

Search for Flavor Changing Neutral Currents in Top Quark Decays

$$t \rightarrow q\gamma$$

Jason Barkeloo

July 11, 2019



Overview

Brief Background

- The Top Quark
- FCNC at the LHC
- Object Preselection Cuts

Neural Network

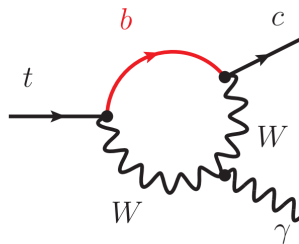
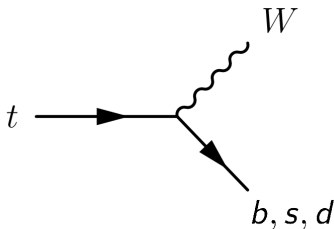
- Neural Network Studies
- Neural Network Cut Applied

Continuing Analysis

- Region Creation
- New Ntuple Production

Outlook and Conclusions

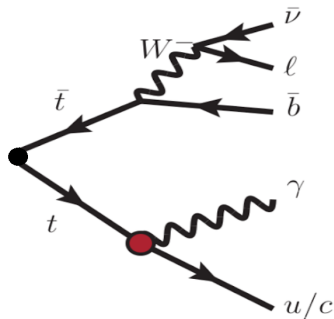
Top Quark Decays in the SM



- ▶ $t \rightarrow bW \approx 99.83\%$
- ▶ $t \rightarrow sW \approx 0.16\%$
- ▶ $t \rightarrow dW \approx 0.01\%$
- ▶ $t \rightarrow q_{u,c}X \approx 10^{-17} - 10^{-12}$
- ▶ Limits on $t \rightarrow \gamma q$ processes:
[JHEP 04 (2016) 035]
 - ▶ $t \rightarrow \gamma u < 1.3 \times 10^{-4}$
 - ▶ $t \rightarrow \gamma c < 1.7 \times 10^{-3}$

FCNC: What are we looking for? $t\bar{t} \rightarrow W(\rightarrow l\nu)b + q\gamma$

- ▶ Final state topology
 - ▶ One Neutrino, from W
 - ▶ One Lepton, from W
 - ▶ One B-jet, SM Top
 - ▶ One Photon, FCNC Top
 - ▶ One Jet, FCNC Top



Object Preselection

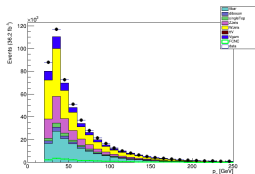
- ▶ We preselect events with objects that look like similar to our expected topology
- ▶ Require:
 - ▶ Exactly one lepton (e or μ) ≥ 25 GeV
 - ▶ Exactly one good photon ≥ 15 GeV
 - ▶ Missing Transverse Energy ≥ 30 GeV
 - ▶ ≥ 1 Jets
- ▶ Plots shown will be with MC16a and Data15/16 (36.2 fb^{-1}) for quicker turnaround
- ▶ N.B. we expect slightly higher MC values - $t\bar{t} + \gamma$ sample not finished in time

Preselection Objects

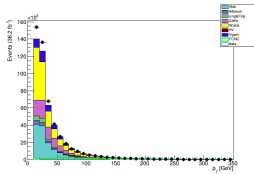
Signal MC Scaled to 1% $\sigma_{t\bar{t}}$

Electron Channel

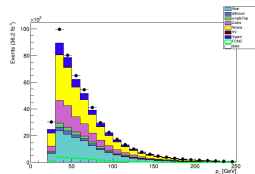
► Leading Jet p_T



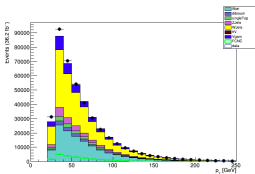
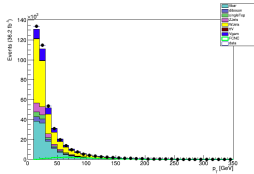
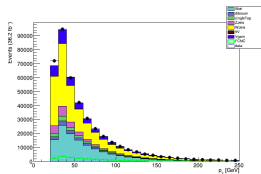
► Lead Photon



► Lepton E



Muon Channel



Neural Network Architecture

- Using Keras on top of Tensorflow various input parameters are tested for model behavior
- A Dense Neural Network with variable number of input variables and hidden layers are explored
- Cut optimization has been performed with full Run 2 luminosity for potential reach of the search

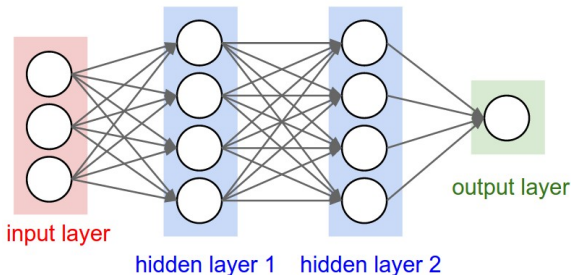


Figure: [Ref: Neural Network]

Neural Network Model Inputs

- ▶ Using keras on top of tensorflow various input parameters are tested for model behavior
- ▶ Networks are set up with 1 input layer, 2 hidden layers with 10 nodes (+1 bias node) [Ref: Bias], and 1 output node
- ▶ Each hidden layer has 20% dropout to prevent overtraining by removing codependency between nodes
- ▶ Batch size of 100 used and each network is allowed 200 epochs (with patience=50), all models converge and end early with reasonable batch sizes
- ▶ Optimizer: Adam
- ▶ Loss Function: Binary Cross Entropy
- ▶ Many sets of input variables tested, best results from follow-up studies shown

Cut Optimization

- ▶ Follow up changes allow a better limit with a cut that is slightly less harsh (0.96/0.95 instead of 0.98)
- ▶ Estimated limit reduced by a factor of 2 by reweighting the number of events the model saw by taking advantage of the loss function

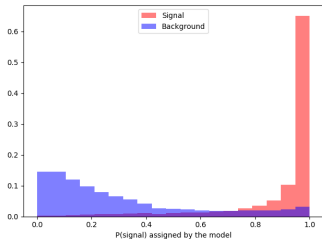
$$\text{Loss} = -\frac{1}{N} \sum_{i=1}^N y_i \log(p(y_i)) + (1 - y_i) \log(1 - p(y_i))$$

- ▶ y - binary indicator (0 or 1) if class label is the correct classification for observation
- ▶ p - predicted probability observation is the class label (0 or 1)

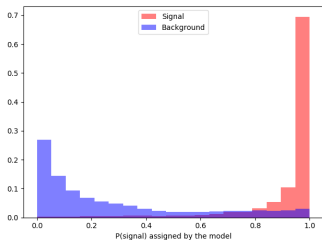
Neural Network Separation

► Previous

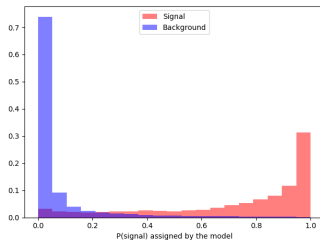
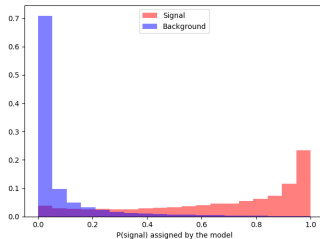
Electron Channel



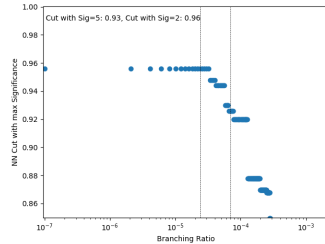
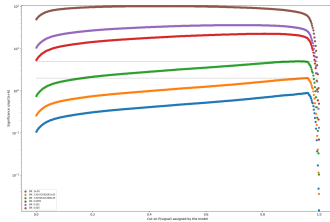
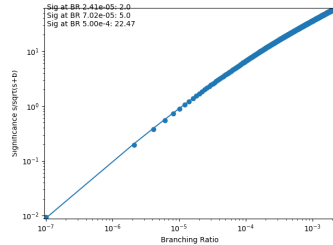
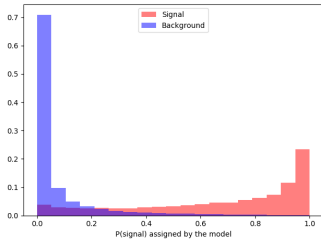
Muon Channel



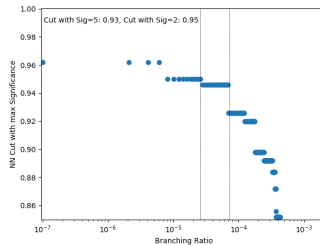
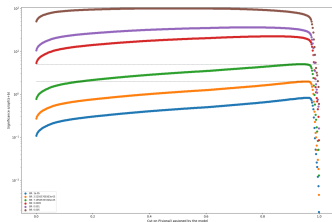
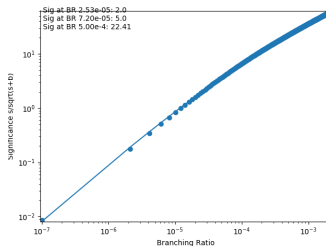
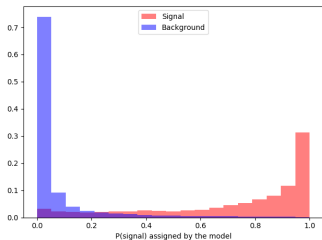
► Current



Significance Plots, Electron Channel



Significance Plots, Muon Channel

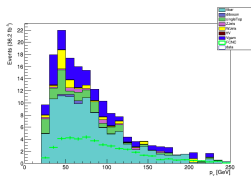


Neural Network Cut Application Muon Channel

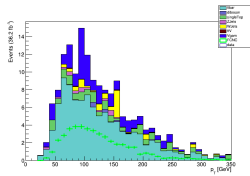
Signal MC Scaled to .01% $\sigma_{t\bar{t}}$

NN(>0.95)

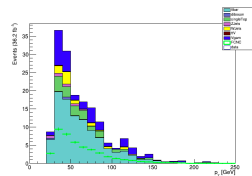
► Leading Jet p_T



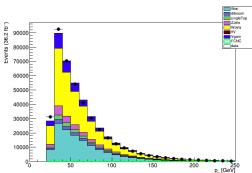
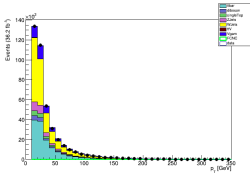
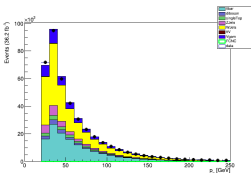
► Lead Photon



► Lepton p_T



NN(≤ 0.95)



Binning becomes more of an issue with such few events in SR.
Semi-erratic event weights start to become apparent with very few events and many bins.

Control and Validation Regions

- ▶ Validation and Control Regions are created orthogonal to Signal Region for large backgrounds
- ▶ VR for $(t\bar{t} + \gamma)$, $(W + \gamma)$
- ▶ CRs for regions without real photons
 - ▶ These regions include $t\bar{t}$ and W rich samples with 0 good photons, so many events new regions should probably be created
- ▶ Previous cuts to make these regions make less sense to do now with NN Cuts since NN contains information on all of these cuts

New Ntuple Production

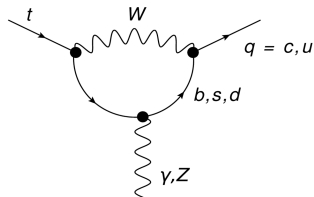
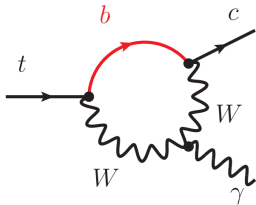
- ▶ New tools have been recently developed in the Top Group (Ref:VGammaORTool, Duplicate Event Removal,etc.)
- ▶ Replacing Custom Event Saver with that of tt+gamma group, more support and faster integration of new tools
- ▶ Custom post-grid local processing code developing
- ▶ Will transition with the currently running ntuples to local mini-ntuple creation
- ▶ Beginning to work with TRExFitter to push toward the statistical part of the analysis

Outlook

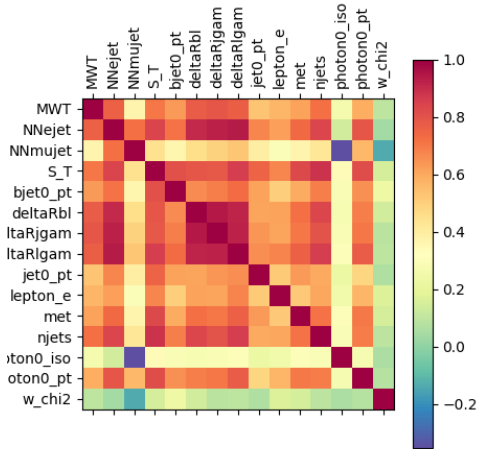
- ▶ As always, still lots to be done
- ▶ Fake Rates $e \rightarrow \gamma$ and $j \rightarrow \gamma$ to be investigated
- ▶ Using full MC16a/Data15,16 for quick iterations, have access to full MC/Data sets
- ▶ Happy with the state of the neural network studies, any further reduction would require significant time for insignificant gain
- ▶ Questions?

Backup

FCNC Diagrams



NN Input Variable Correlations



Neural Network Model Inputs

$$\text{Separation} = \sum_i^{\text{bins}} \frac{n_{si} - n_{bi}}{n_{si} + n_{bi}}$$

mu+jets channel

| Variable | Separation |
|------------|------------|
| photon0iso | 41.18 |
| mqgam | 28.27 |
| photon0pt | 24.07 |
| mtSM | 11.60 |
| mlgam | 7.56 |
| deltaRjgam | 5.64 |
| deltaRbl | 4.42 |
| MWT | 3.34 |
| ST | 3.30 |
| nuchi2 | 3.12 |
| jet0pt | 2.81 |
| njets | 2.07 |
| smchi2 | 1.89 |
| wchi2 | 1.87 |
| jet0e | 1.52 |
| deltaRlgam | 1.17 |
| leptone | 0.87 |
| deltaRjb | 0.86 |
| met | 0.68 |
| bjet0pt | 0.52 |
| leptoniso | 0.27 |

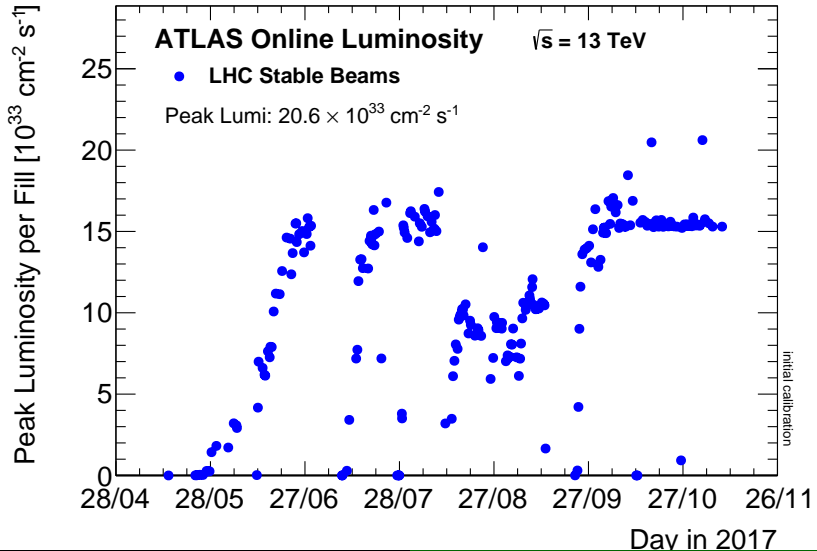
e+jets channel

| Variable | Separation |
|------------|------------|
| photon0pt | 23.14 |
| mqgam | 22.73 |
| photon0iso | 18.70 |
| mtSM | 11.02 |
| mlgam | 9.53 |
| deltaRbl | 5.00 |
| deltaRjgam | 4.60 |
| ST | 3.83 |
| MWT | 3.16 |
| jet0pt | 2.47 |
| njets | 1.70 |
| nuchi2 | 1.59 |
| deltaRlgam | 1.40 |
| wchi2 | 1.33 |
| smchi2 | 1.09 |
| deltaRjb | 0.88 |
| leptone | 0.85 |
| leptoniso | 0.56 |
| bjet0pt | 0.50 |
| met | 0.47 |

Input Variables

```
['photon0iso', 'photon0pt', 'mqgam', 'mlgam', 'mtSM', 'deltaRjgam', 'deltaRbl',  
'MWT', 'ST', 'njets', 'wchi2', 'jet0pt', 'deltaRlgam', 'leptone', 'met', 'bjet0pt']
```

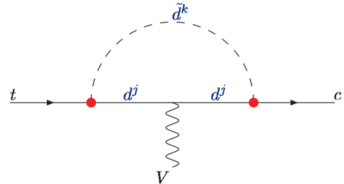
Integrated Luminosity



A Couple BSM Diagrams

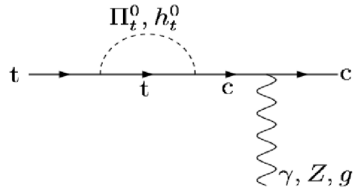
- R-parity-violating supersymmetric models

[arXiv:hep-ph/9705341]



- Top-color-assisted technicolor models

[arXiv:hep-ph/0303122]



Jets/AntiKT

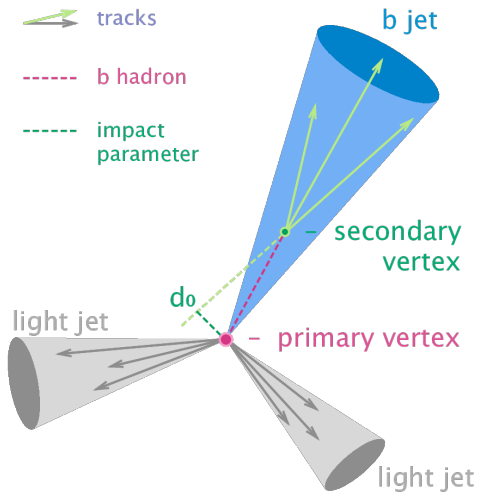
$$d_{ij} = \min\left(\frac{1}{p_{ti}^2}, \frac{1}{p_{tj}^2}\right) \frac{\Delta_{ij}^2}{R^2}$$

$$d_{iB} = \frac{1}{p_{ti}^2}$$

$$\Delta_{ij}^2 = (\eta_i - \eta_j)^2 + (\phi_i - \phi_j)^2$$

- ▶ Find minimum of entire set of $\{d_{ij}, d_{iB}\}$
- ▶ If d_{ij} is the minimum particles i, j are combined into one particle and removed from the list of particles
- ▶ If d_{iB} is the minimum i is labelled as a final jet and removed from the list of particles
- ▶ Repeat until all particles are part of a jet with distance between jet axes Δ_{ij} is greater than R

B-tagging



$$\mathcal{L}_{tq\gamma}^{\text{eff}} = -e\bar{c}\frac{i\sigma^{\mu\nu}q_\nu}{m_t}(\lambda_{ct}^L P_L + \lambda_{ct}^R P_R)tA_\mu + H.c.$$