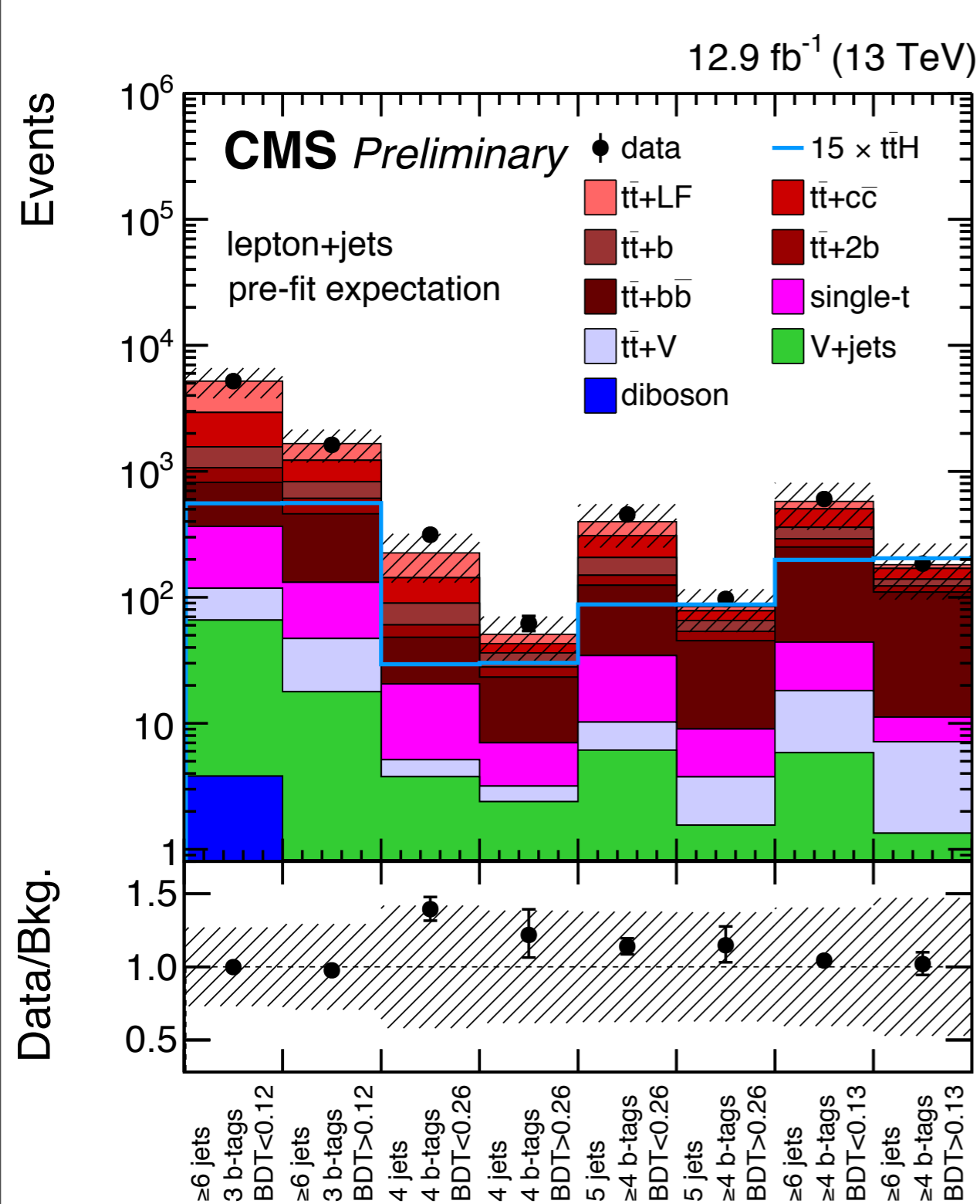


- Divide events by jet/tag multiplicity
- Subdivide by low/high BDT
- Fit MEM discriminant (except 3 jets/3 tags)

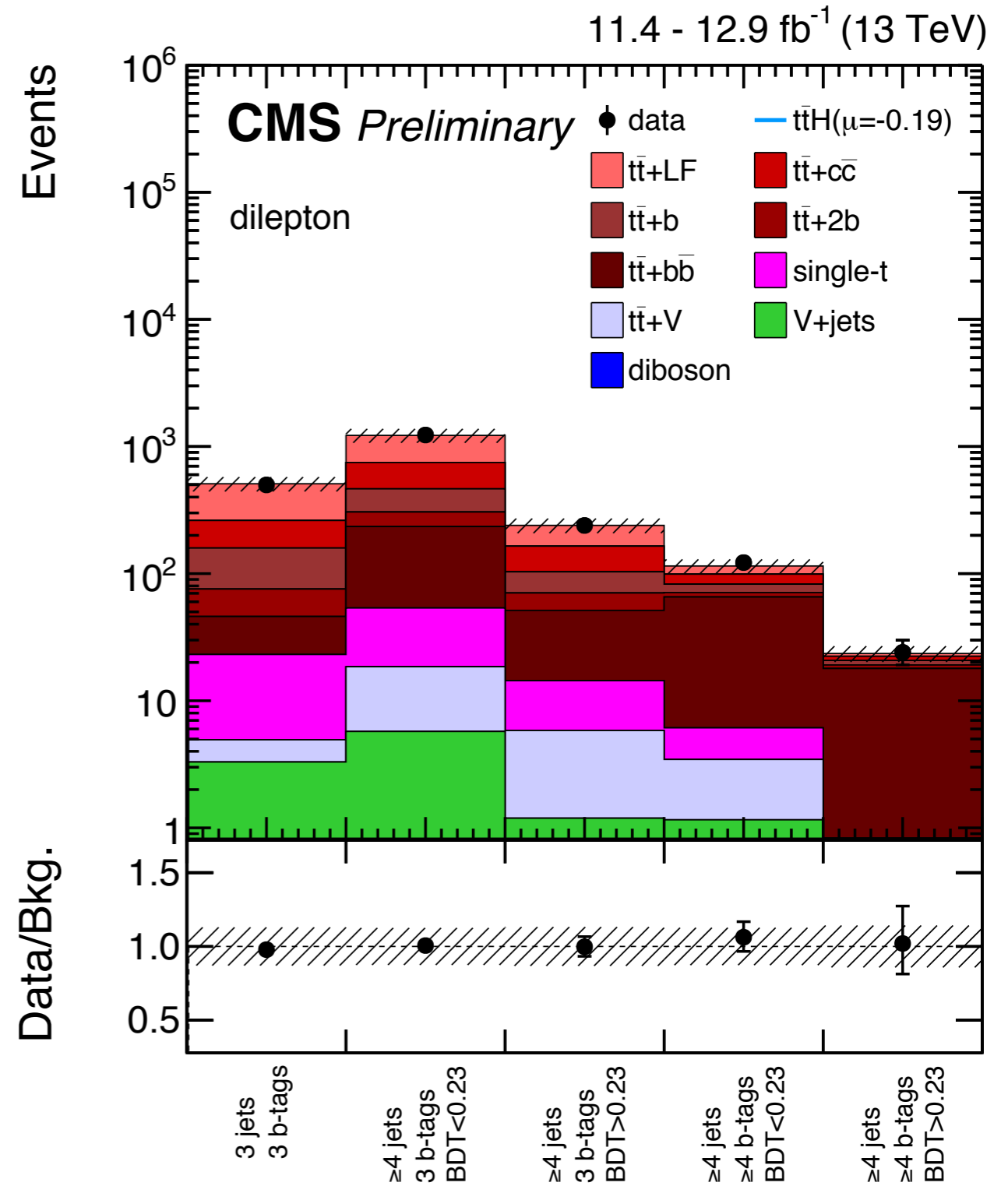
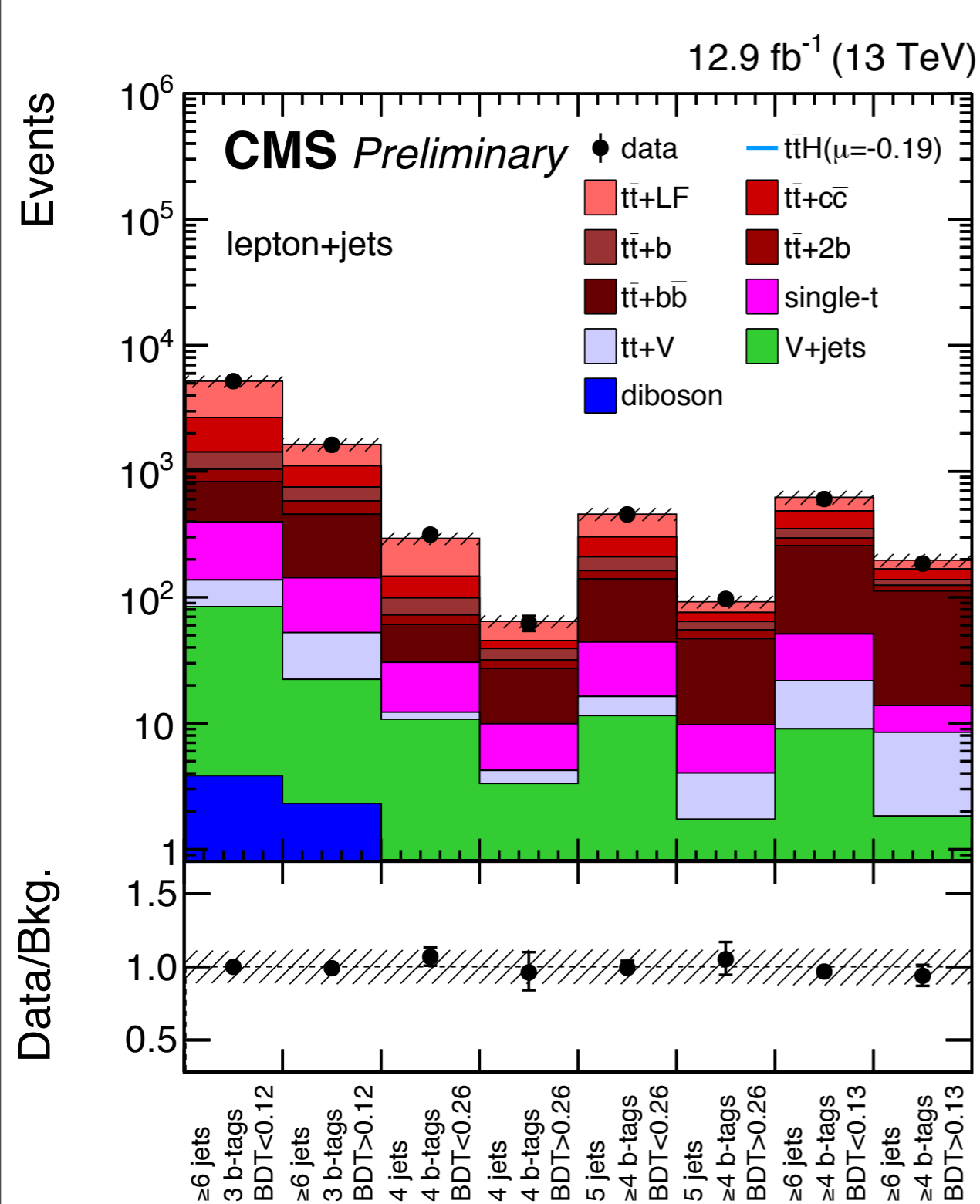
# Systematics

- Shape uncertainties
  - b-tag discriminator
  - JES and JER
  - Lepton ID/Isolation, Trigger efficiency, Pile up,  $Q^2$  scale,
- Rate uncertainties
  - Normalisation of different processes  
Separate for each  $tt$ +heavy flavour channel
  - PDF for different production channels (gg, qq, qg, ttH)
  - Parton Shower
- MC bin-by-bin statistics

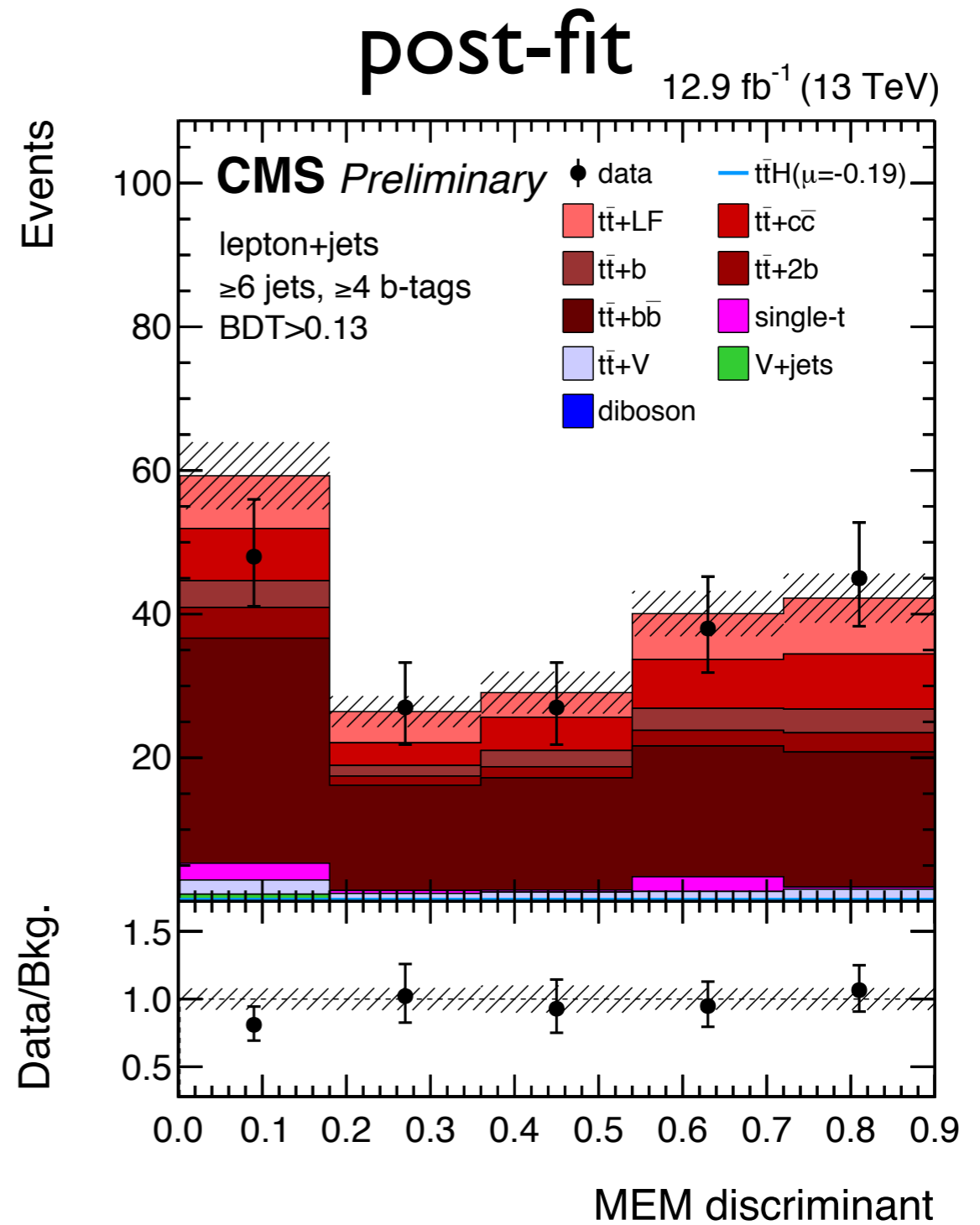
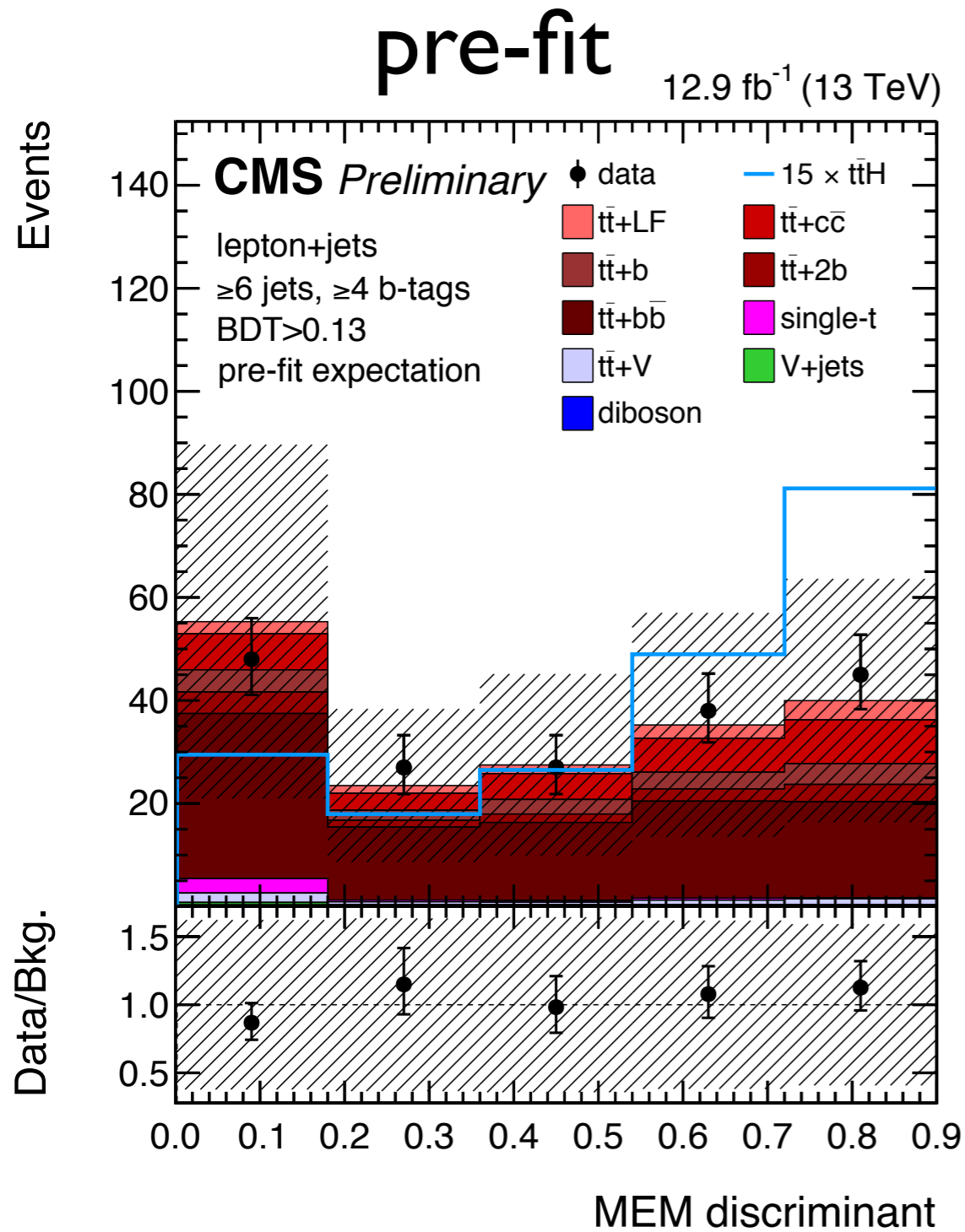
# Yields - Pre Fit



# Yields - Post Fit



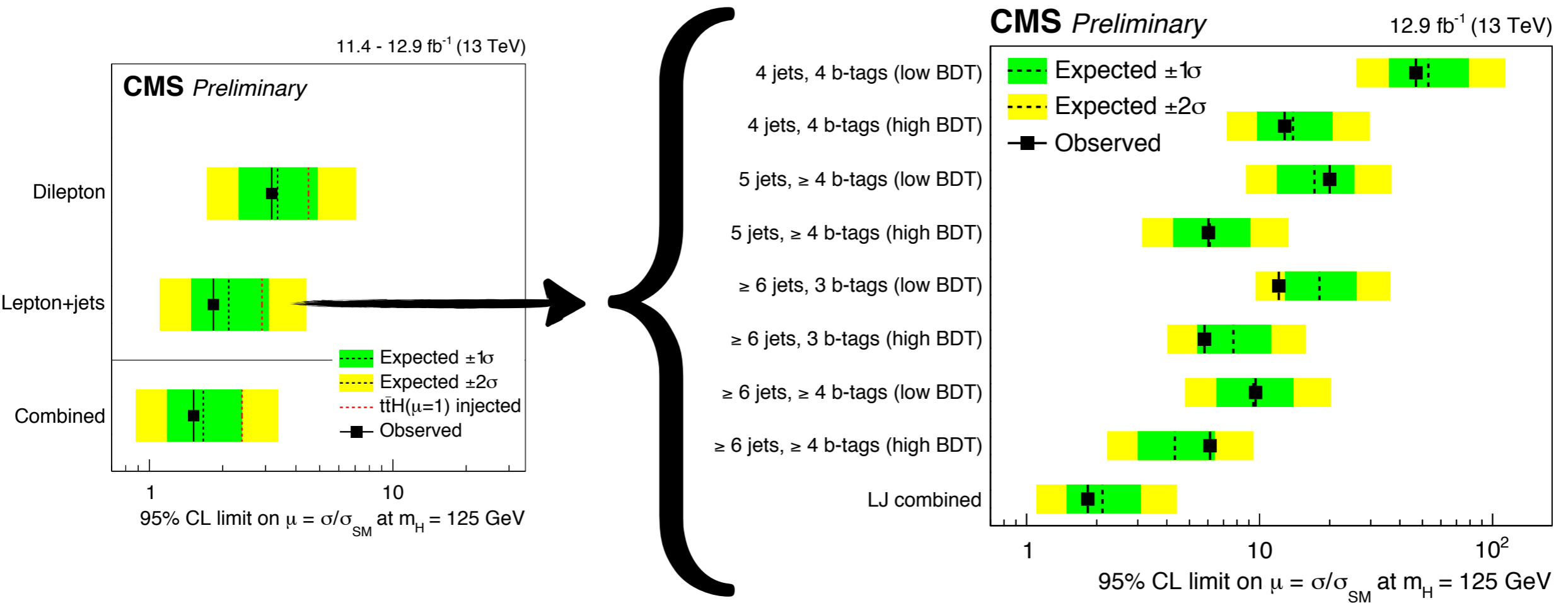
# Lepton + Jets j6 t4, high BDT





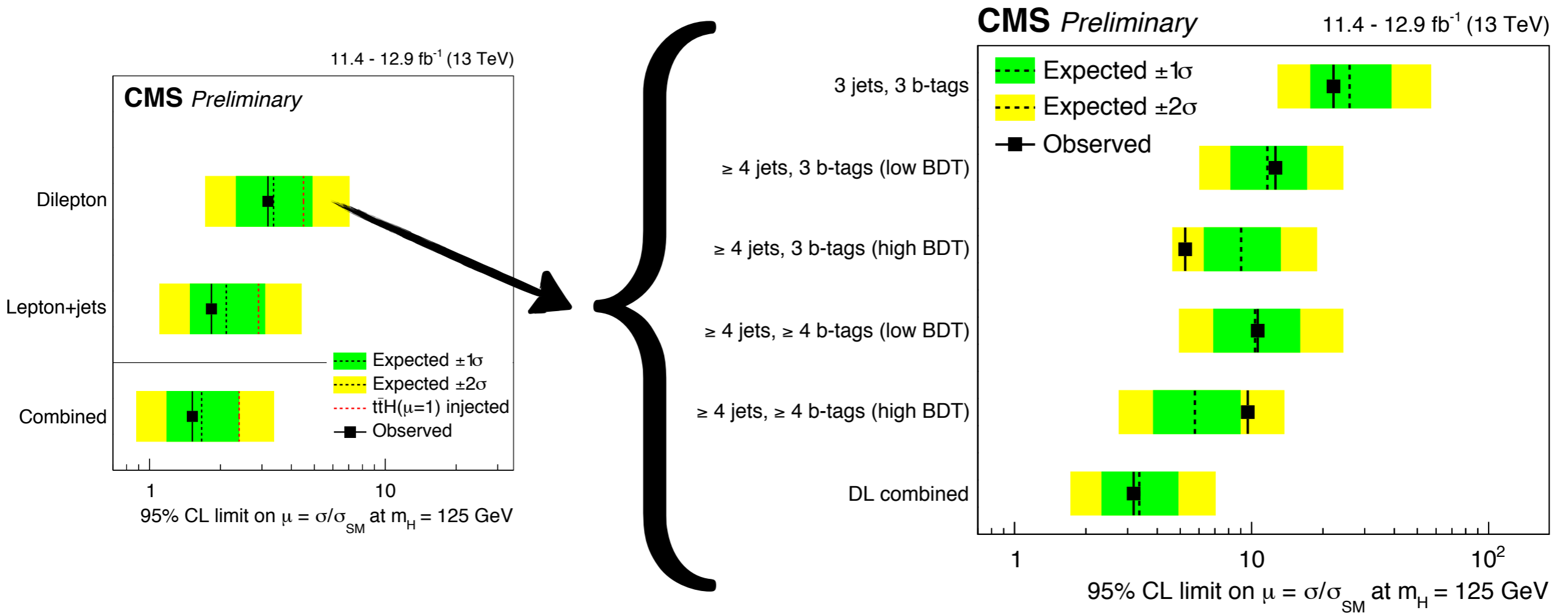


# Lepton+Jets per Category



- High-purity bins provide highest sensitivity (as constructed)
- Most sensitive single category shows upward fluctuation in signal region

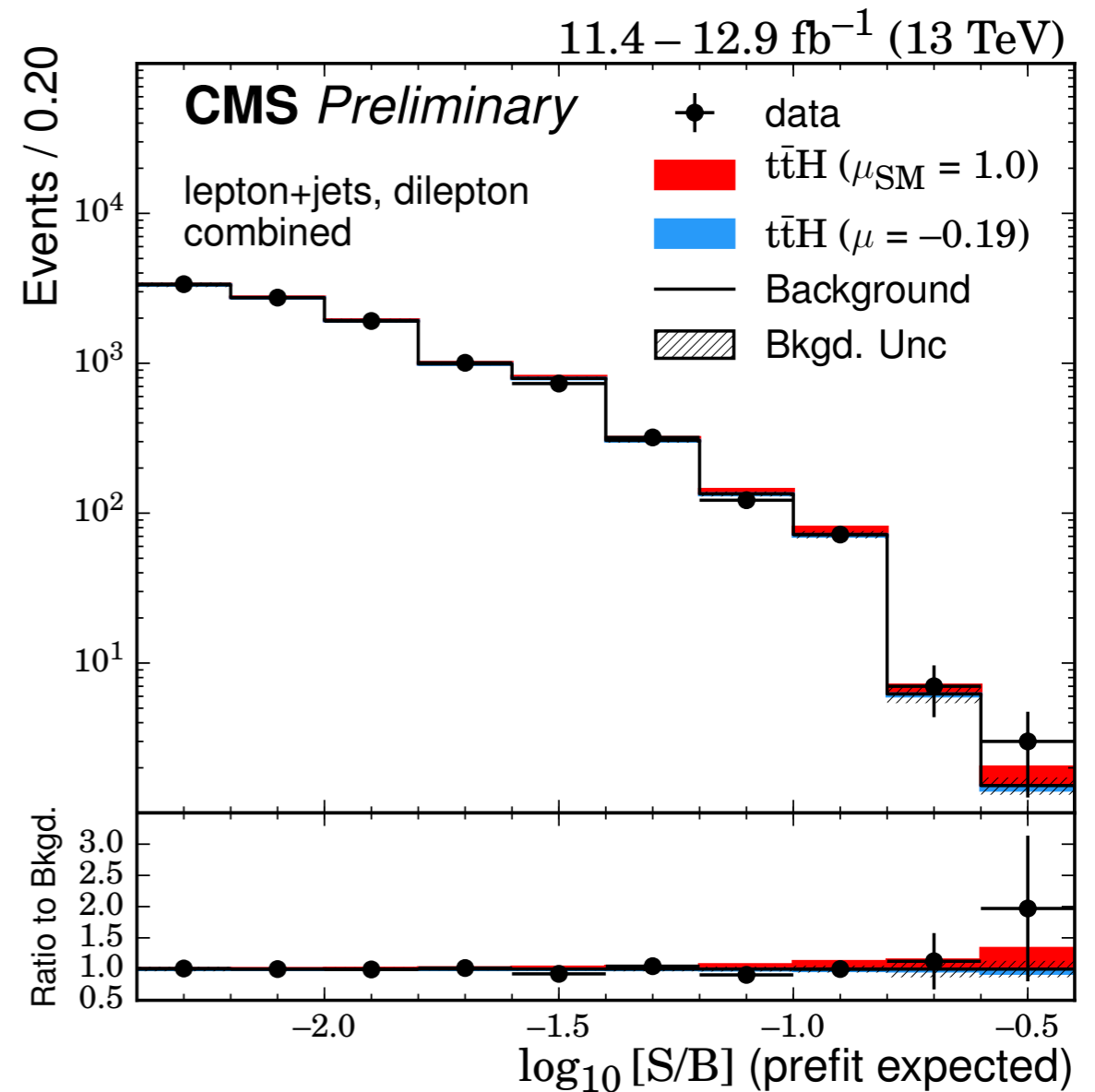
# Dilepton per Category



- High-purity bins provide highest sensitivity (as constructed)
- Most sensitive single category shows upward fluctuation in signal region

# Conclusions

- Update of HIG-16-004 to up to  $12.9 \text{ fb}^{-1}$
- Simple combination of BDT and MEM discrimination techniques
- Observed (expected) upper limit of  $\mu < 1.5$  (1.7) at the 95% confidence level, and a best fit value of  $\mu = -0.19^{+0.80}_{-0.81}$
- Now we need to get back and analyze the  $40 \text{ fb}^{-1}$  on tape
  - Revisit boosted events
  - More complex classifier combination
  - Higher statistics ttbb sample
  - Stay tuned..



*Thank you!*

# Bonus Slides

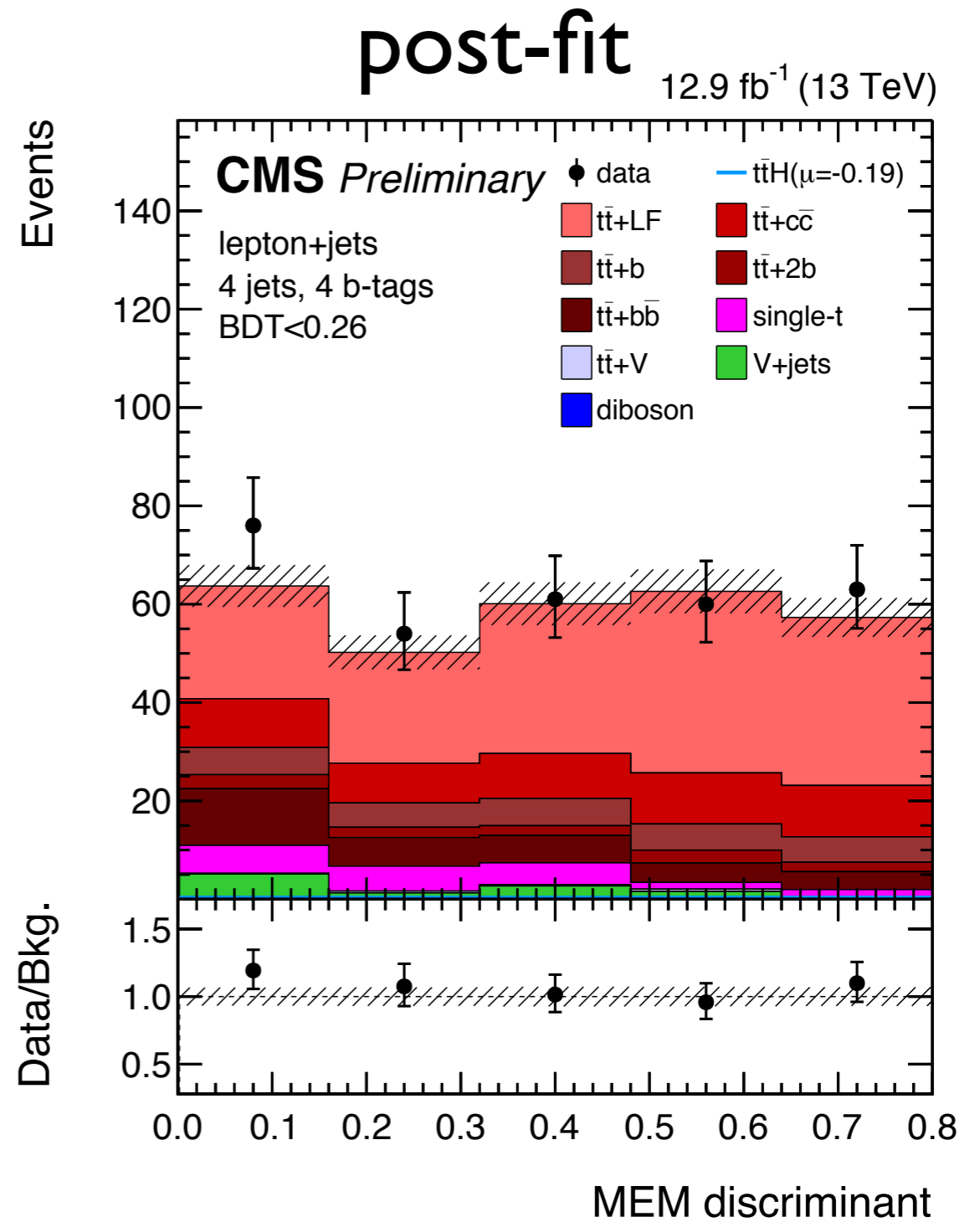
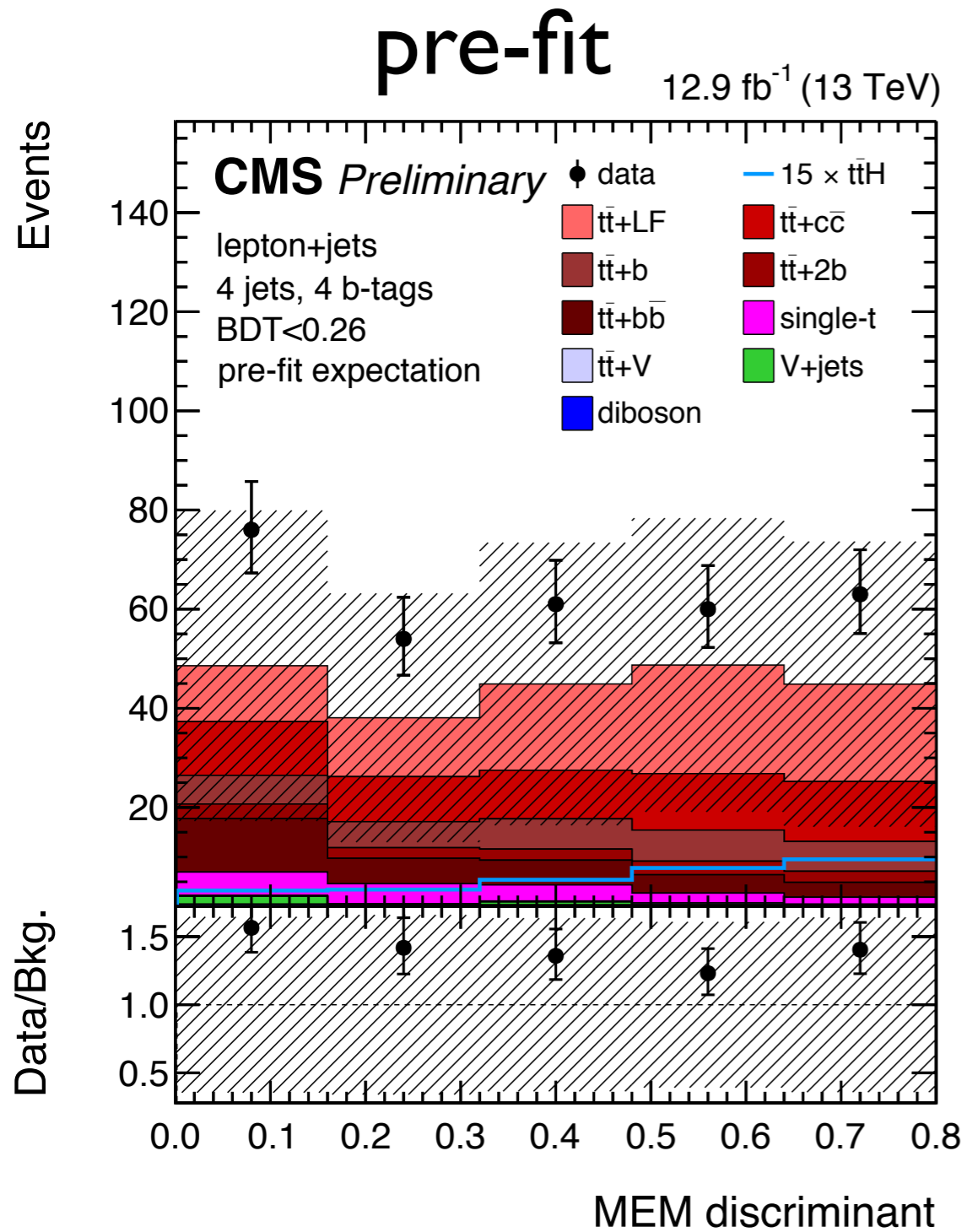
# Particle Swarm

- See: *Particle swarm optimization*,  
J. Kennedy, R. Eberhart  
Proceedings of the IEEE International Conference on Neural Networks, 1995.
- Optimization algorithm
- Different BDT setting (i.e. tree structure and variables) form the search-space
- A specific setting corresponds to one point in this search space
- **Algorithm:**
  - Create swarm of candidate BDTs
  - Each BDT is initialized with a random set of input variables and position in parameter-space
  - Do N iterations
    - Repeatedly train/test at current position.
    - Vary input variables to maximize ROC while  $KS > \text{threshold}$
    - Then the BDTs move to new positions, based on their own and swarms best previous positions

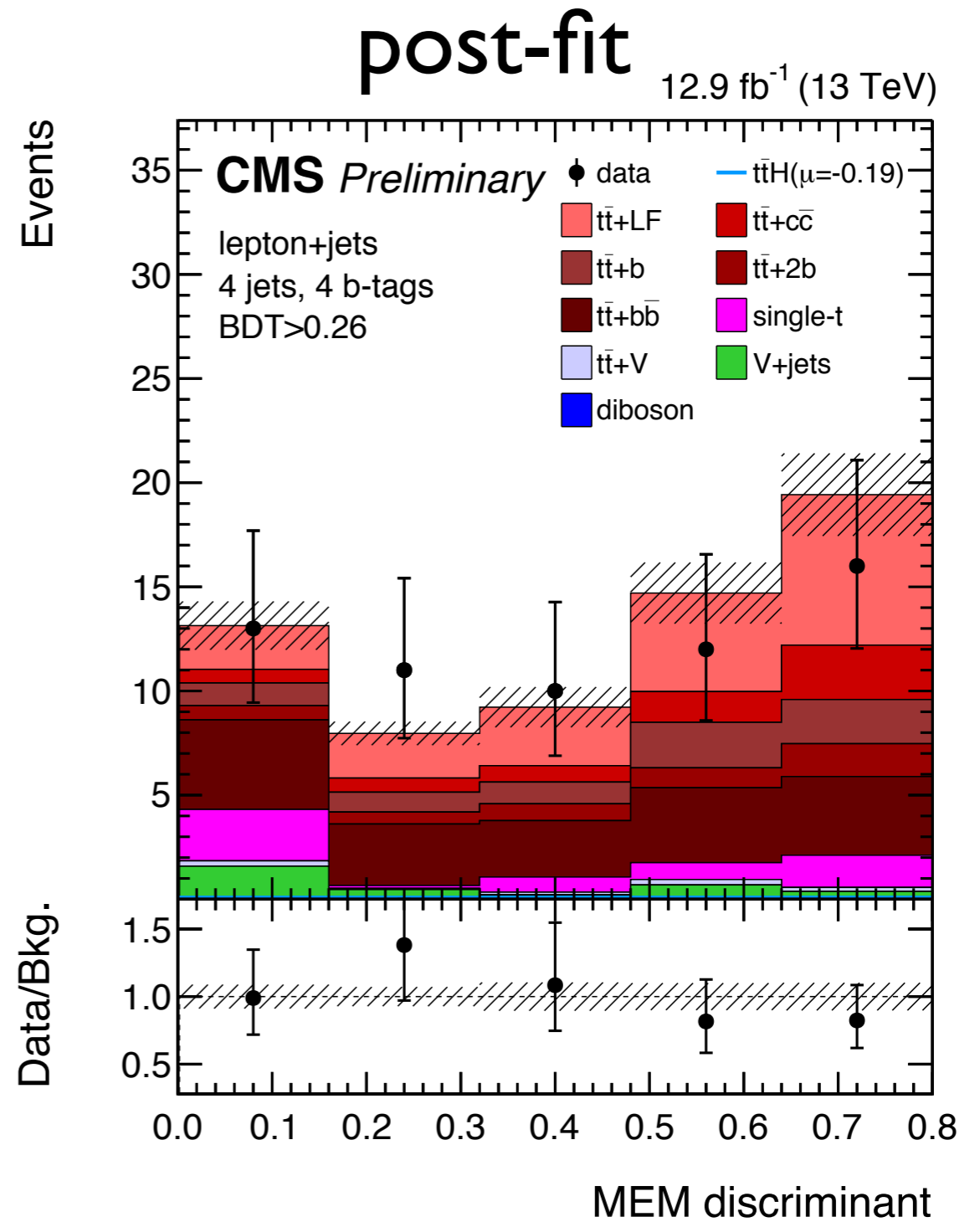
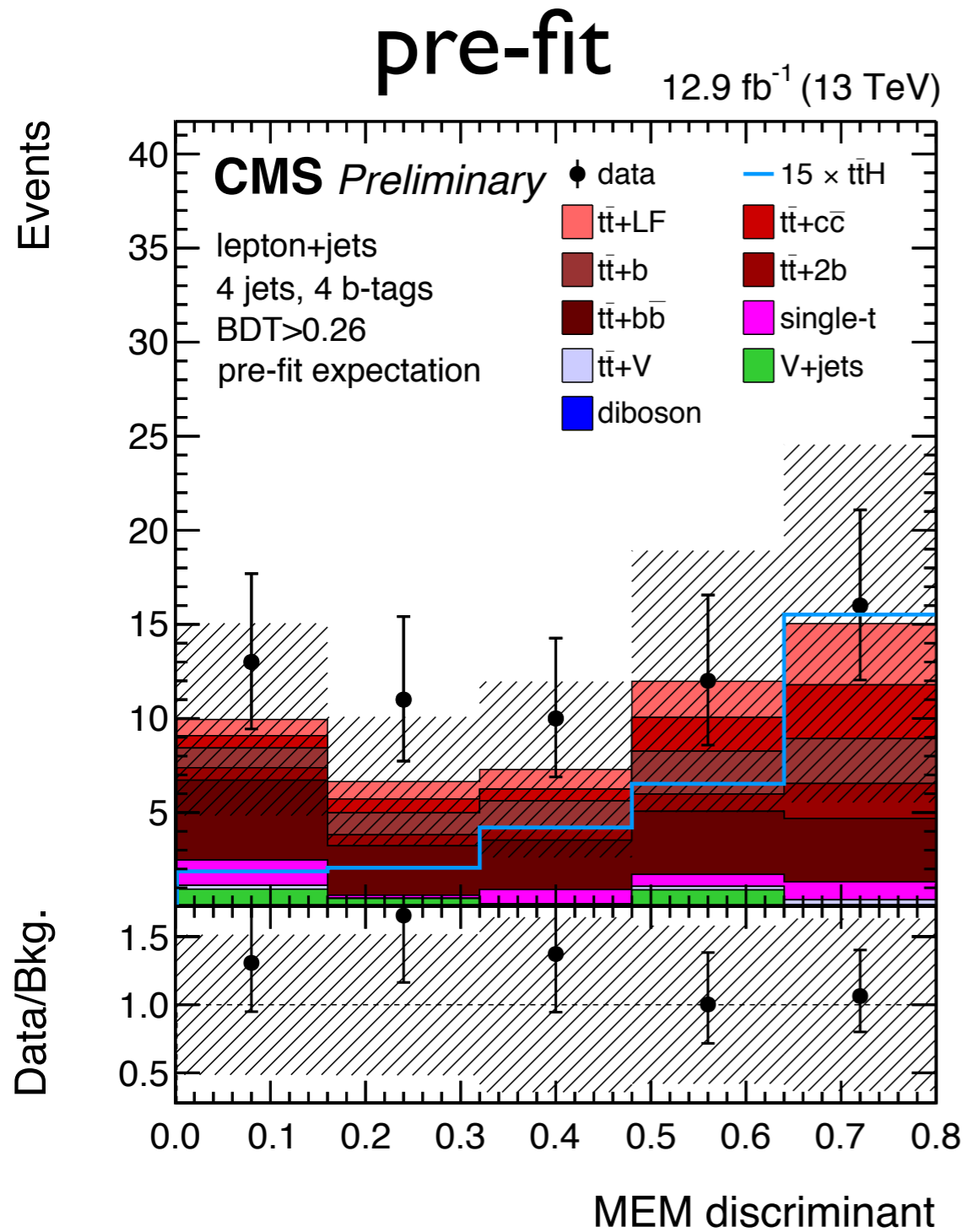
# Final Discriminators

## Lepton+Jets

# Lepton + Jets j4 t4, low BDT

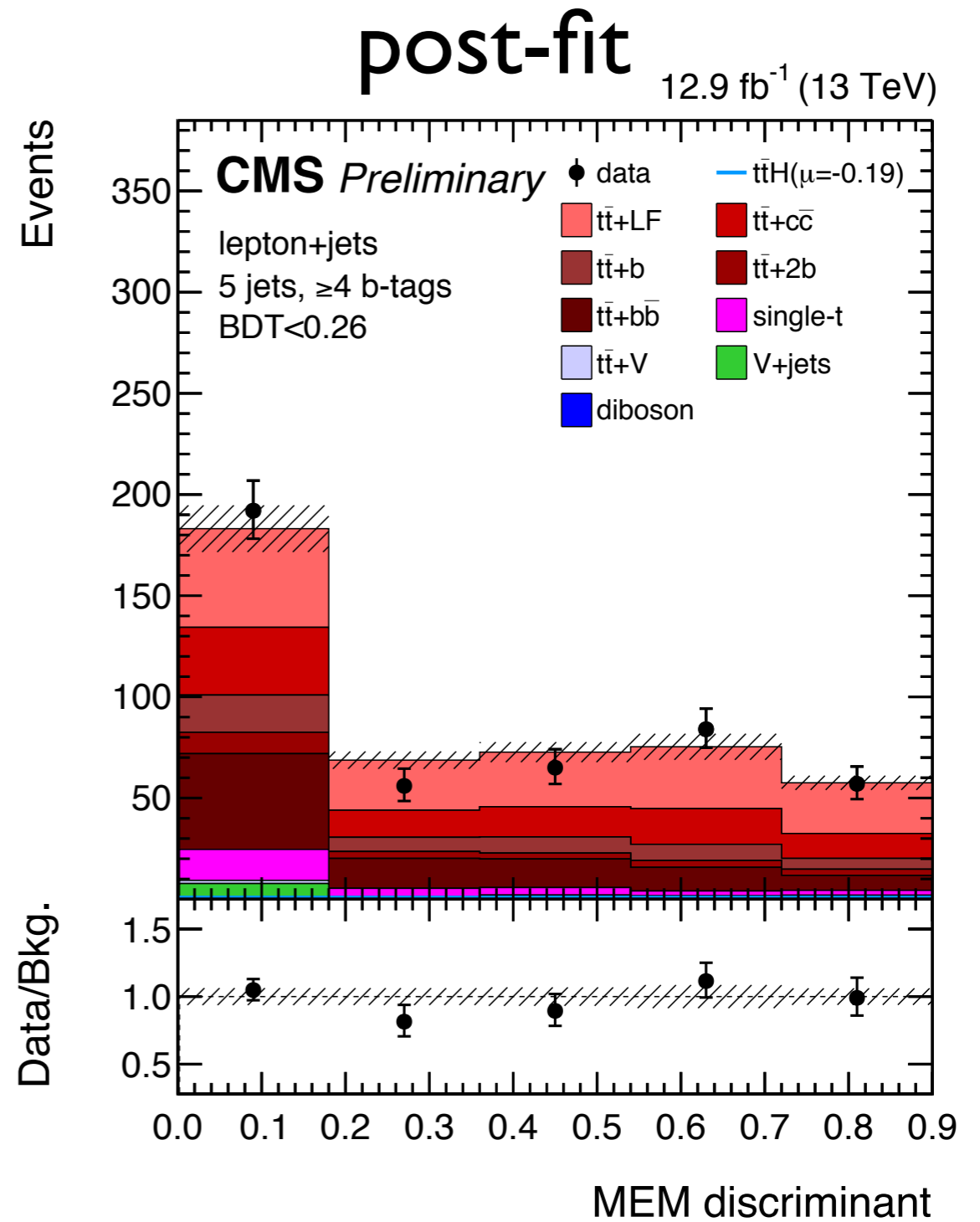
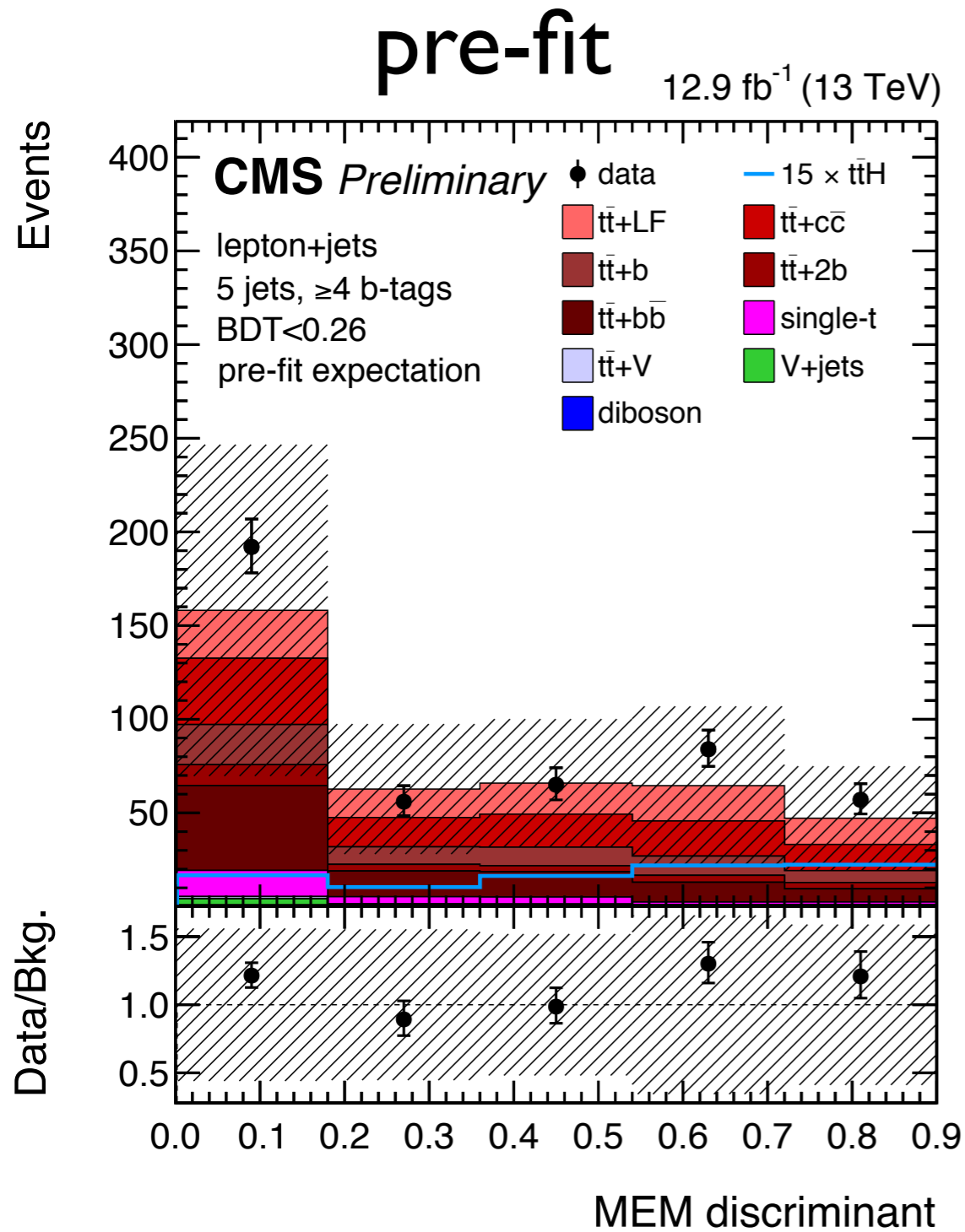


# Lepton + Jets j4 t4, high BDT

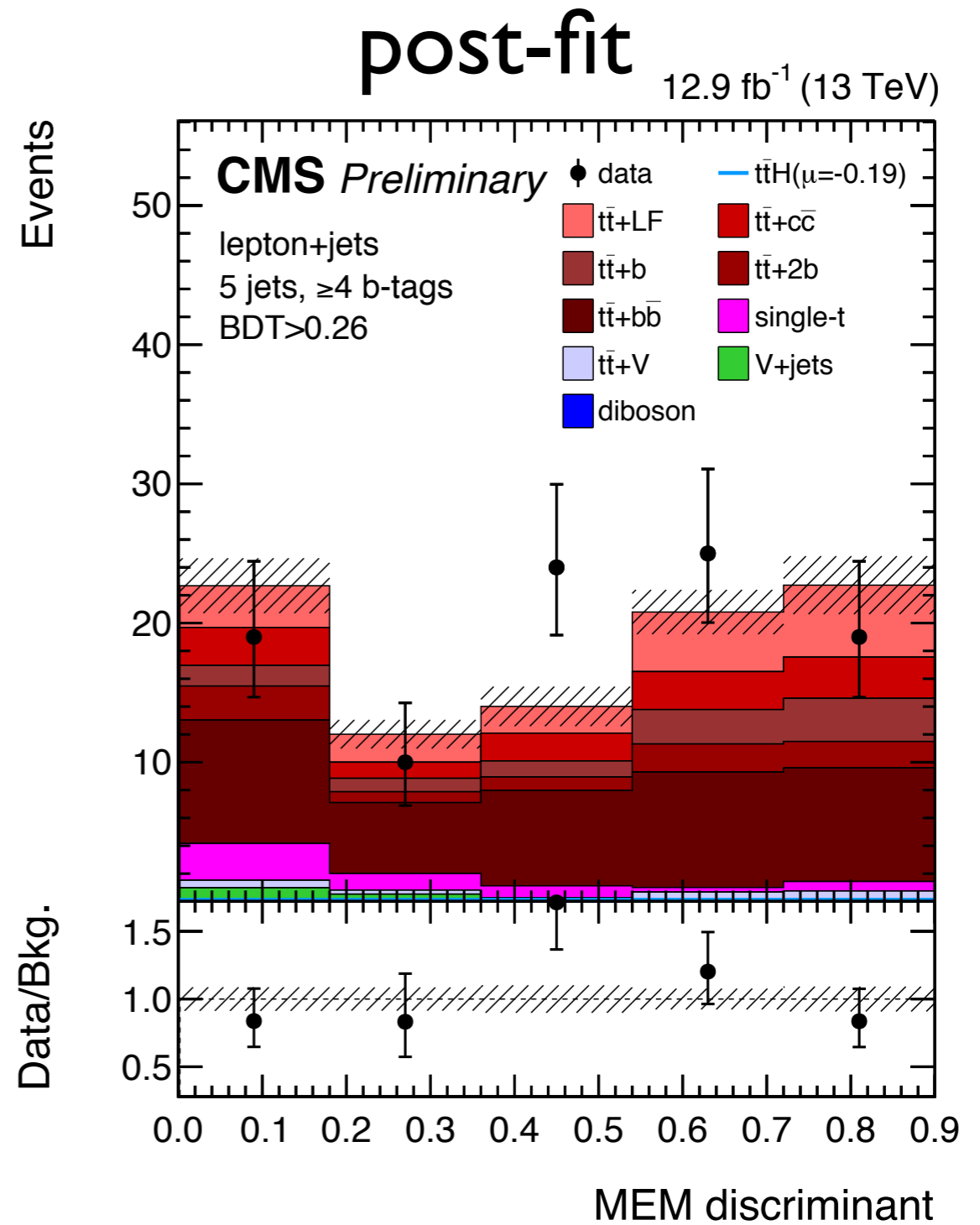
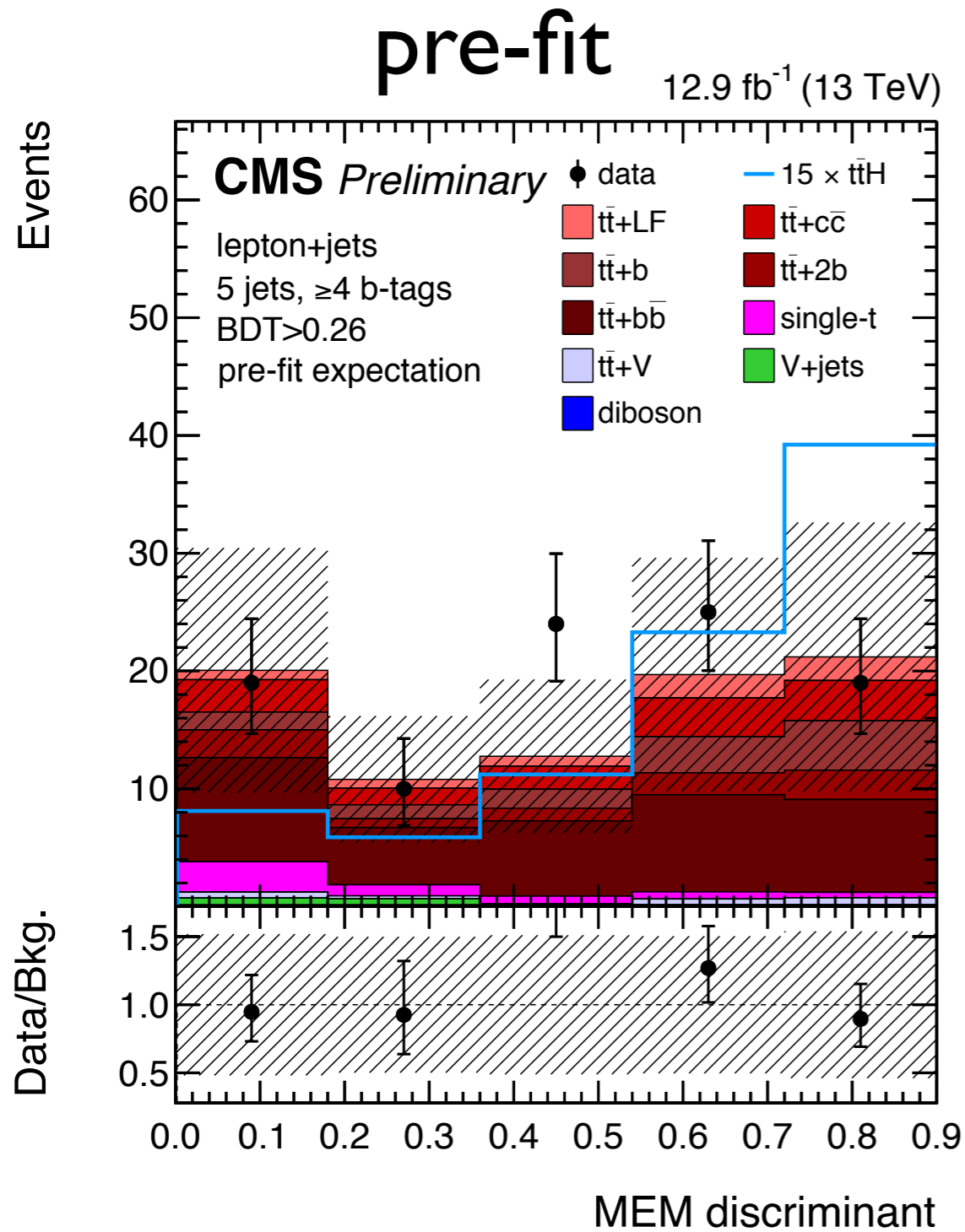




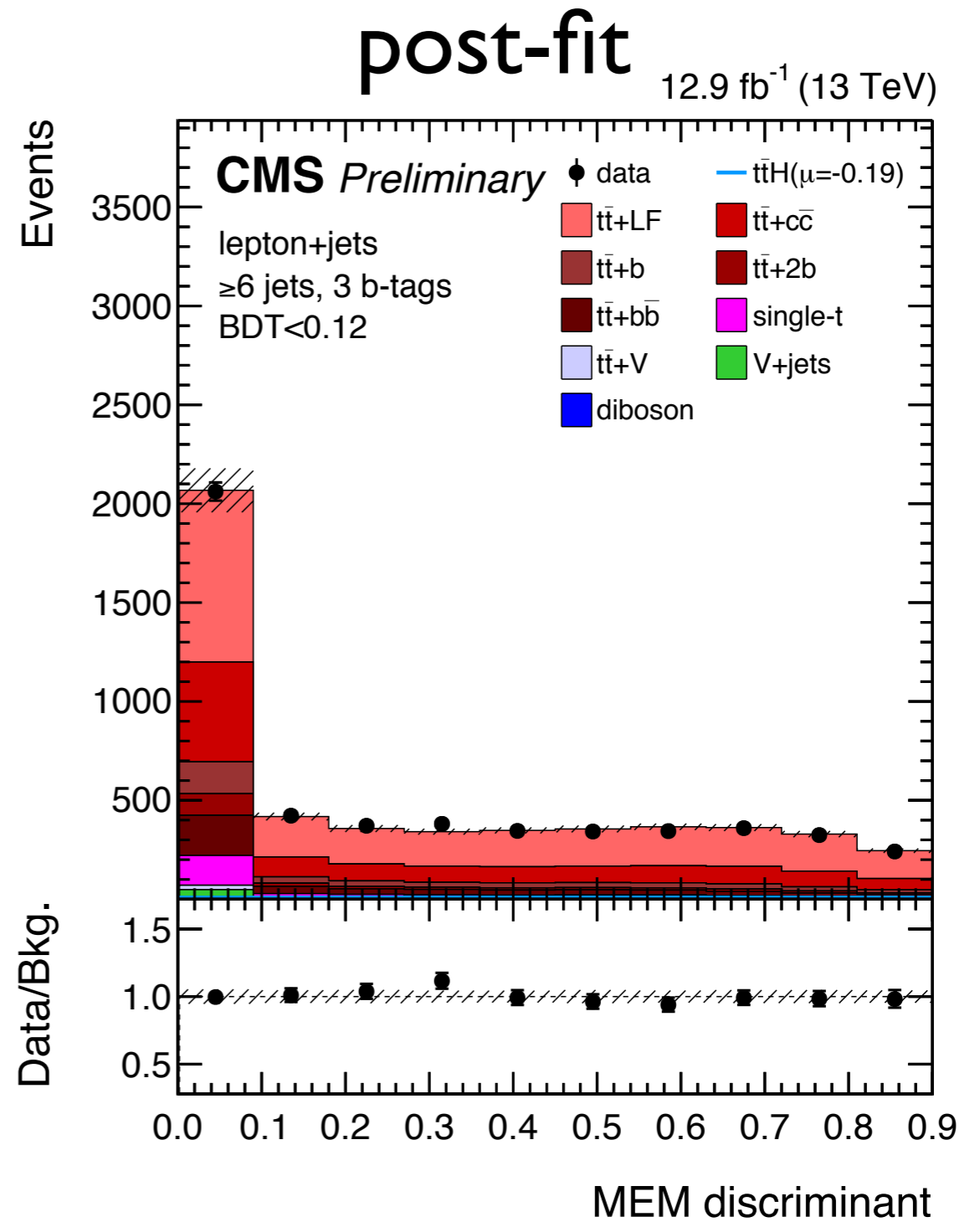
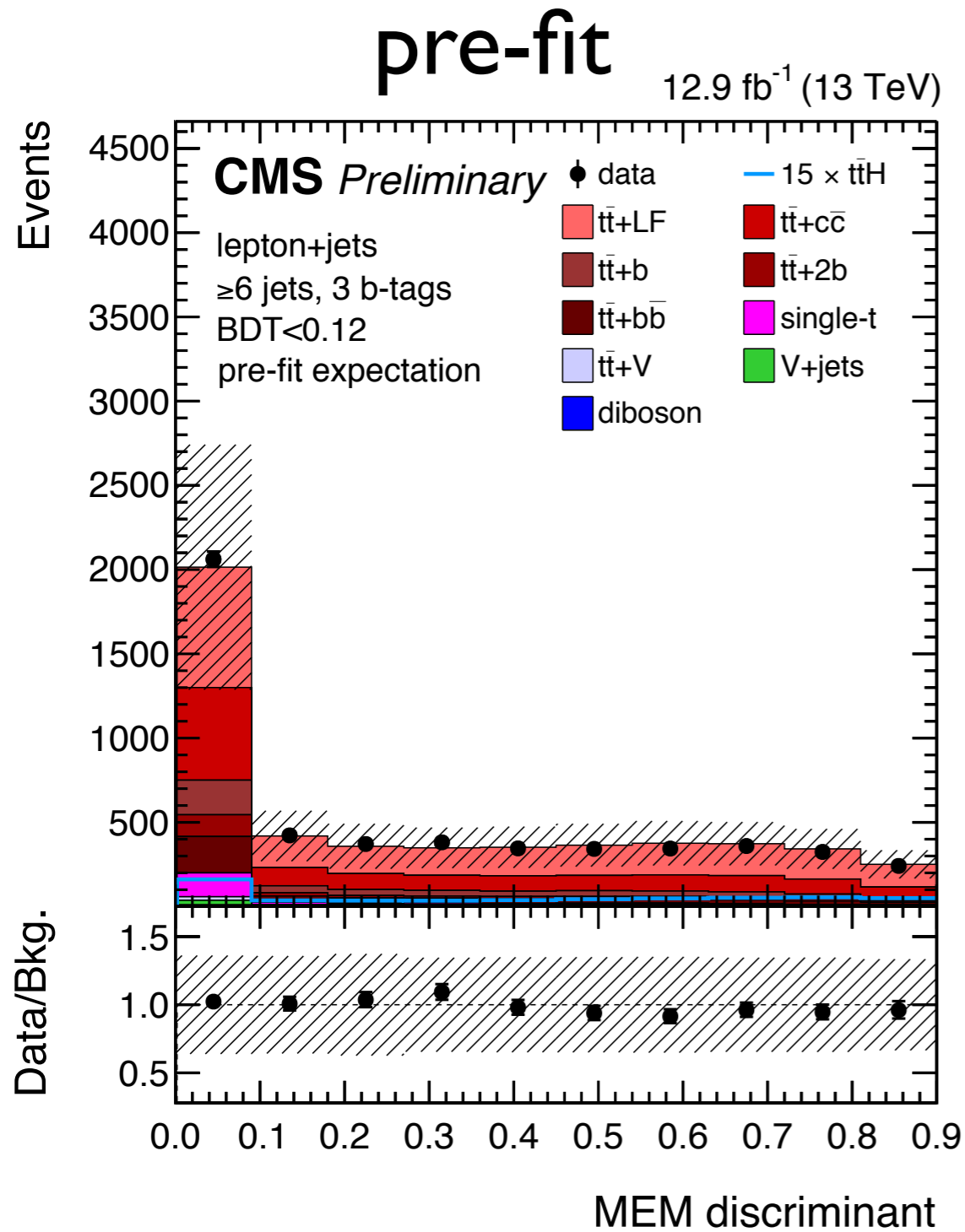
# Lepton + Jets j5 t4, low BDT



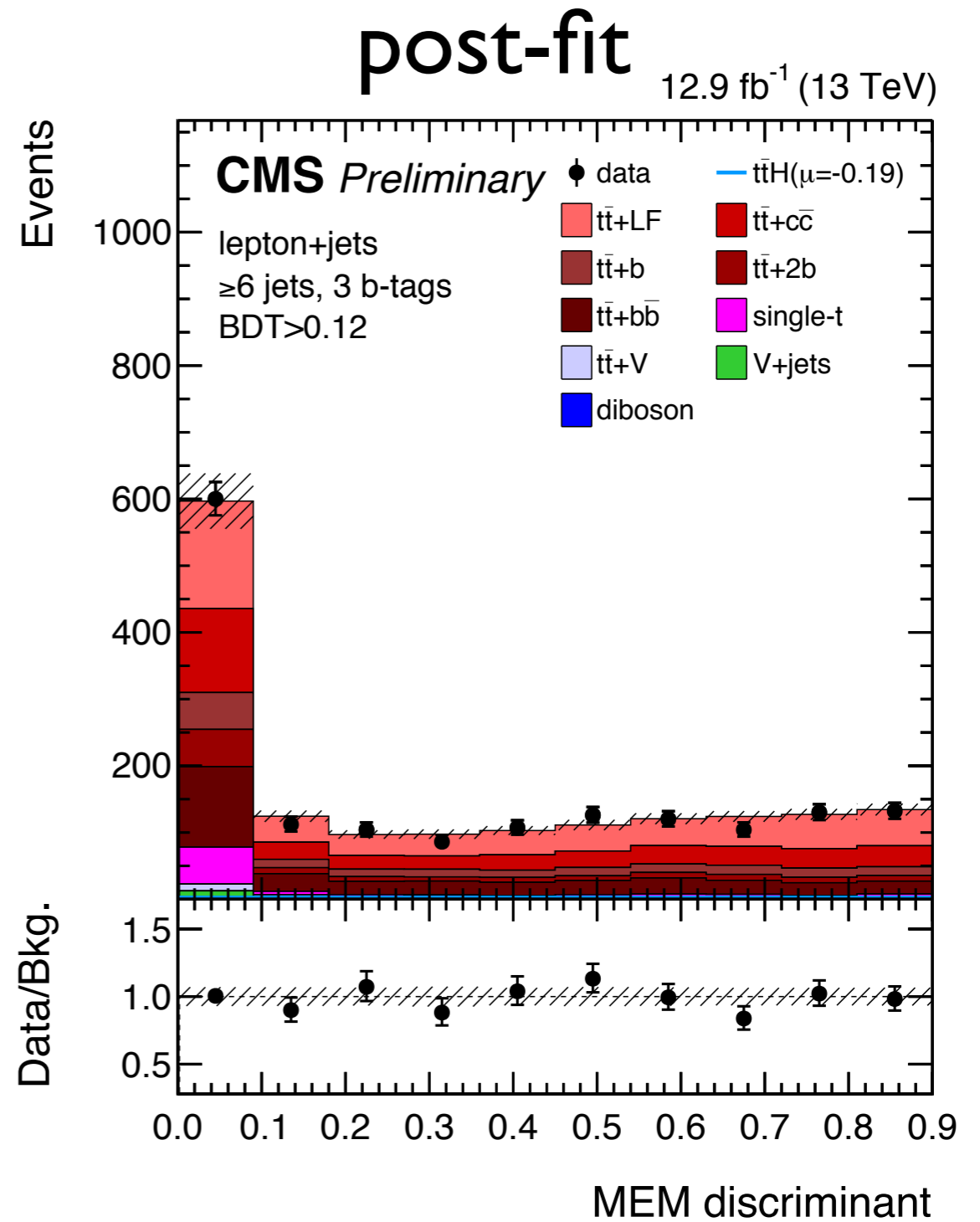
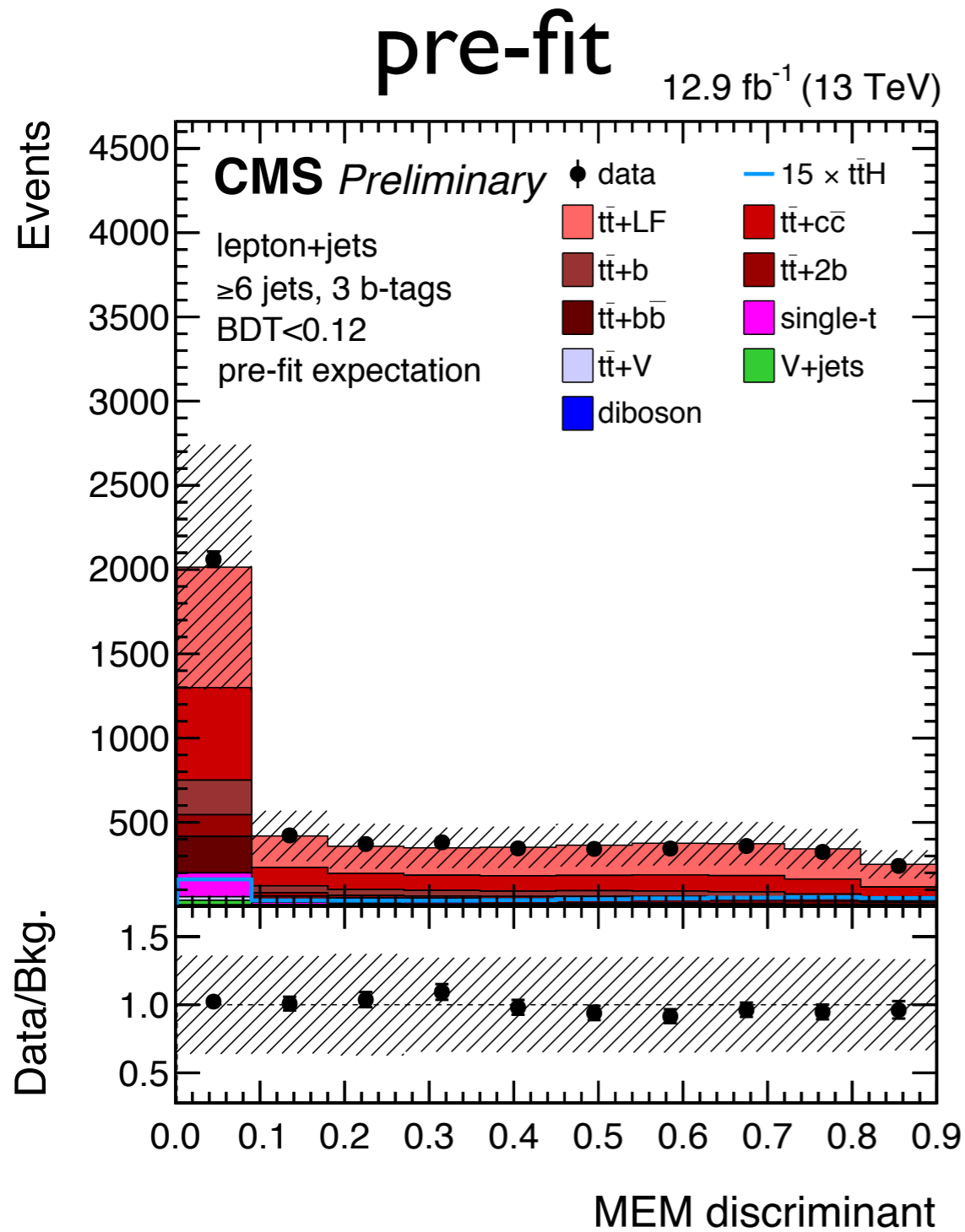
# Lepton + Jets j5 t4, high BDT



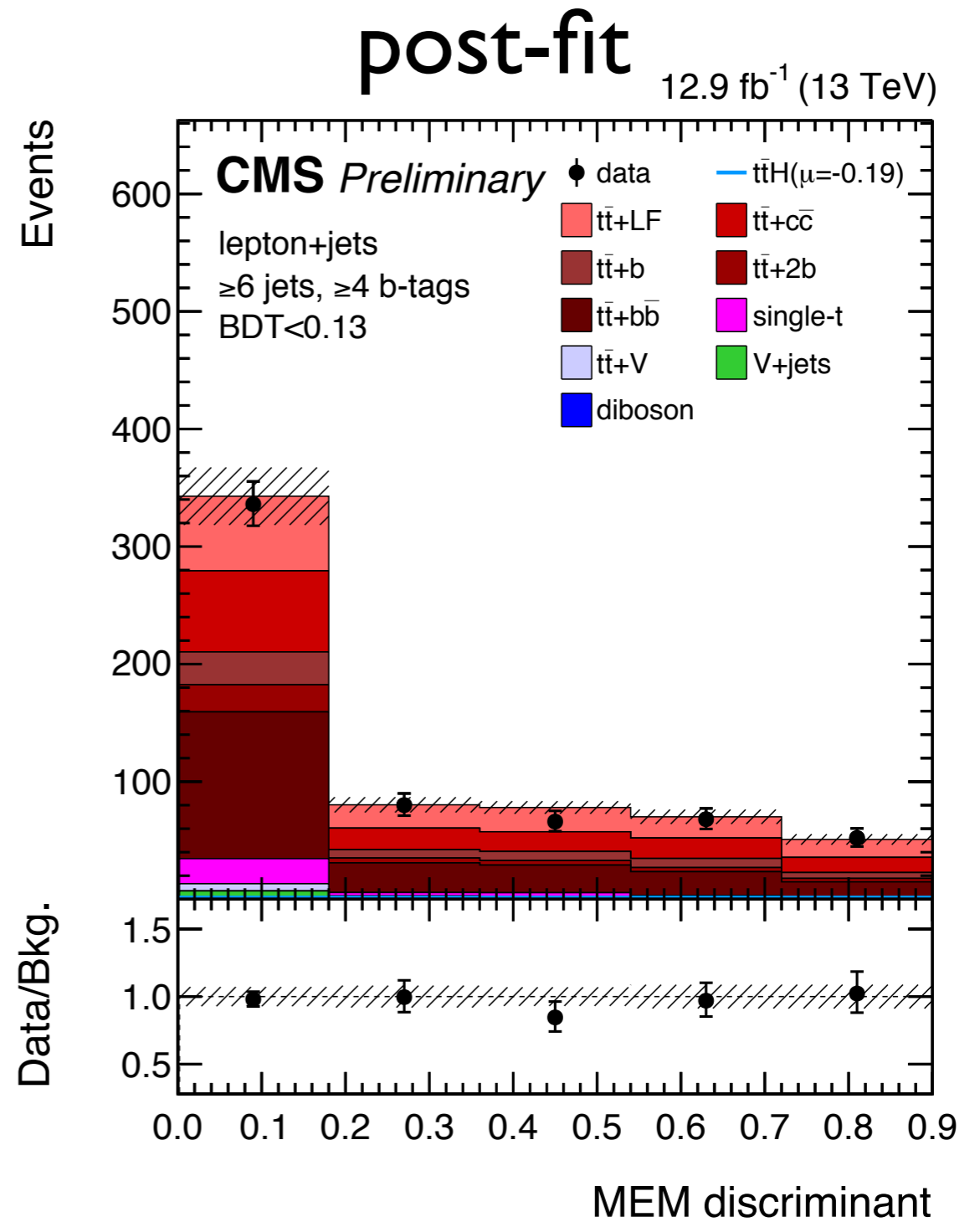
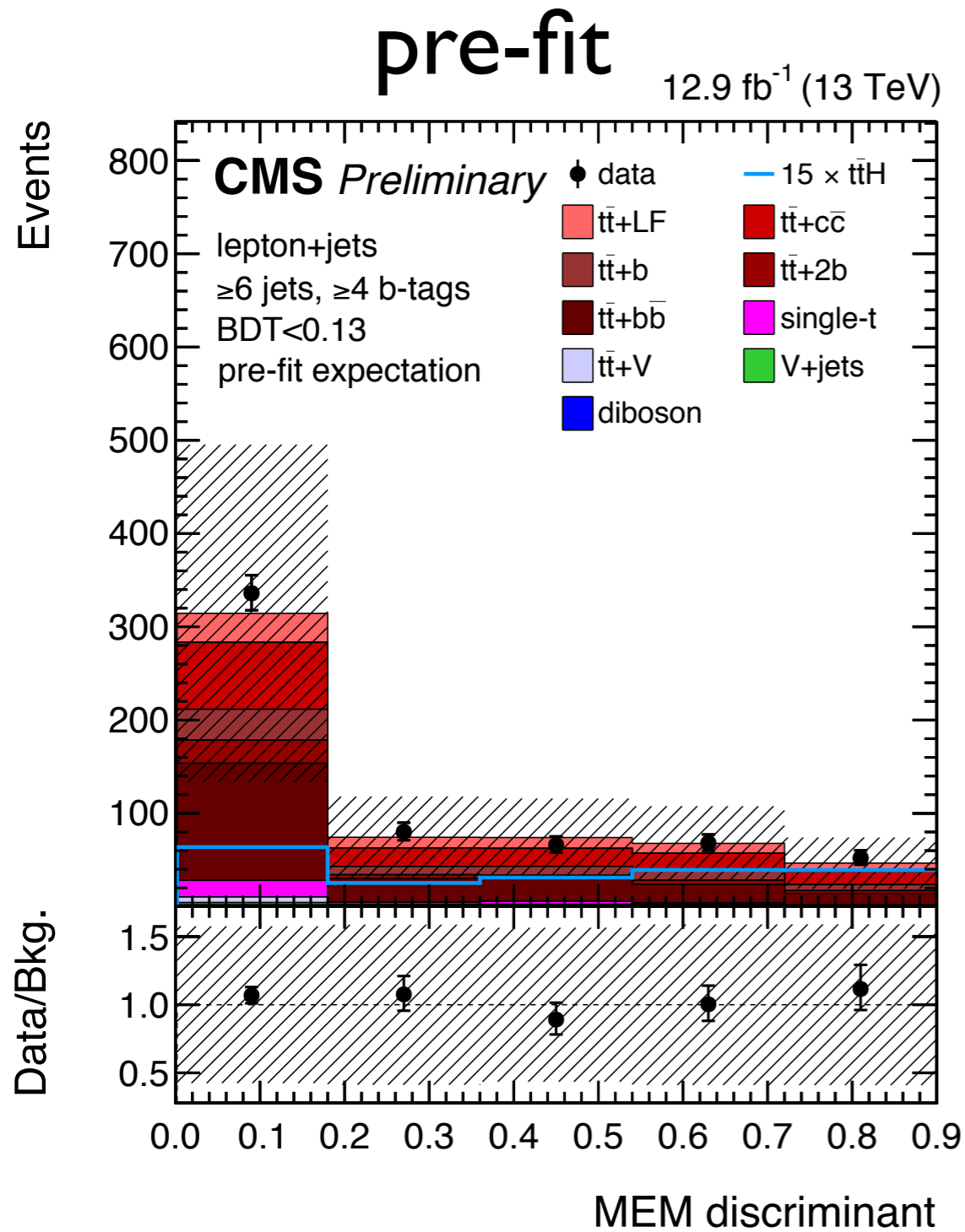
# Lepton + Jets j6 t3, low BDT



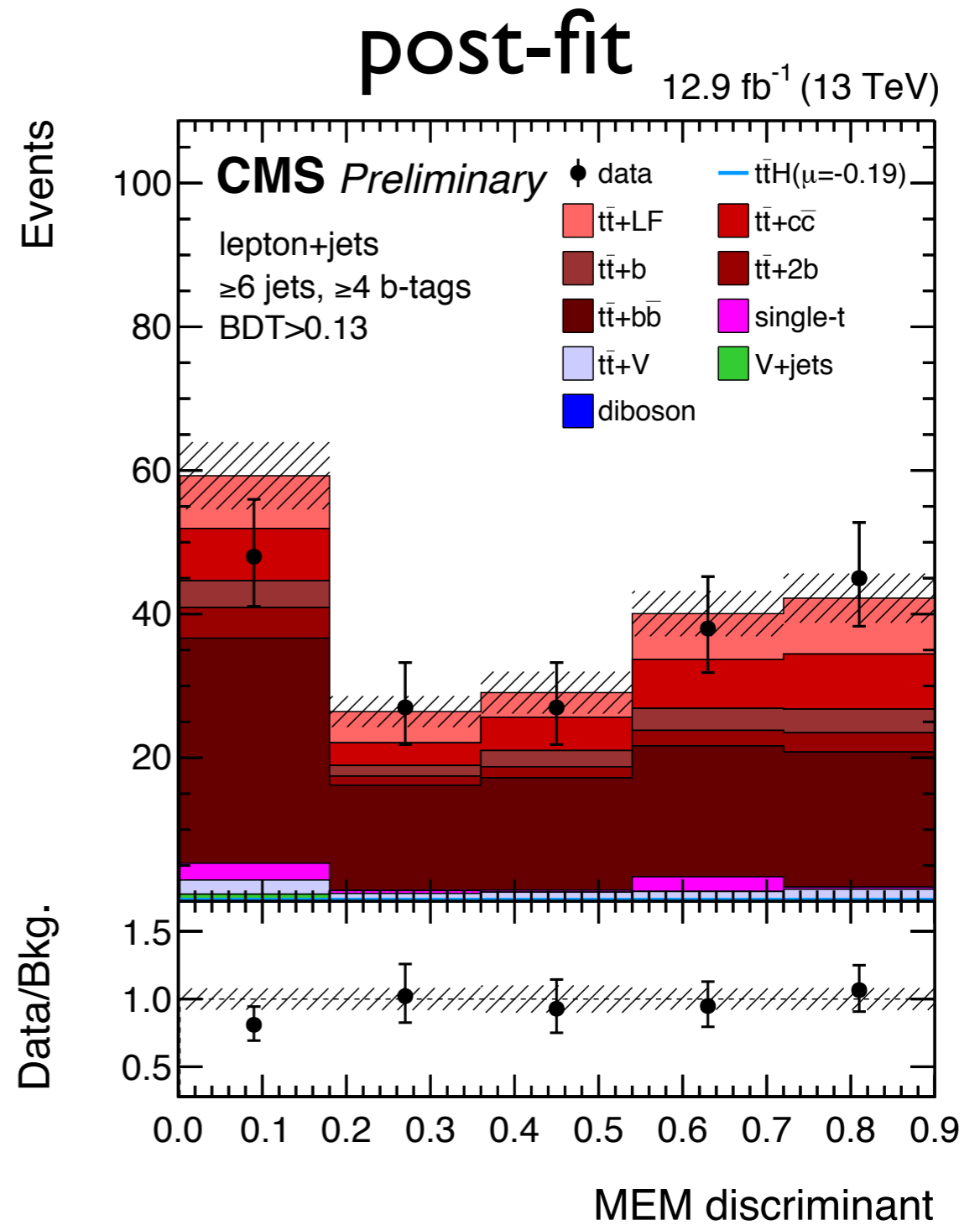
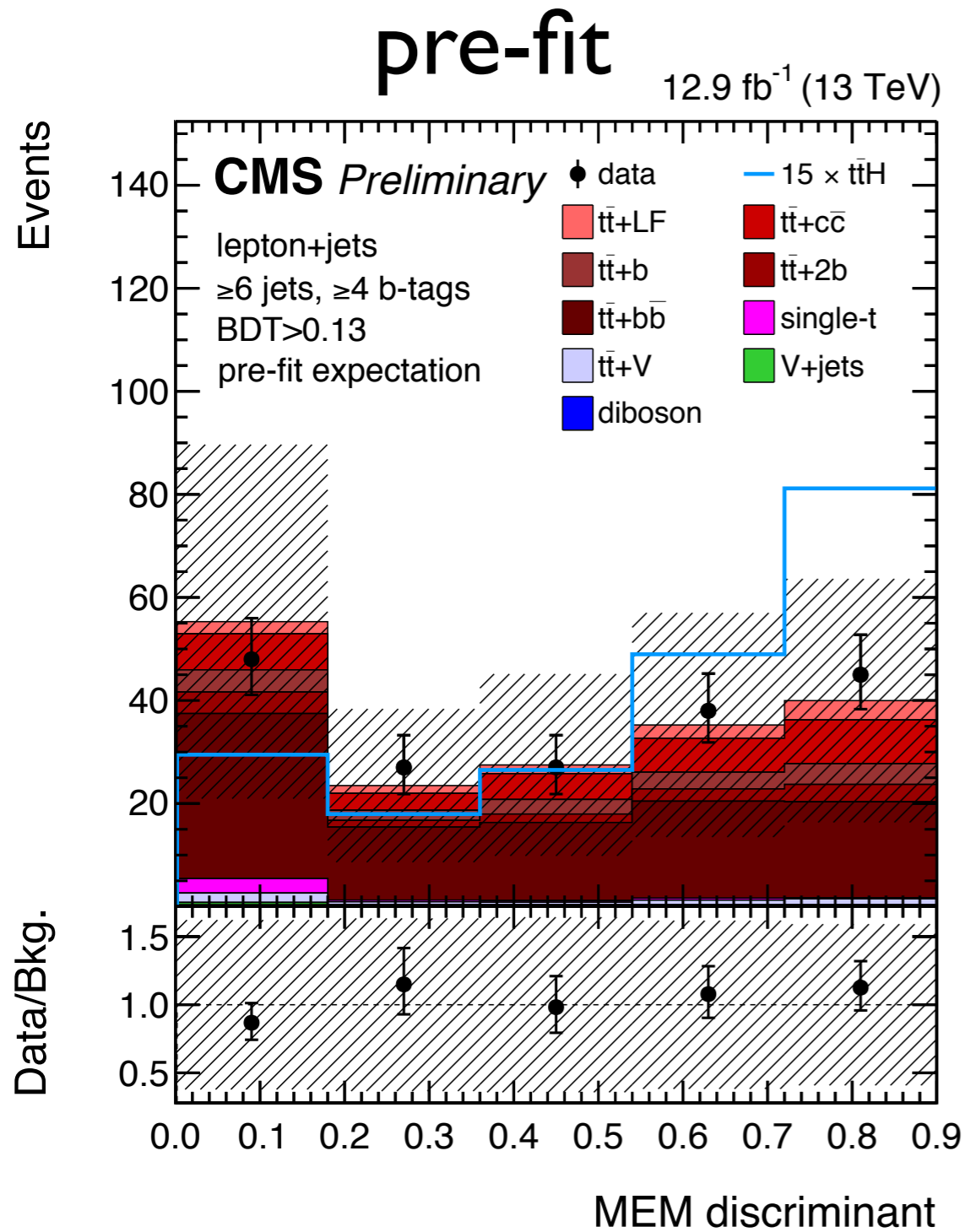
# Lepton + Jets j6 t3, high BDT



# Lepton + Jets j6 t4, low BDT



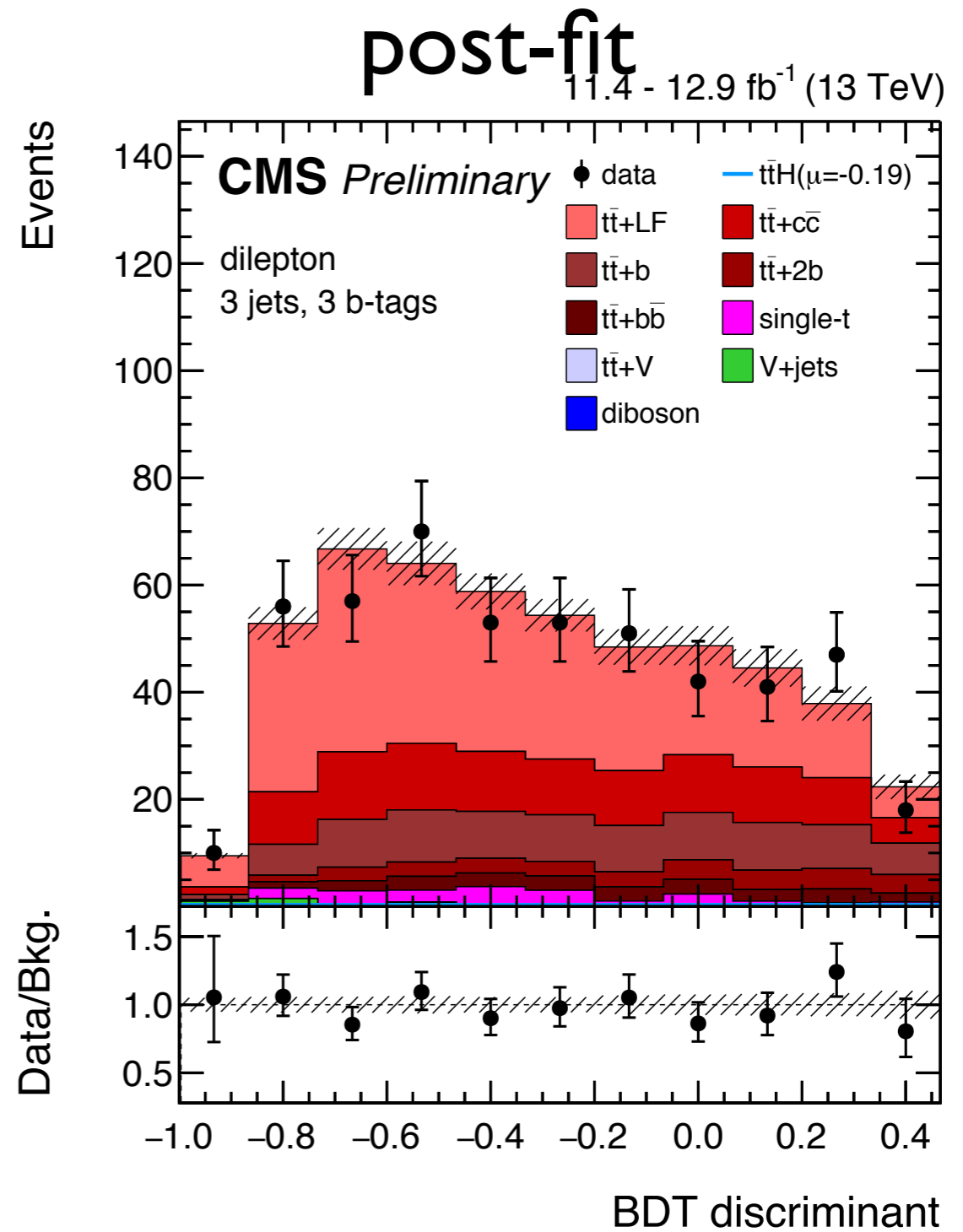
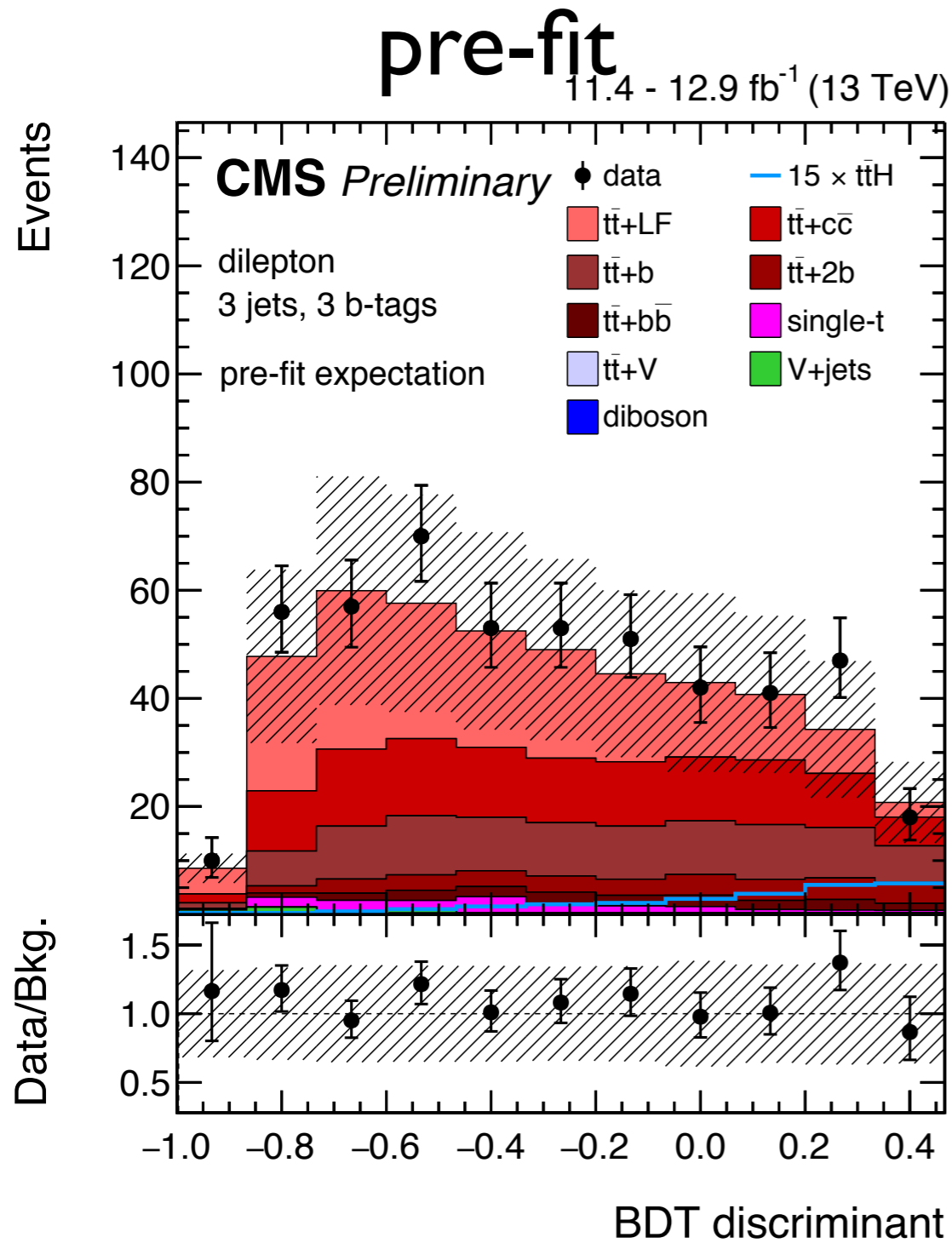
# Lepton + Jets j6 t4, high BDT



# Final Discriminators

## Dilepton

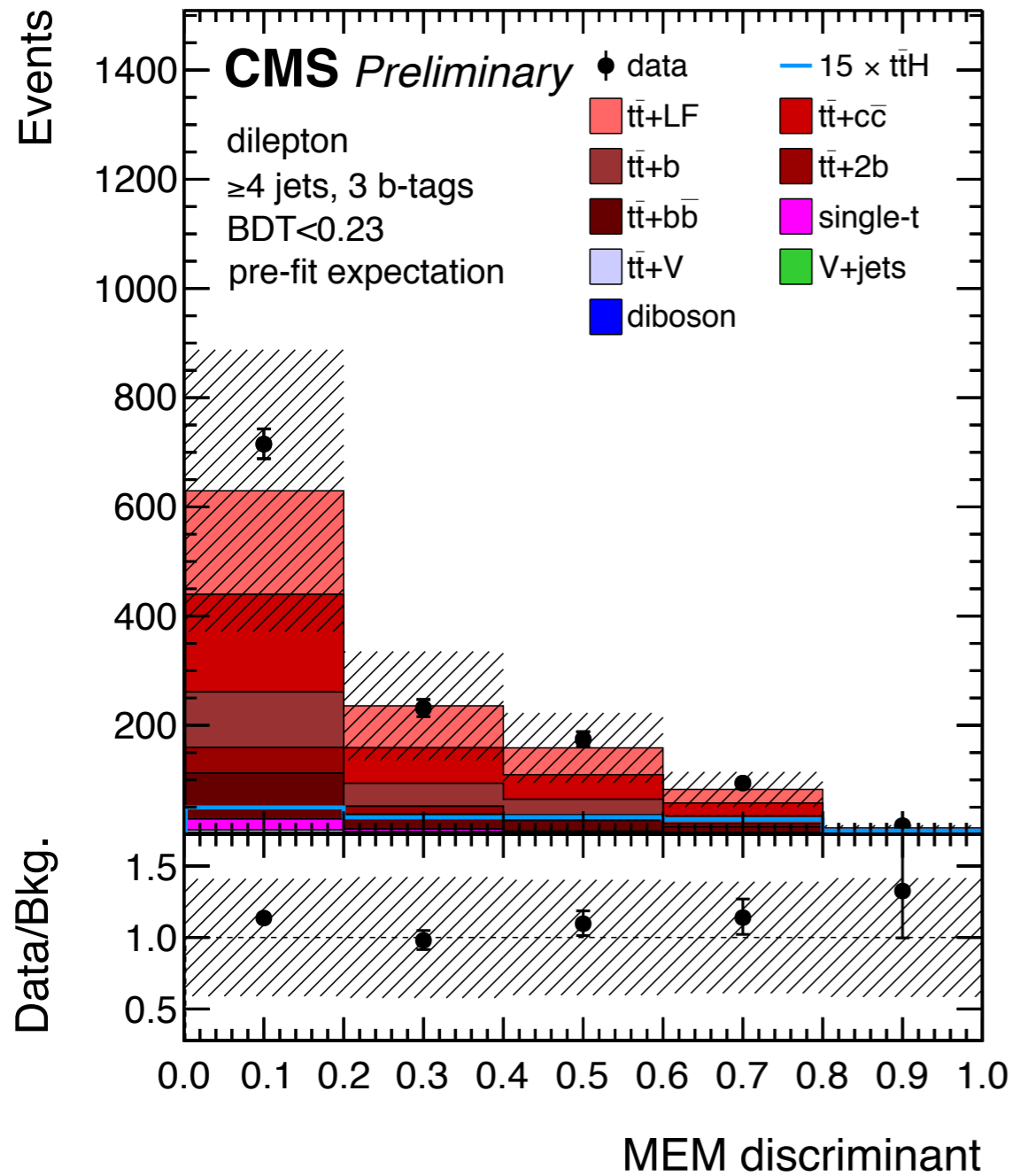
# Dilepton j3 t3



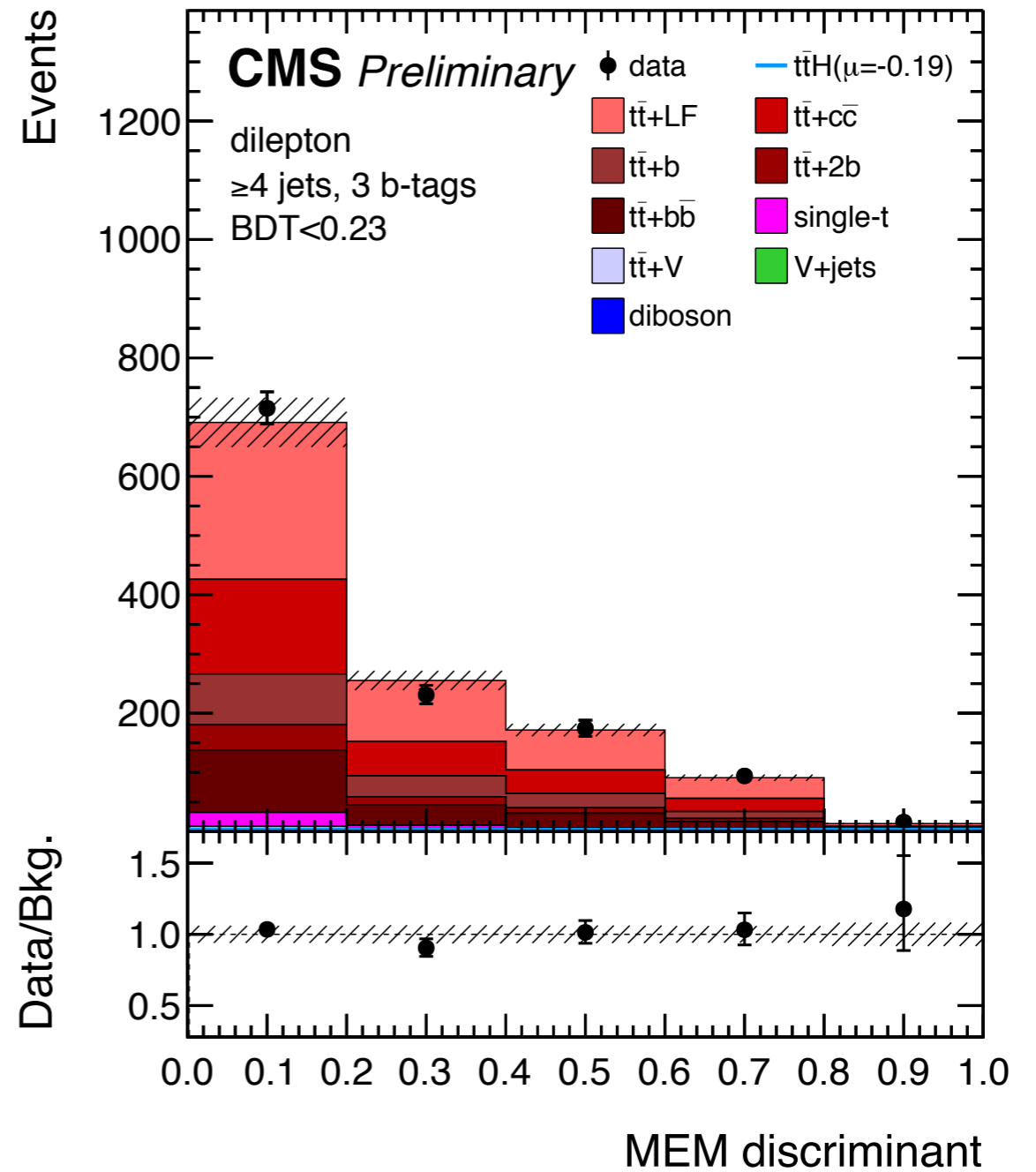


# Dilepton j4 t3, low BDT

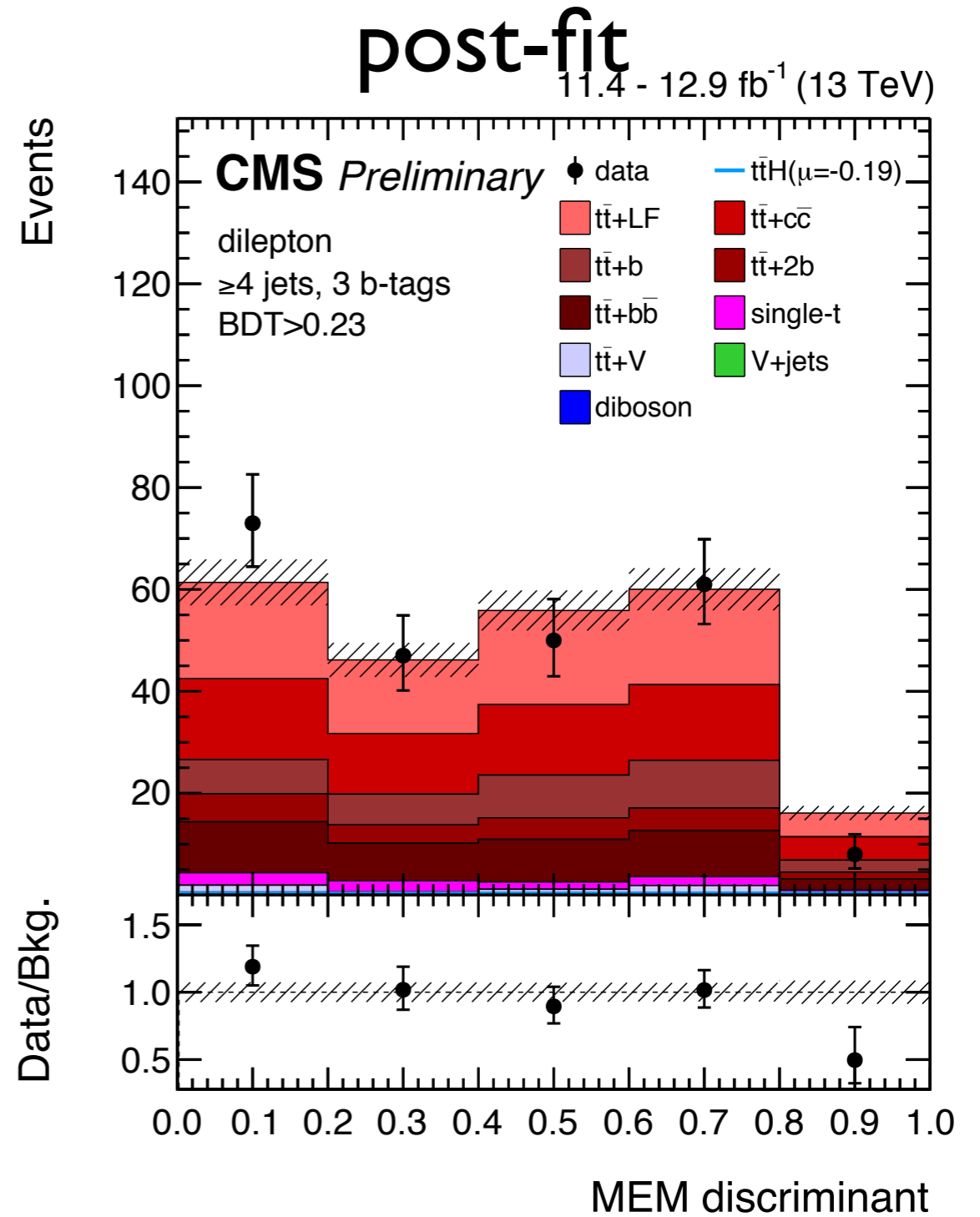
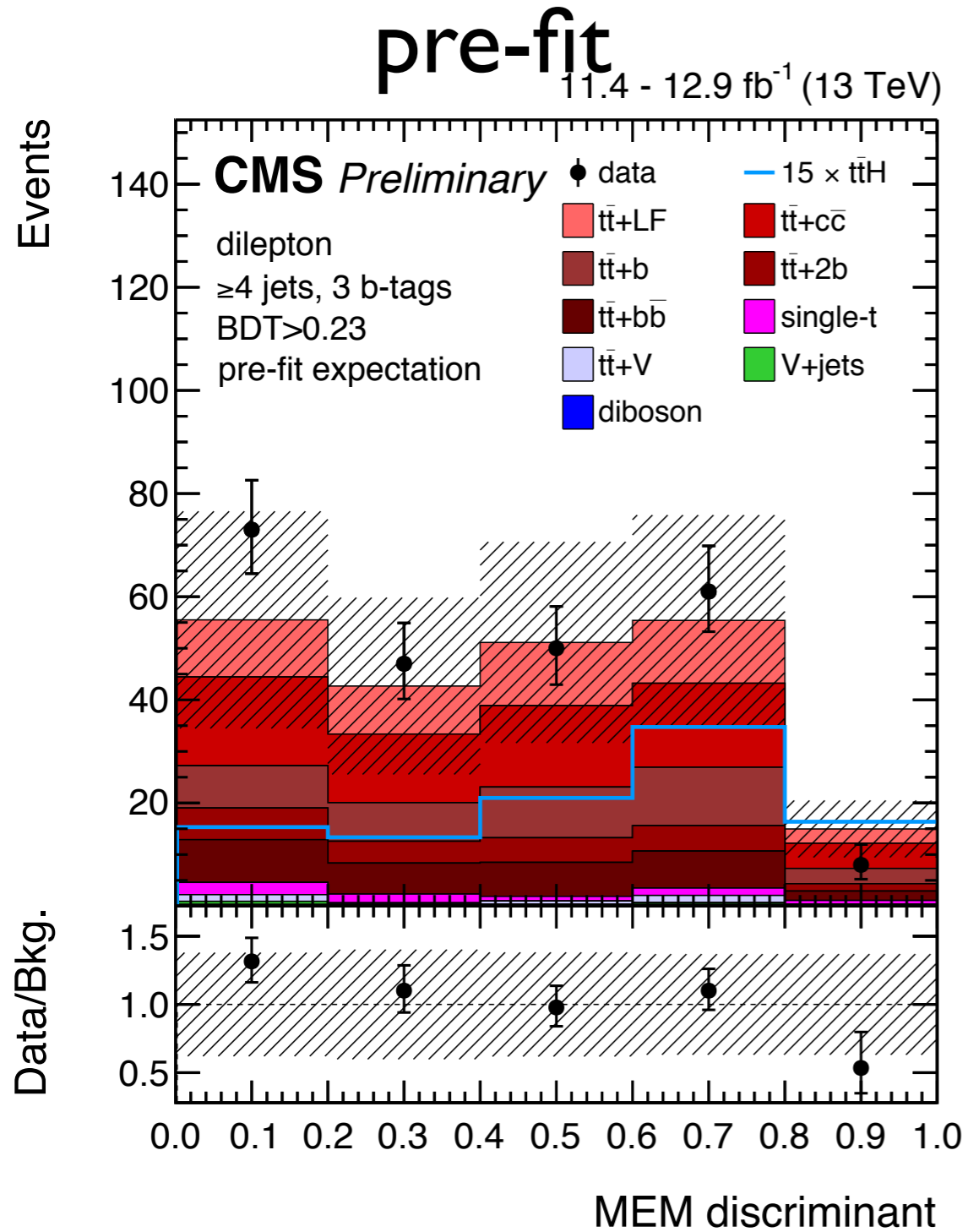
pre-fit  
11.4 - 12.9 fb<sup>-1</sup> (13 TeV)



post-fit  
11.4 - 12.9 fb<sup>-1</sup> (13 TeV)



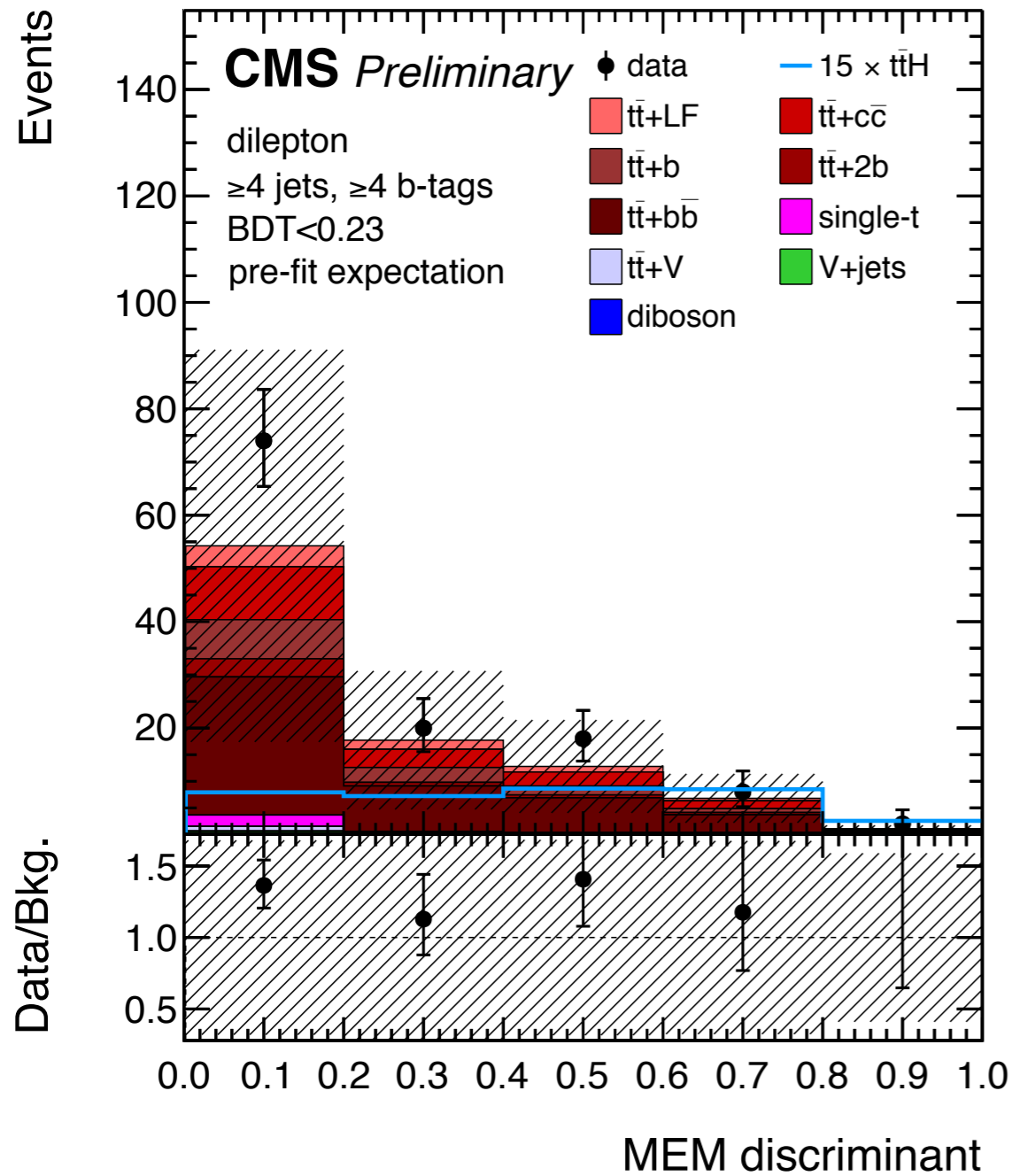
# Dilepton j4 t3, high BDT



# Dilepton j4 t4, low BDT

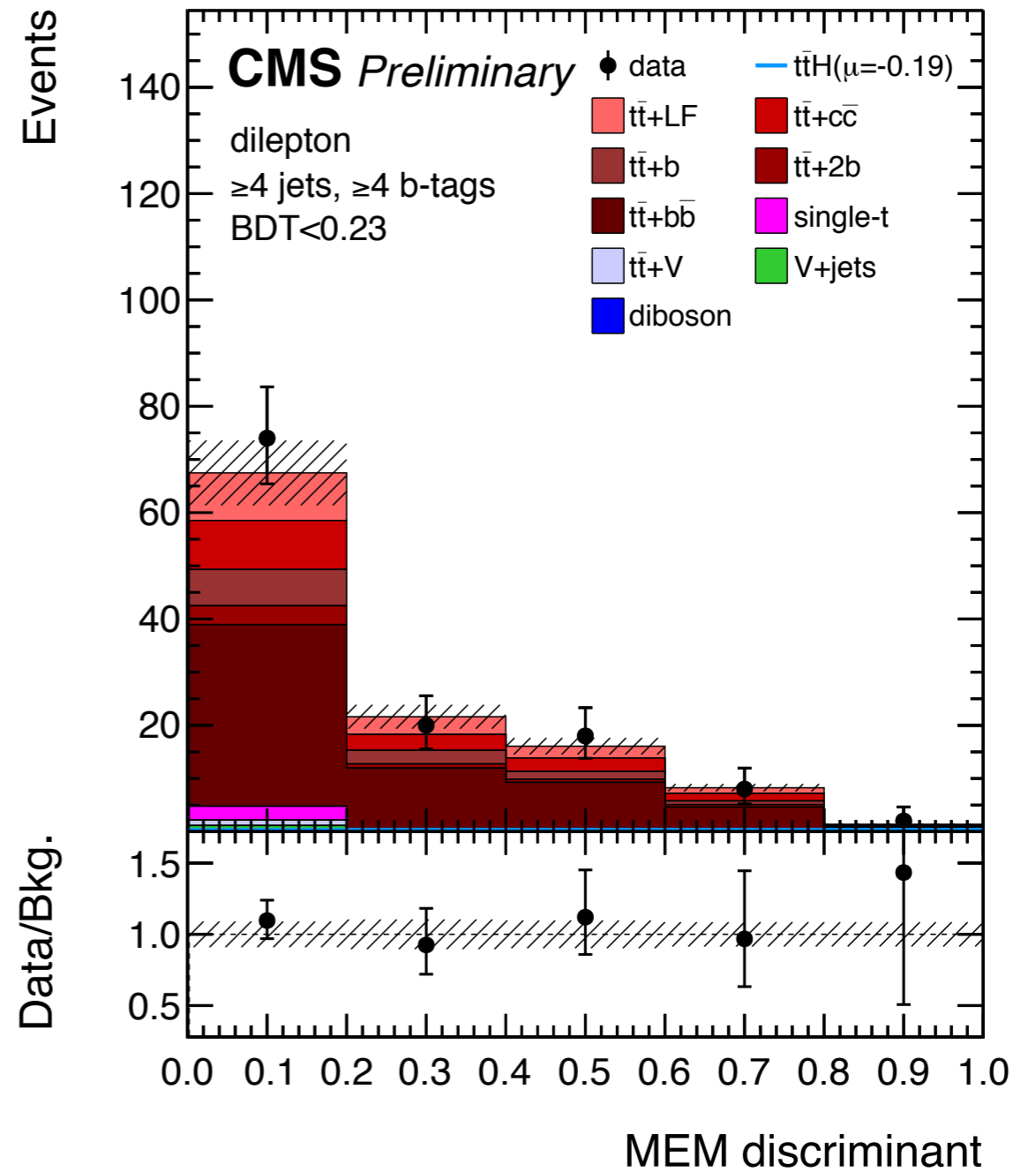
pre-fit

11.4 - 12.9 fb<sup>-1</sup> (13 TeV)

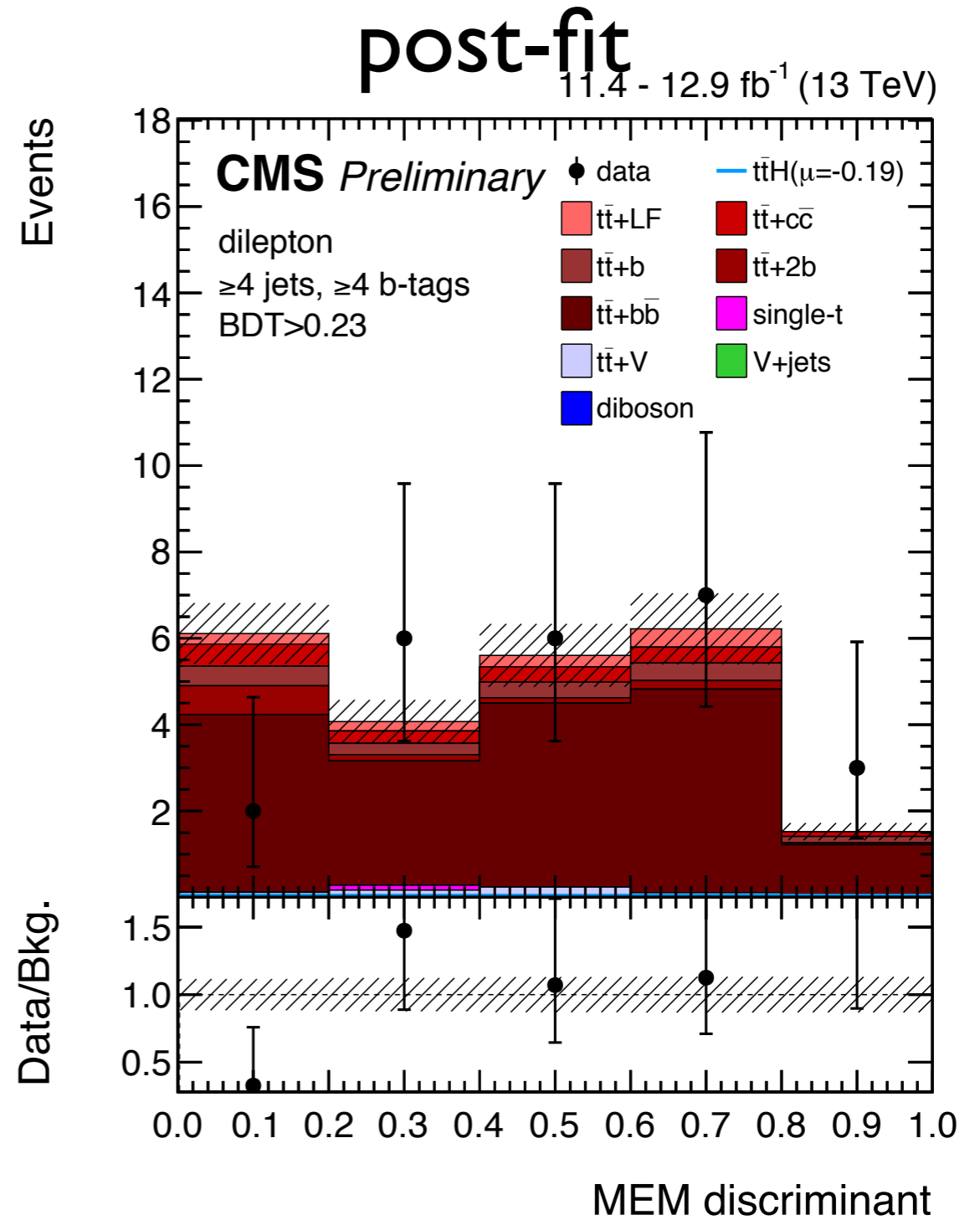
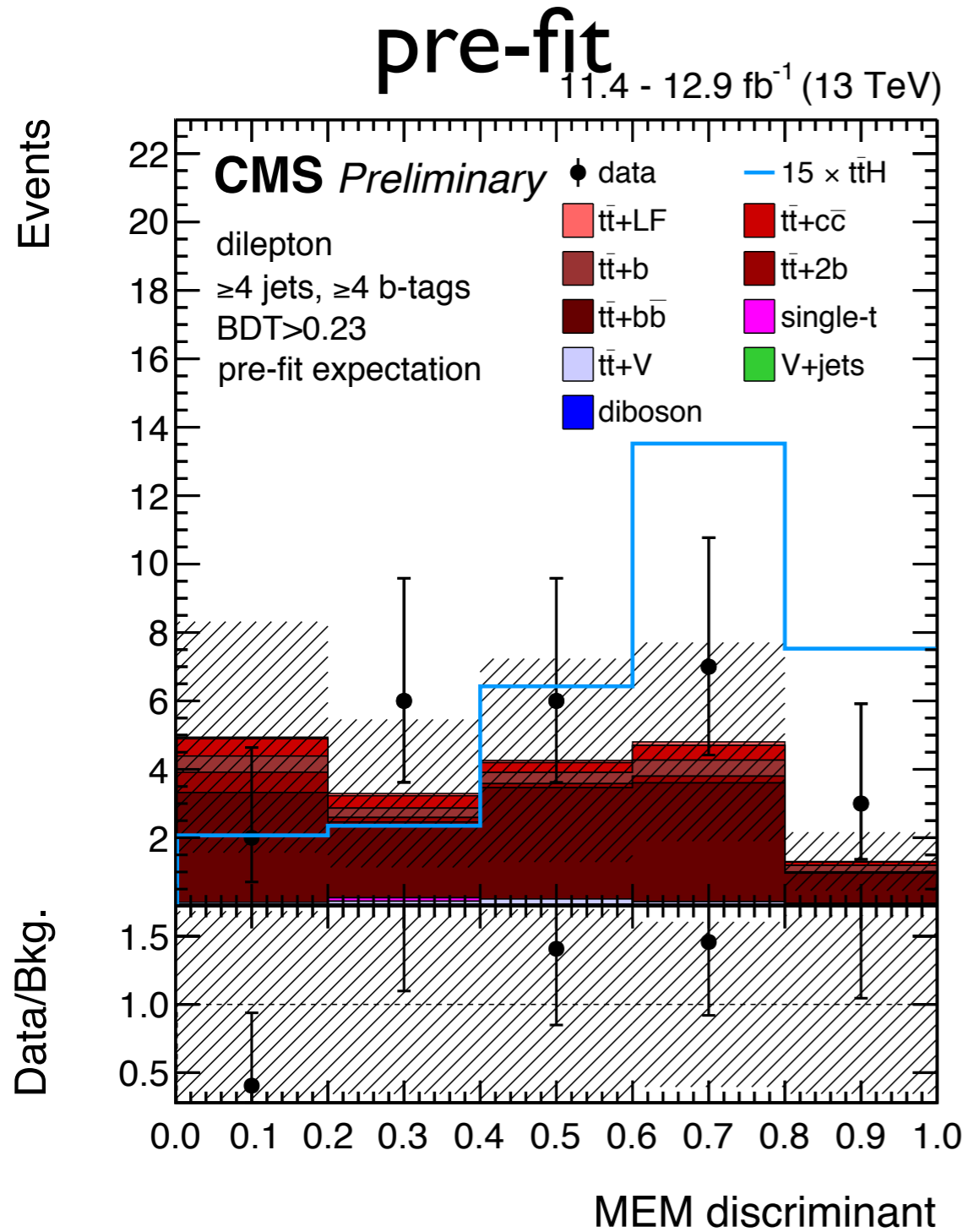


post-fit

11.4 - 12.9 fb<sup>-1</sup> (13 TeV)



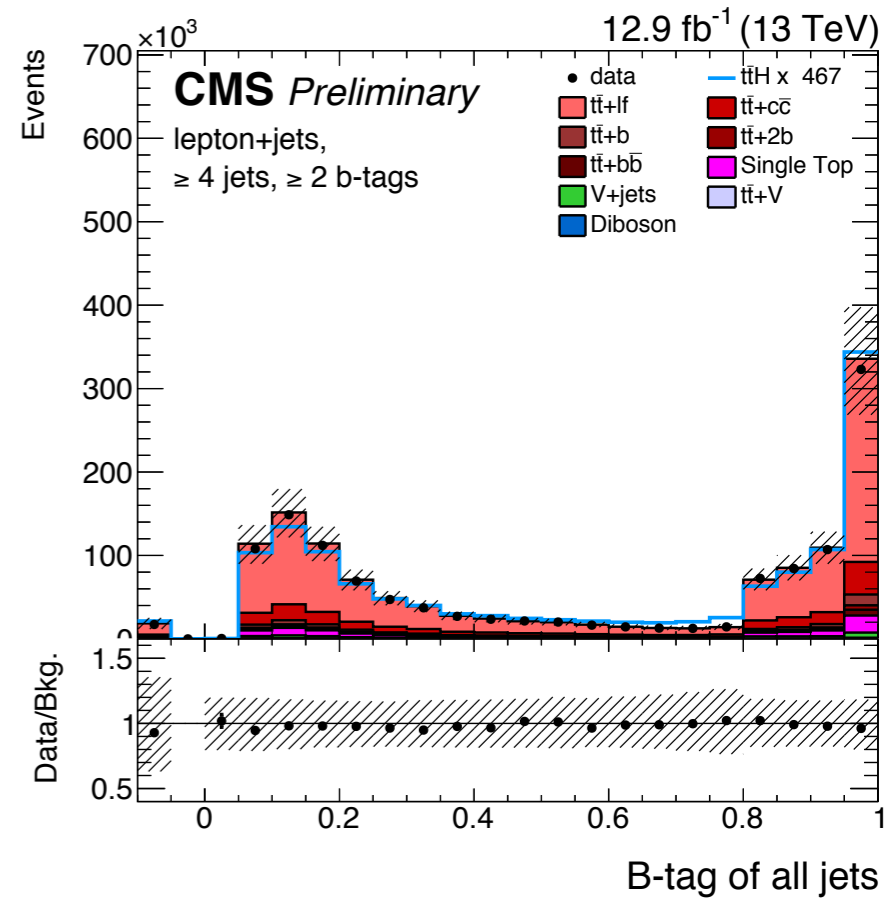
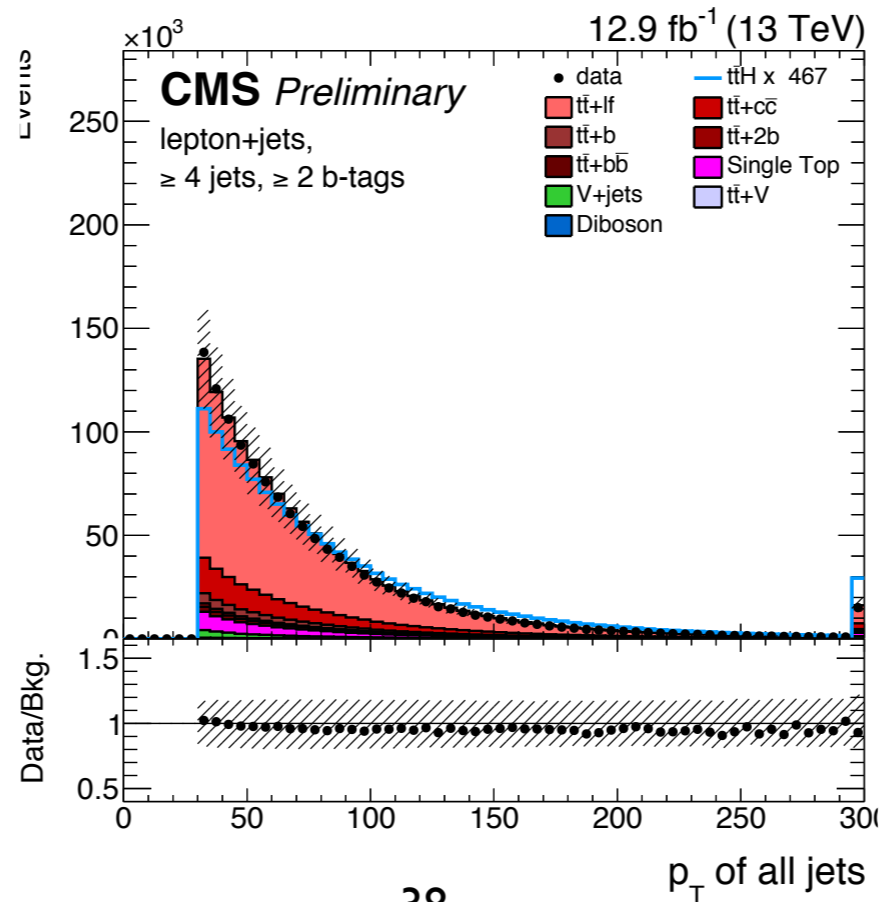
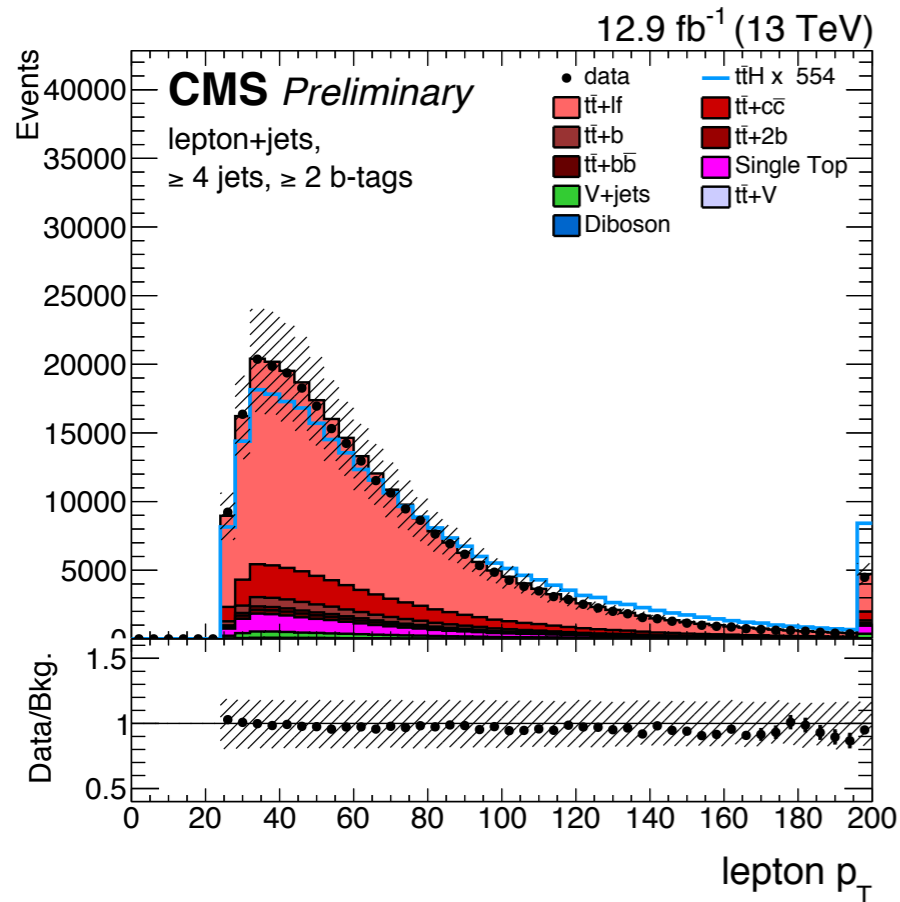
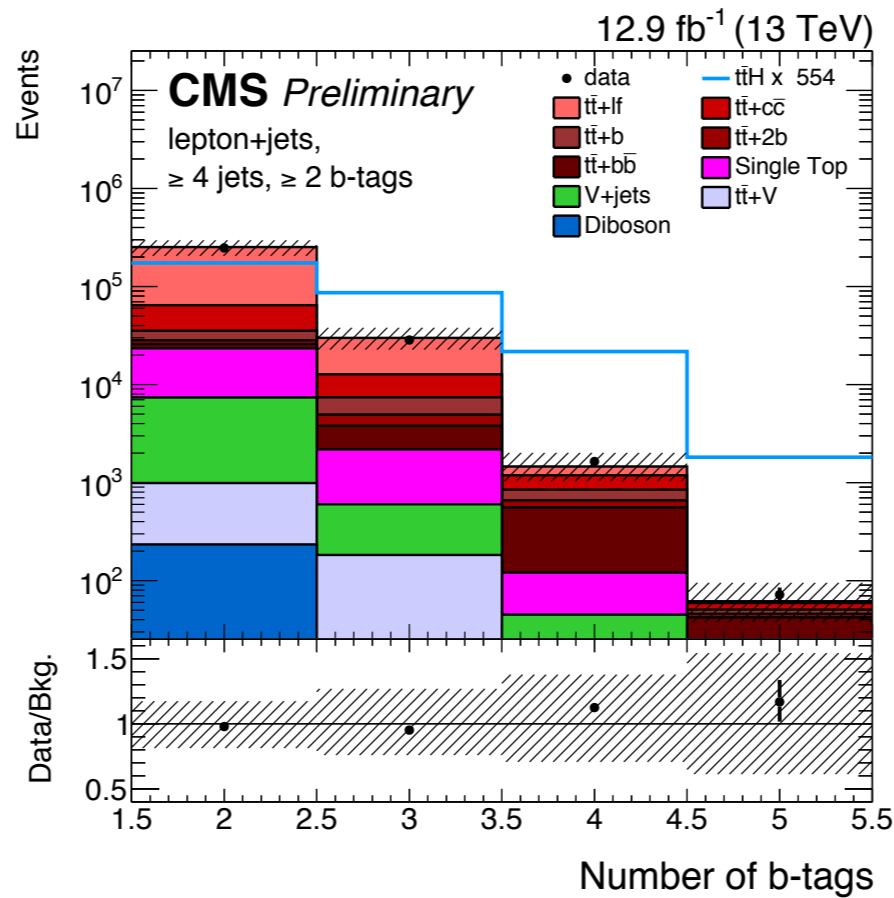
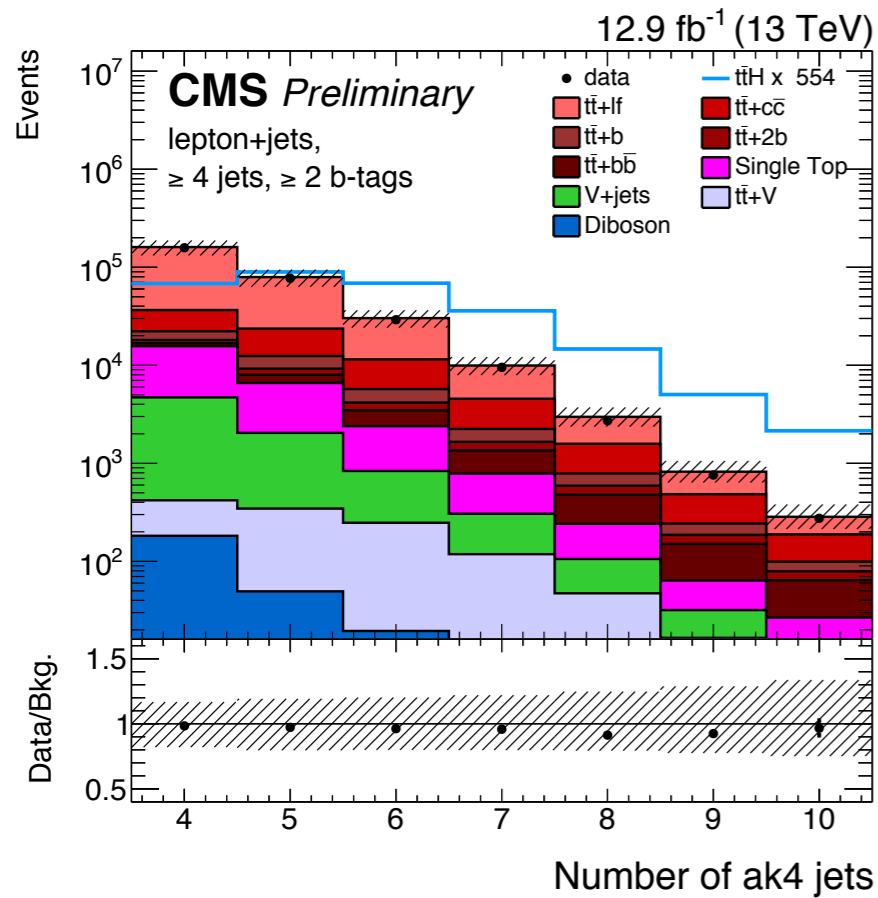
# Dilepton j4 t4, high BDT



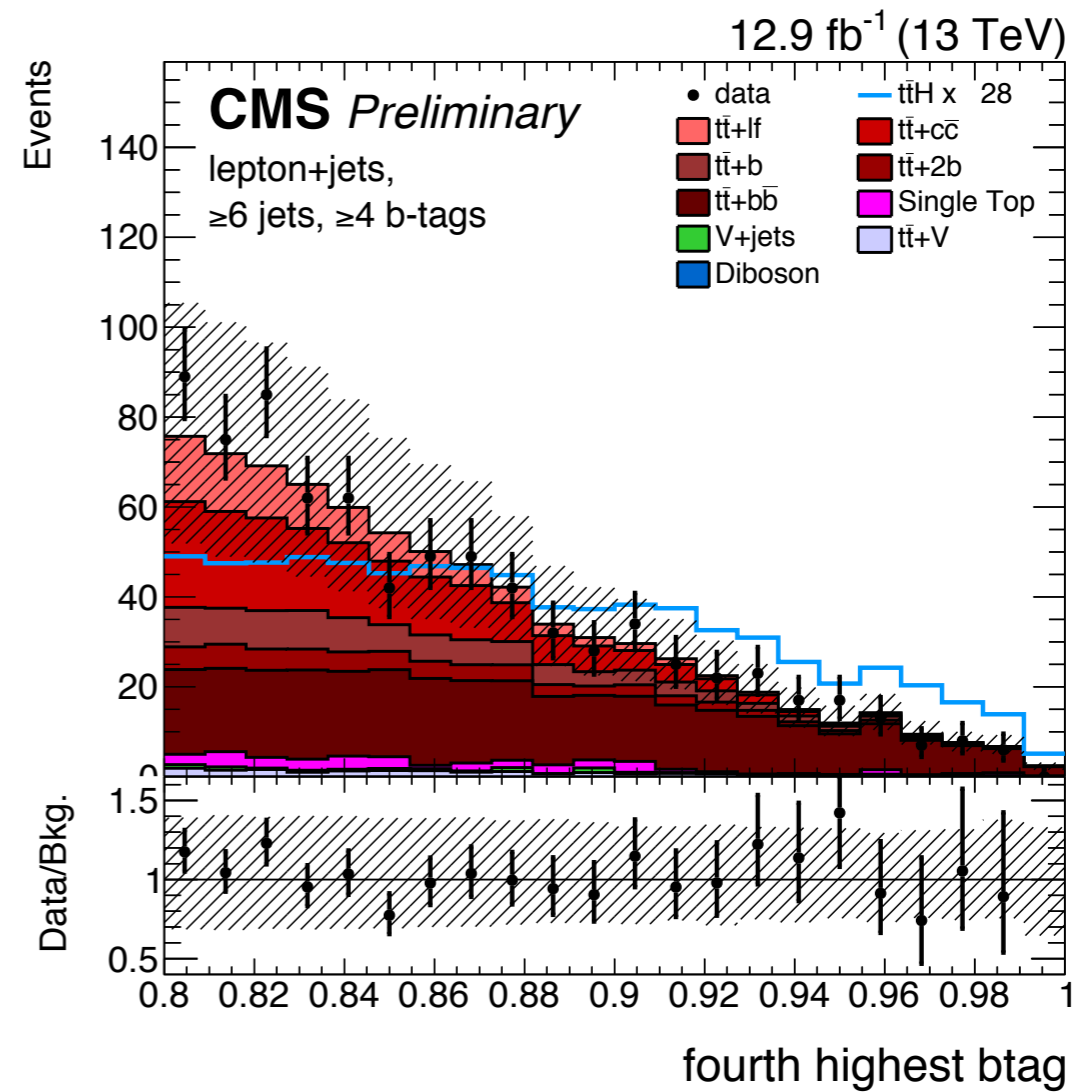
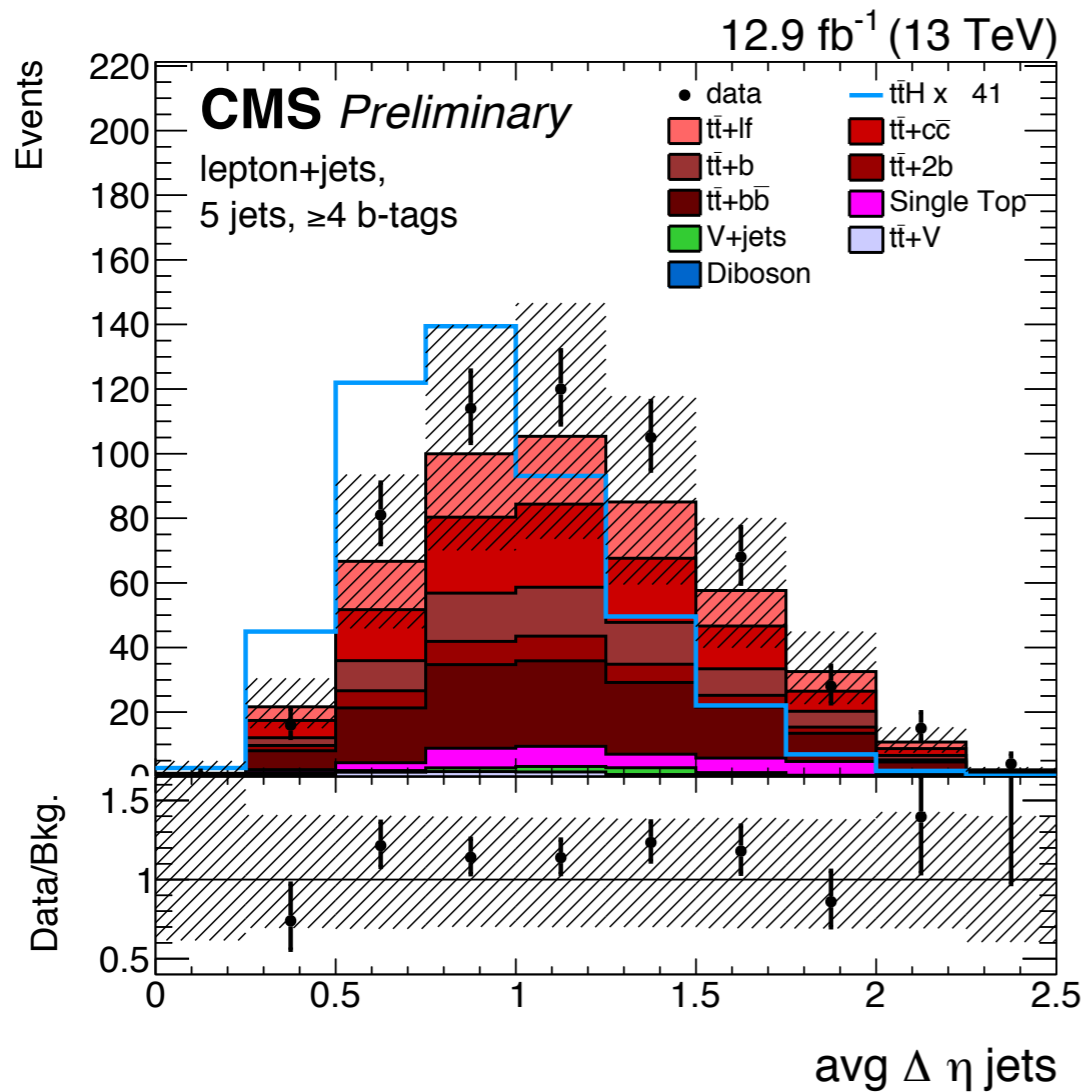
# Extra Variables

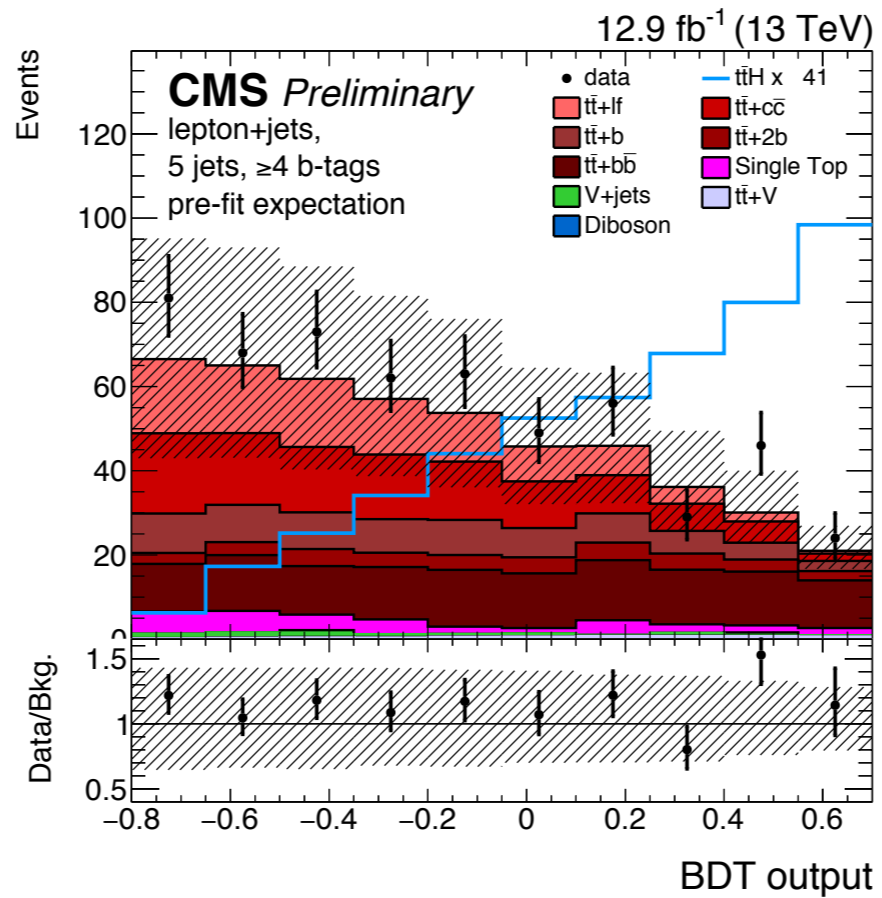
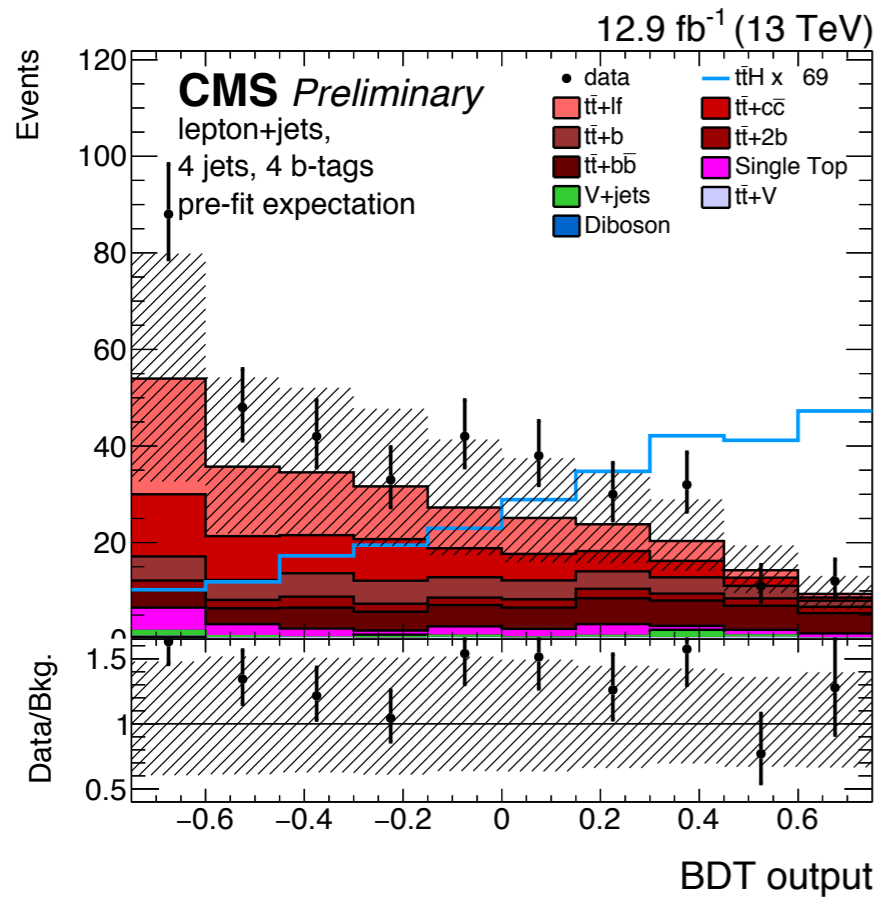
## Lepton+Jets

# Lepton+Jets Basics

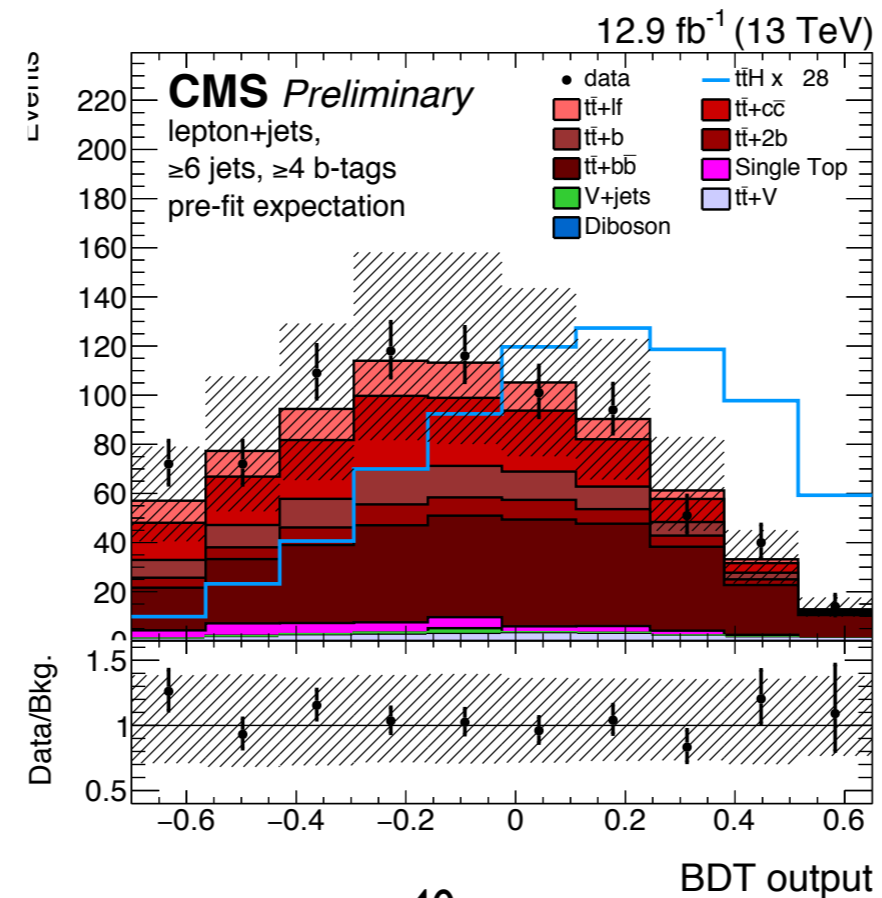
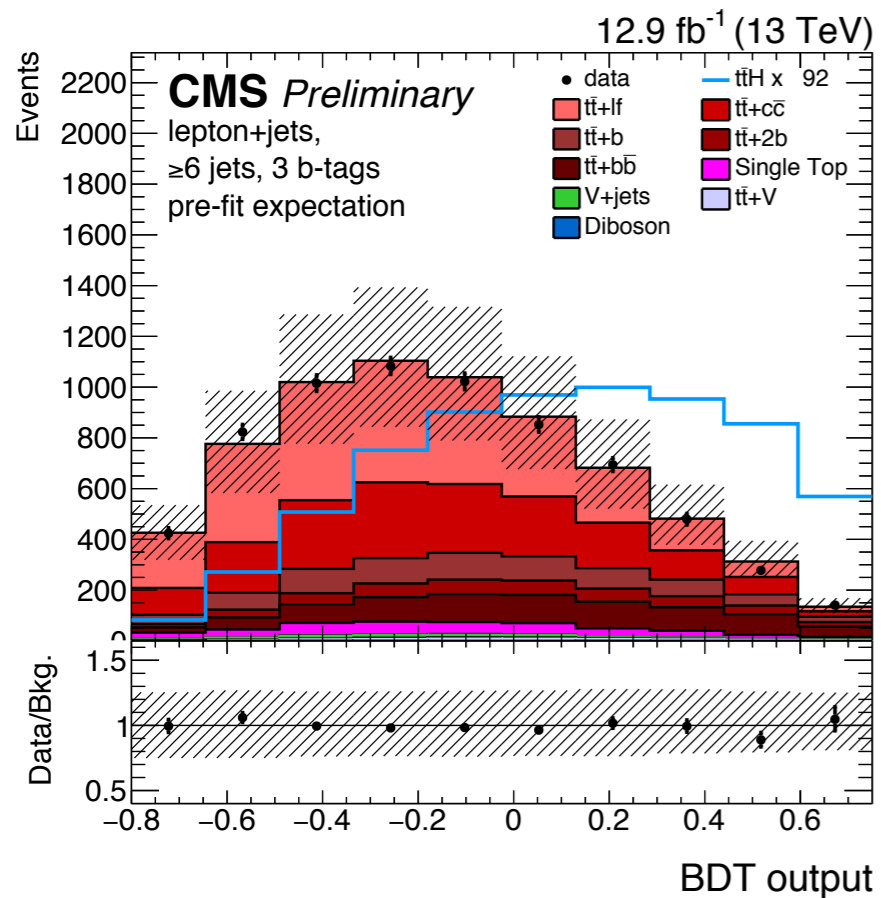


# Lepton+Jets BDT Inputs





# Lepton+Jets BDT Output





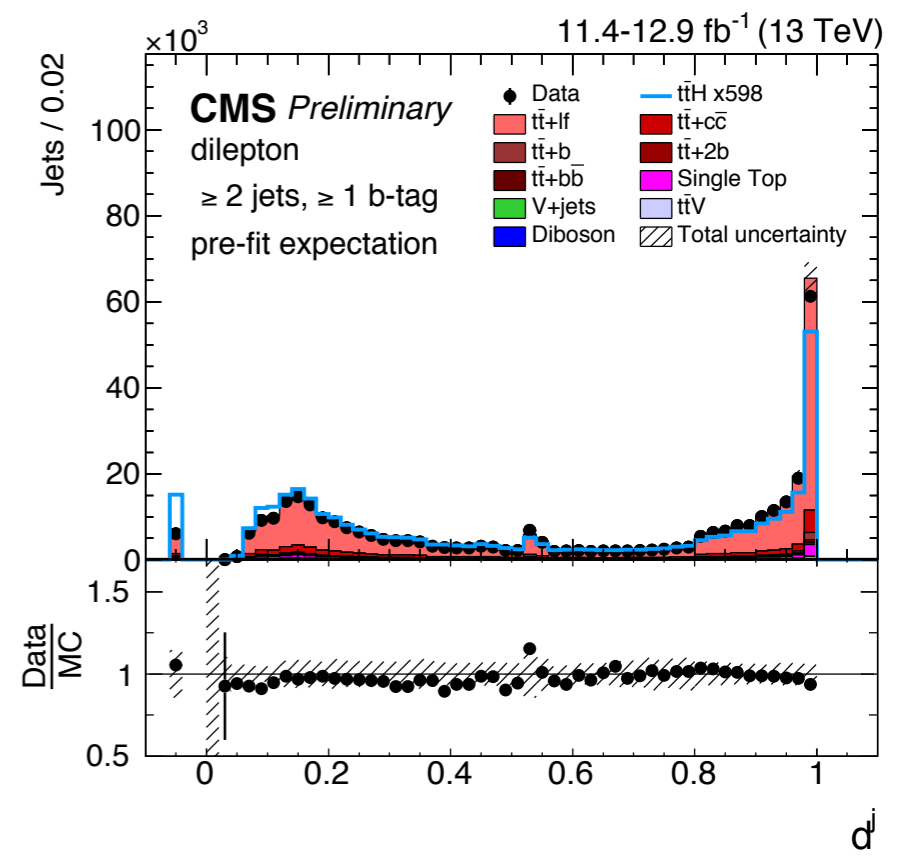
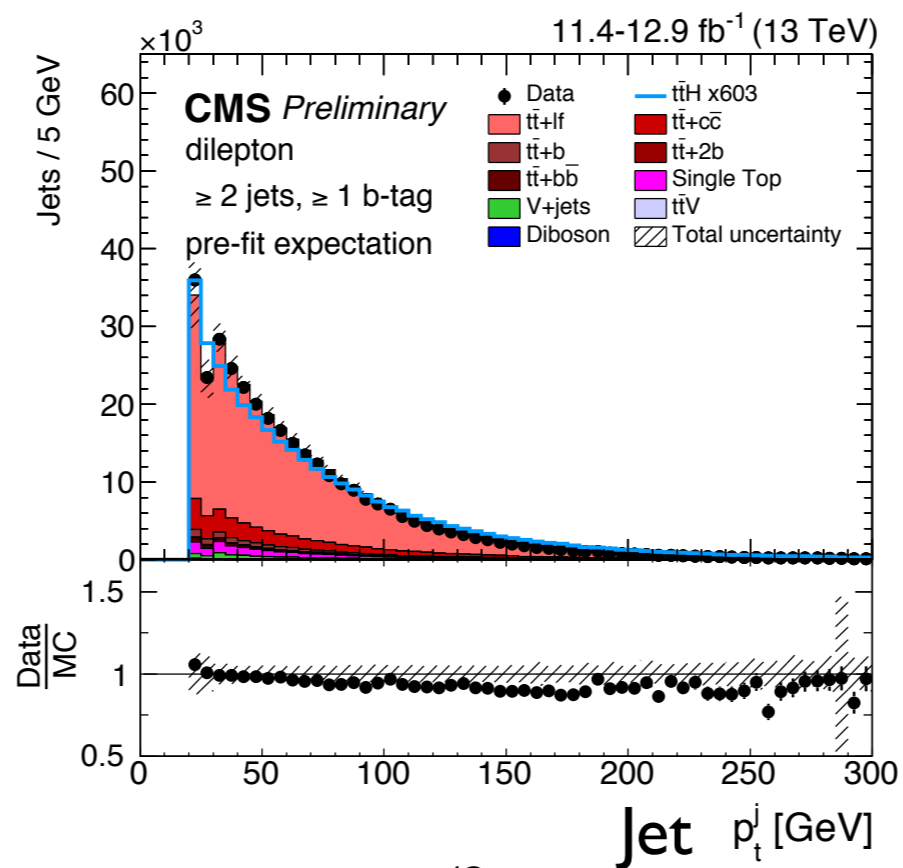
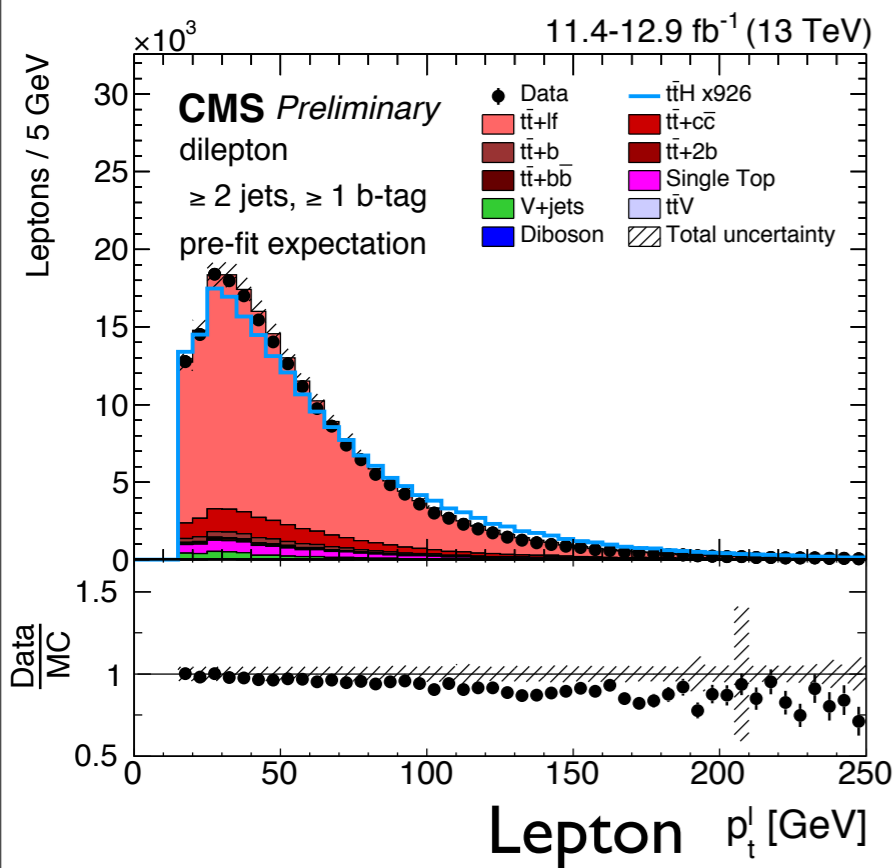
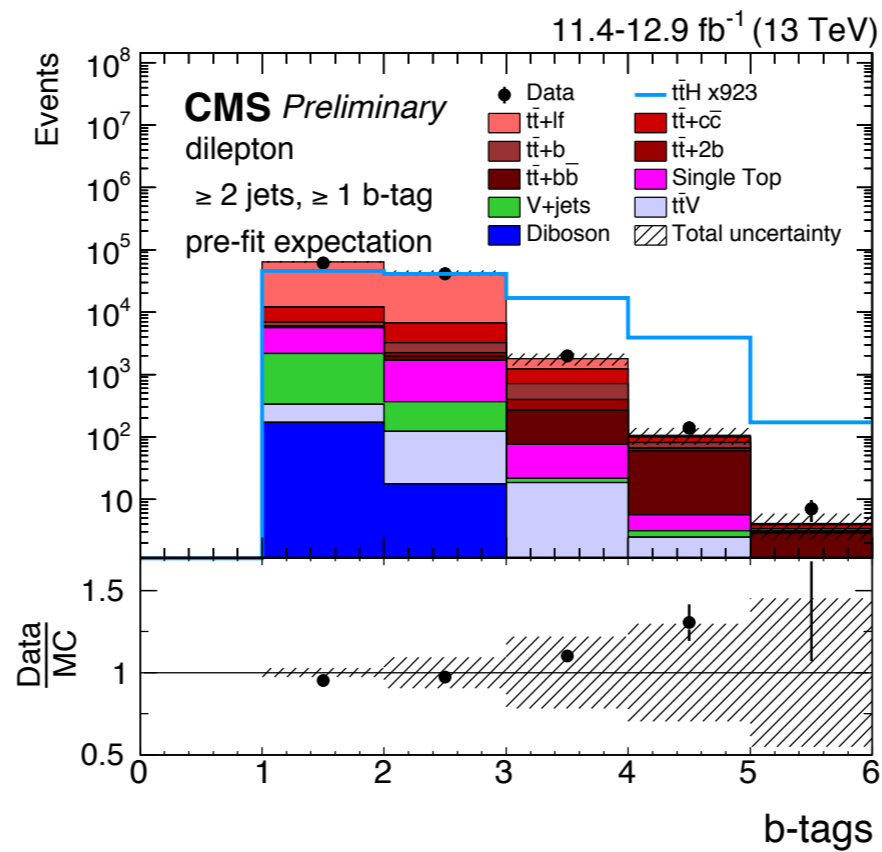
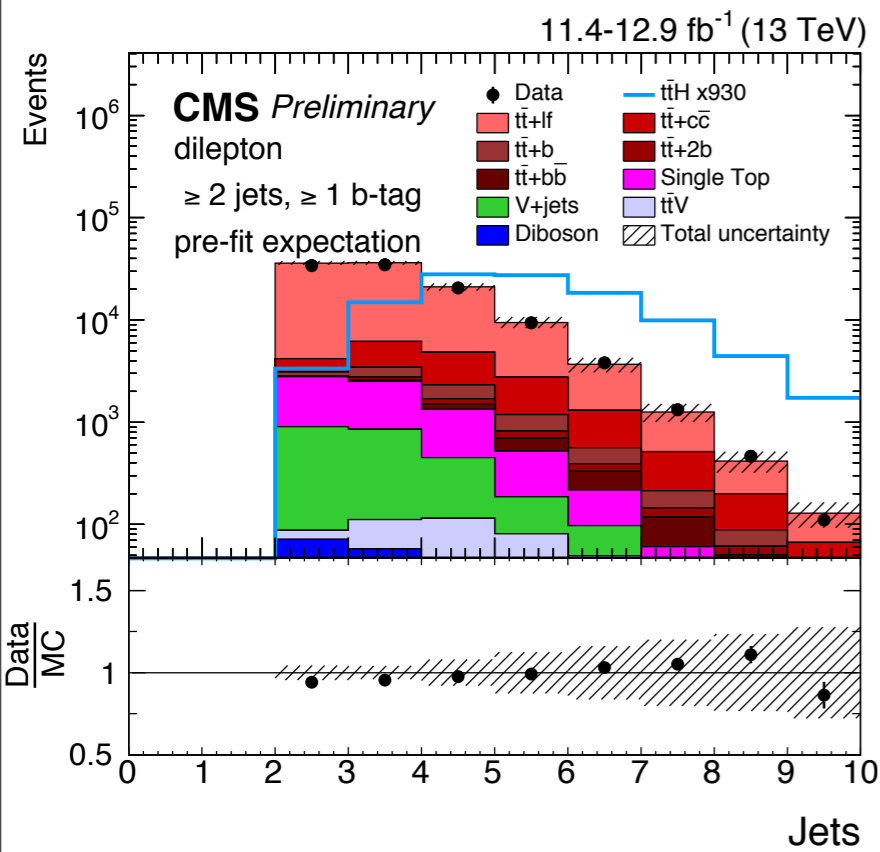
# List of BDT Inputs

4 jets, 4 tags	5 jets, $\geq 4$ tags
$\sum p_T(\text{jets, lepton, MET})$ avg. CSVv2 of b-tagged jets aplanarity $H_3$ $(\sum p_T(\text{jet})) / (\sum E(\text{jet}))$ $M_2$ of min $\Delta R(\text{tag, tag})$	avg. $\Delta\eta(\text{jet, jet})$ HT avg. CSVv2 of b-tagged jets $M_2(\text{tag, tag})$ closest to 125 $M_3$ $\sum p_T(\text{jets, lepton, MET})$ $M_2$ of min $\Delta R(\text{tag, tag})$ aplanarity avg. $\Delta R(\text{tag, tag})$
$\geq 6$ jets, 3 tags	$\geq 6$ jets, $\geq 4$ tags
aplanarity $\sqrt{\Delta\eta(t^{\text{lep}}, \text{bb}) \times \Delta\eta(t^{\text{had}}, \text{bb})}$ $(\sum p_T(\text{jet})) / (\sum E(\text{jet}))$ min $\Delta R(\text{tag, tag})$ 2nd moment of b-tagged jets' CSVv2 $\sum p_T(\text{jets, lepton, MET})$ b-tagging likelihood ratio	best Higgs mass $M_2(\text{tag, tag})$ closest to 125 $M(\text{jets, lepton, MET})$ 4th highest CSVv2 $\sum p_T(\text{jets, lepton, MET})$ 5th highest CSVv2

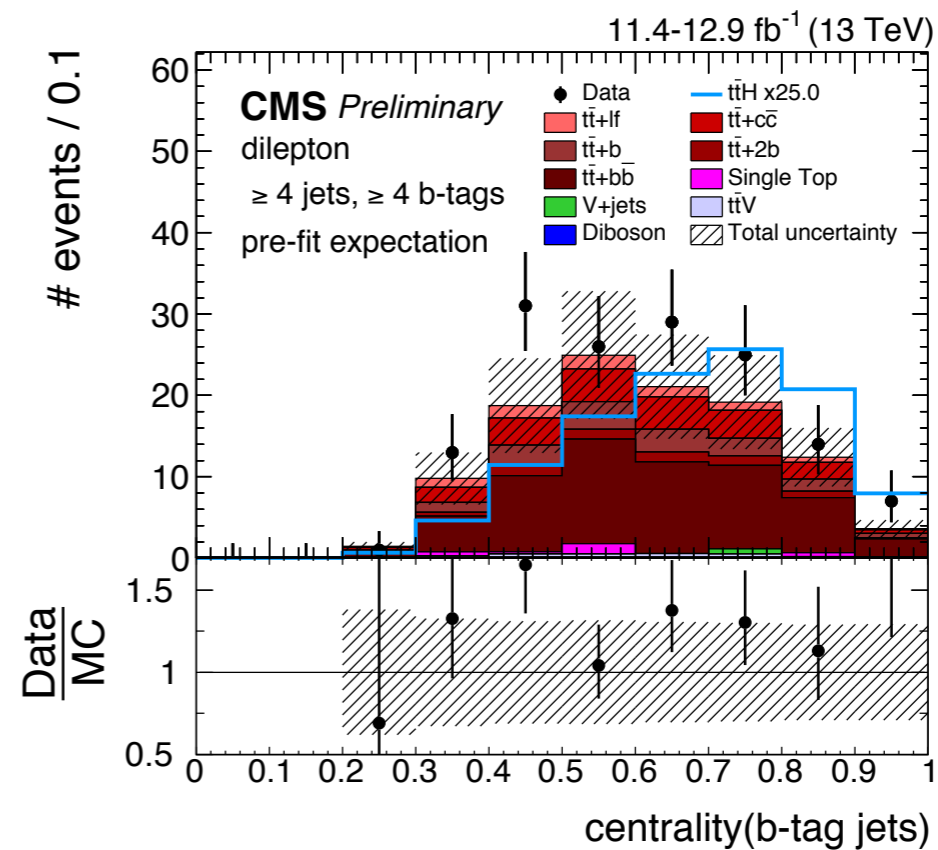
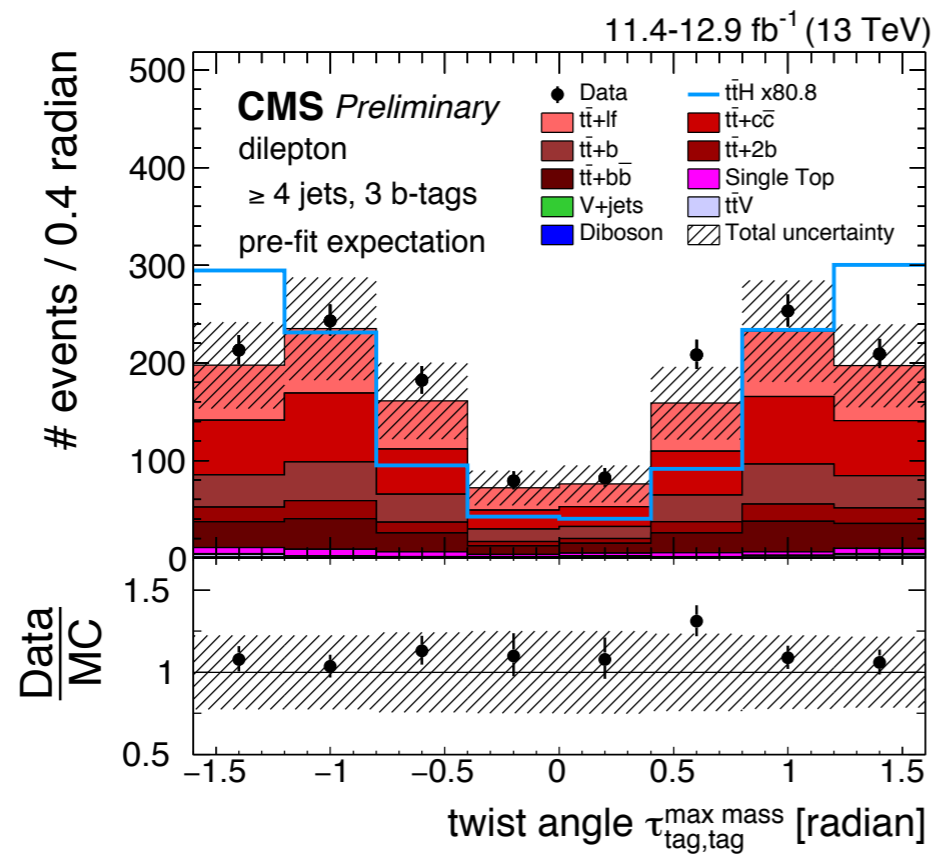
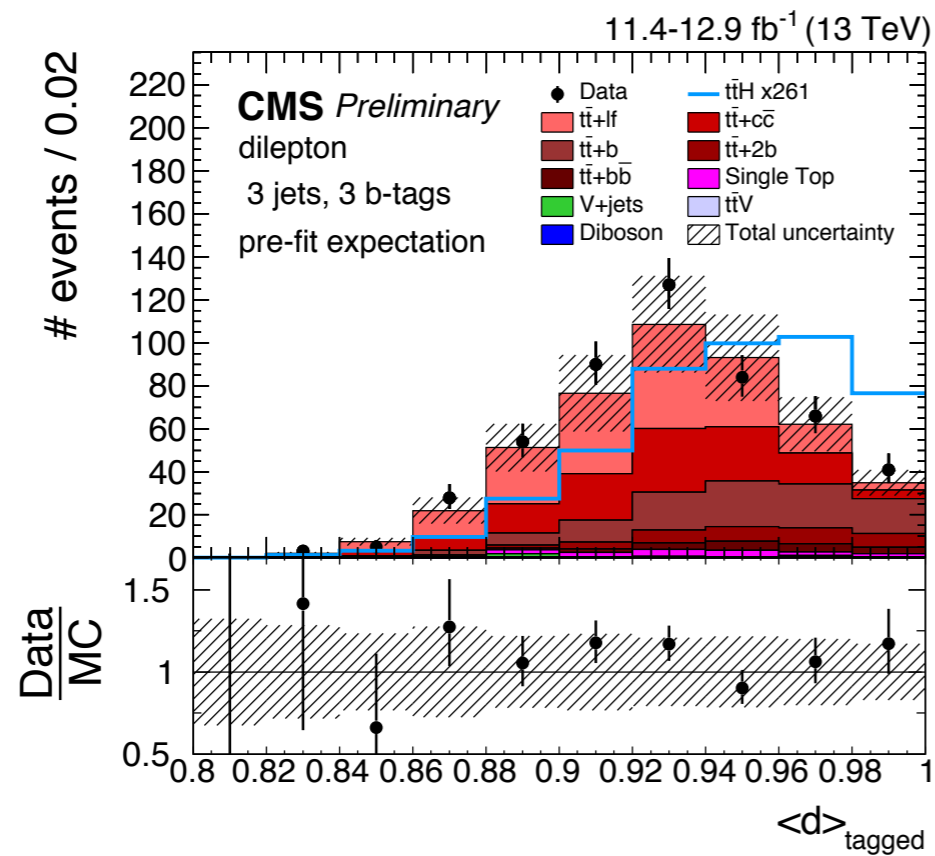
# Extra Variables

# Dilepton

# Dilepton Basics

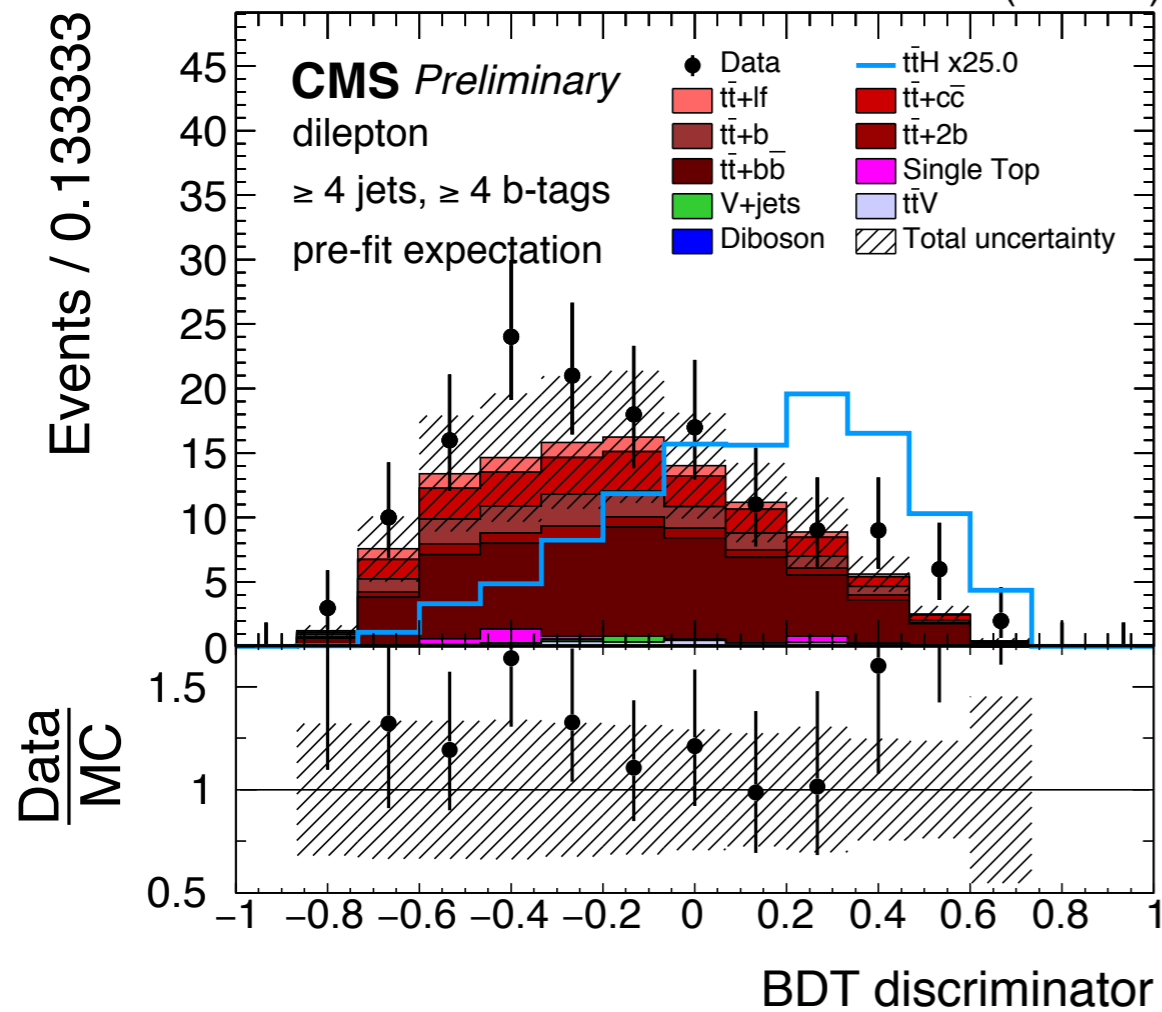


# Dilepton BDT Input

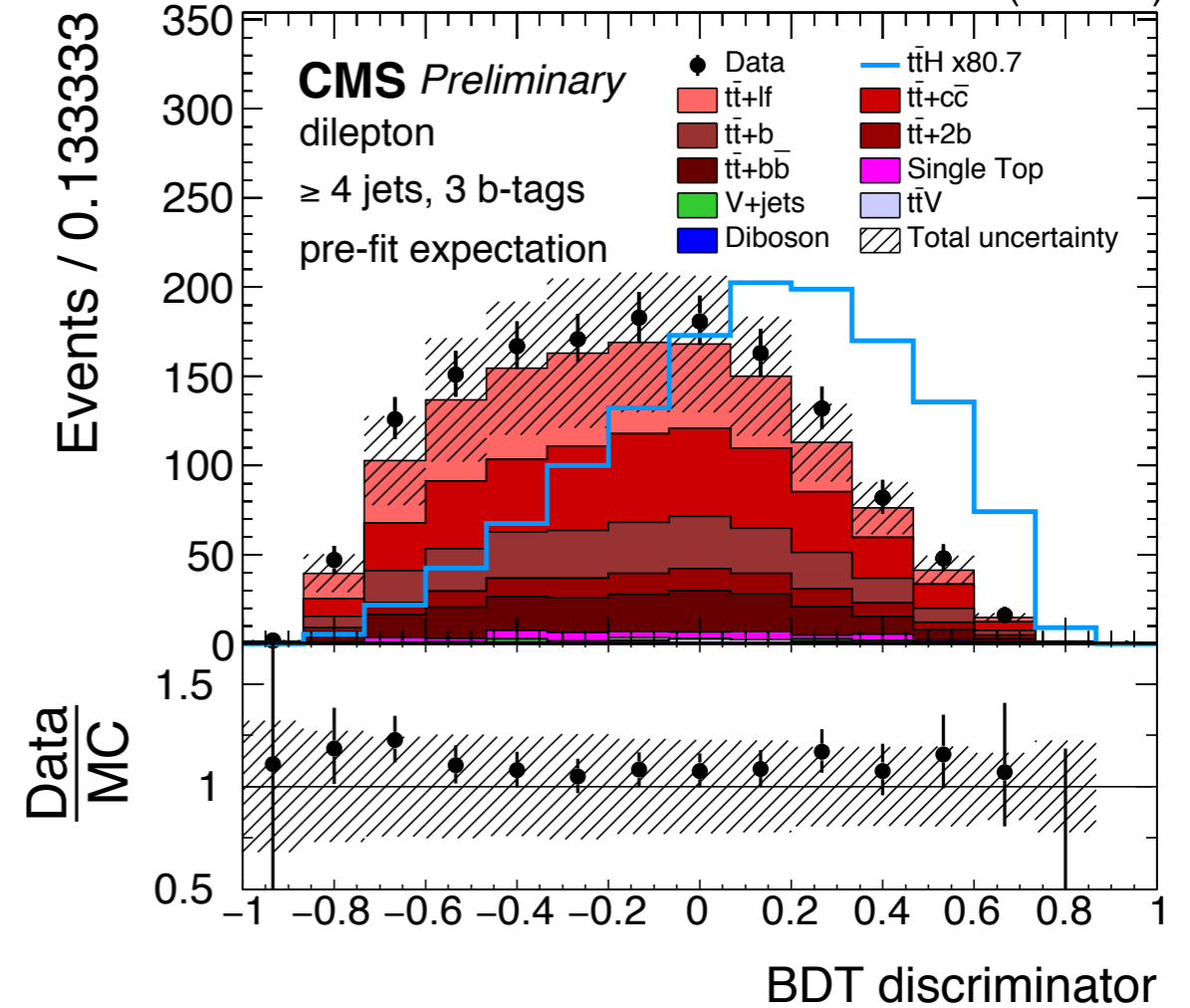


# Dilepton BDT Output

11.4-12.9 fb<sup>-1</sup> (13 TeV)



11.4-12.9 fb<sup>-1</sup> (13 TeV)



# List of BDT Inputs

3 jets, 3 tags	$\geq 4$ jets, 3 tags	$\geq 4$ jets, $\geq 4$ tags
$\langle d \rangle_{\text{tagged}}$	Centrality(jets & leptons)	Centrality(jets & leptons)
$H_1(\text{jets})$	C(jets)	Centrality(tags)
$M_{\text{higgs-like}}^{\text{bj}}$	$H_2(\text{tags})$	$H_T^{\text{tags}}$
$M_{\text{tag,tag}}^{\text{max mass}}$	$M_{\text{higgs-like}}^{\text{jj}}$	$M_{\text{higgs-like}}^{\text{jj}}$
$\min \Delta R_{\text{tag,tag}}$	$M_{\text{jet,jet,jet}}^{\text{max } p_T}$	$\min \Delta R_{\text{jet,jet}}$
$\max \Delta \eta_{\text{jet,jet}}$	$M_{\text{tag,tag}}^{\text{min } \Delta R}$	$M_{\text{jet,tag}}^{\text{min } \Delta R}$
$\min \Delta R_{\text{jet,jet}}$	$\min \Delta R_{\text{tag,tag}}$	$M_{\text{tag,tag}}^{\text{max mass}}$
$\sum p_{T\text{jets,leptons}}$	$\max \Delta \eta_{\text{tag,tag}}$	$M_{\text{tag,tag}}^{\text{min } \Delta R}$
$H_4/H_0(\text{tags})$	$\tau_{\text{tag,tag}}^{\text{max mass}}$	$\max \Delta \eta_{\text{jet,jet}}$
		$\max \Delta \eta_{\text{tag,tag}}$
		median $M_{\text{jet,jet}}$

# Systematics

Source	Type	Remarks
Luminosity	rate	Signal and all backgrounds
Lepton ID/Iso	shape	Signal and all backgrounds
Trigger efficiency	shape	Signal and all backgrounds
Pileup	shape	Signal and all backgrounds
Jet energy scale	shape	Signal and all backgrounds
Jet energy resolution	shape	Signal and all backgrounds
b-tag HF fraction	shape	Signal and all backgrounds
b-tag HF stats (linear)	shape	Signal and all backgrounds
b-tag HF stats (quadratic)	shape	Signal and all backgrounds
b-tag LF fraction	shape	Signal and all backgrounds
b-tag LF stats (linear)	shape	Signal and all backgrounds
b-tag LF stats (quadratic)	shape	Signal and all backgrounds
b-tag charm (linear)	shape	Signal and all backgrounds
b-tag charm (quadratic)	shape	Signal and all backgrounds
QCD scale ( $t\bar{t}H$ )	rate	Scale uncertainty of NLO $t\bar{t}H$ prediction
QCD scale ( $t\bar{t}$ )	rate	Scale uncertainty of NLO $t\bar{t}$ prediction
QCD scale ( $t\bar{t}+HF$ )	rate	Additional 50% rate uncertainty of $t\bar{t}+HF$ predictions
QCD scale (t)	rate	Scale uncertainty of NLO single t prediction
QCD scale (V)	rate	Scale uncertainty of NNLO W and Z prediction
QCD scale (VV)	rate	Scale uncertainty of NLO diboson prediction
pdf (gg)	rate	PDF uncertainty for gg initiated processes except $t\bar{t}H$
pdf (gg $t\bar{t}H$ )	rate	PDF uncertainty for $t\bar{t}H$
pdf (q $\bar{q}$ )	rate	PDF uncertainty of q $\bar{q}$ initiated processes ( $t\bar{t} W, W, Z$ )
pdf (qg)	rate	PDF uncertainty of qg initiated processes (single t)
$Q^2$ scale ( $t\bar{t}$ )	shape	Renormalization and factorization scale uncertainties of the $t\bar{t}$ ME generator, independent for additional jet flavors
PS Scale ( $t\bar{t}$ )	rate	Renormalization and factorization scale uncertainties of the parton shower (for $t\bar{t}$ events), independent for additional jet flavors
Bin-by-bin statistics	shape	statistical uncertainty of the signal and background prediction due to the limited sample size



# Pre-fit Shape impact on lepton+jets j6 t3

Process	$t\bar{t}$ rate up/down [%]	$t\bar{t}H$ rate up/down [%]
Jet energy scale	+12.6/ - 11.8	+8.4/ - 8.0
Jet energy resolution	+0.2/ - 0.3	-0.0/ - 0.1
Pile-up	+0.1/ - 0.1	-0.2/ + 0.1
Electron efficiency	+0.5/ - 0.5	+0.5/ - 0.5
Muon efficiency	+0.4/ - 0.4	+0.4/ - 0.4
Electron trigger efficiency	+1.2/ - 1.2	+1.3/ - 1.3
Muon trigger efficiency	+0.8/ - 0.8	+0.9/ - 0.9
b-Tag HF contamination	-9.4/ + 9.8	-2.6/ + 2.8
b-Tag HF stats (linear)	-3.1/ + 3.3	-2.5/ + 2.7
b-Tag HF stats (quadratic)	+2.6/ - 2.4	+2.4/ - 2.2
b-Tag LF contamination	+7.1/ - 5.2	+5.8/ - 4.5
b-Tag LF stats (linear)	-2.0/ + 4.4	+0.5/ + 1.5
b-Tag LF stats (quadratic)	+2.1/ + 0.2	+1.5/ + 0.5
b-Tag charm Uncertainty (linear)	-11.1/ + 14.9	-3.1/ + 4.1
b-Tag charm Uncertainty (quadratic)	+0.5/ - 0.5	-0.0/ + 0.0
$Q^2$ scale ( $t\bar{t}+LF$ )	-6.2/ + 7.5	-
$Q^2$ scale ( $t\bar{t}+b$ )	-1.7/ + 2.0	-
$Q^2$ scale ( $t\bar{t}+2b$ )	-1.1/ + 1.4	-
$Q^2$ scale ( $t\bar{t}+b\bar{b}$ )	-2.0/ + 2.5	-
$Q^2$ scale ( $t\bar{t}+c\bar{c}$ )	-4.3/ + 5.4	-
PS scale ( $t\bar{t}+LF$ )	+4.8/ - 9.0	-
PS scale ( $t\bar{t}+b$ )	-0.9/ + 0.7	-
PS scale ( $t\bar{t}+2b$ )	-0.8/ + 0.9	-
PS scale ( $t\bar{t}+b\bar{b}$ )	-1.5/ + 2.7	-
PS scale ( $t\bar{t}+c\bar{c}$ )	-3.9/ + 3.0	-