

# Bin-By-Bin Uncertainty Pruning (based on Moriond results)

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on behalf of the  $H \rightarrow \tau\tau$  group

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# Introduction

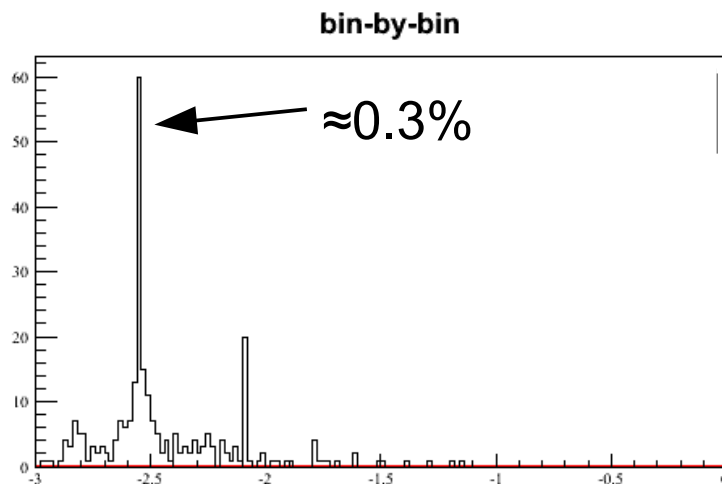
- Adding bin-by-bin uncertainties adds up **689 additional nuisance parameters** to the combined datacard
  - Used here: **Moriond analyses** =  $e\mu + e\tau + \mu\mu + \mu\tau + \tau\tau$
- Maximum likelihood fit takes **~12h**
  - Time does NOT increase linearly with number of nuisance parameters
- Tool in **HiggsToTauTau** package to **prune number of bin-by-bin uncertainties (and only those)**: *prune\_bbb\_errors.py*
  - Check usage from **SWGGuideHiggs2TauLimits**

# Pruning Methods

■ Three ways of bin-by-bin uncertainty pruning implemented:

- **--byLimit** (using tools of HCG<sup>1)</sup>):

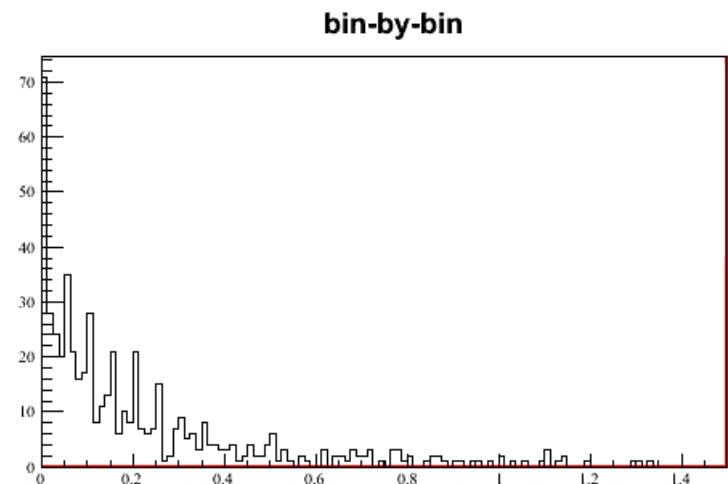
Neglect bin-by-bin uncertainties that have only **small effect on asymptotic limit** (only feasible if split by channel).



$\log_{10}(\text{rel. effect on the limit})$ .

- **--byPull**:

Neglect bin-by-bin uncertainties that are **pulled by less than a certain threshold** (feasible on combined datacards).



Pull by max-likelihood fit (in  $\sigma$ ).

<sup>1)</sup> HCG=Higgs Combination Group

# Pruning Methods

■ Three ways of bin-by-bin uncertainty pruning implemented:

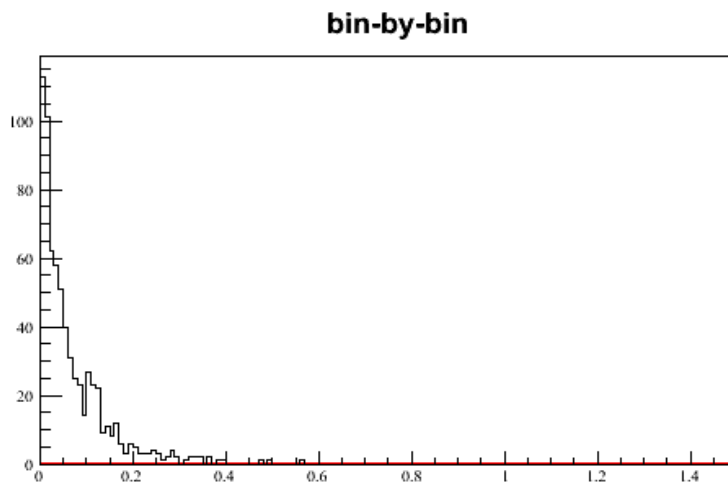
- **--byShift:**

Neglect bin-by-bin uncertainties that are **shifted by less than a certain threshold** (feasible on combined datacards).

- **--shield-bins:**

Additional option to **save bin-by-bin uncertainties of bins „in the signal region“** from being pruned.

Current implementation: mass window of  $\pm 30\%$  around 125 GeV (87.5 GeV to 162.5 GeV).



Relative shift by max-likelihood fit

# Pruning --byLimit

- Run asymptotic CLs with *combine* with all bin-by-bin uncertainties and with each bin-by-bin uncertainty excluded (i.e. „690 times“).
- Check **effect of bin-by-bin uncertainties on asymptotic limit**.  
Chose between effect on *exp*, *obs* or *all*: $\max(\text{exp}, \text{obs})$ .
- Very computing intensive. Therefore only feasible if **datacards splitted in channels and determined channel-wise**.
- Does it make sense to have the limit itself decide wheter to accept the nuisance parameter or not?
- Is the limit the right metric? E.g. uncertainties have bigger effect on significance.

# Pruning --byPull

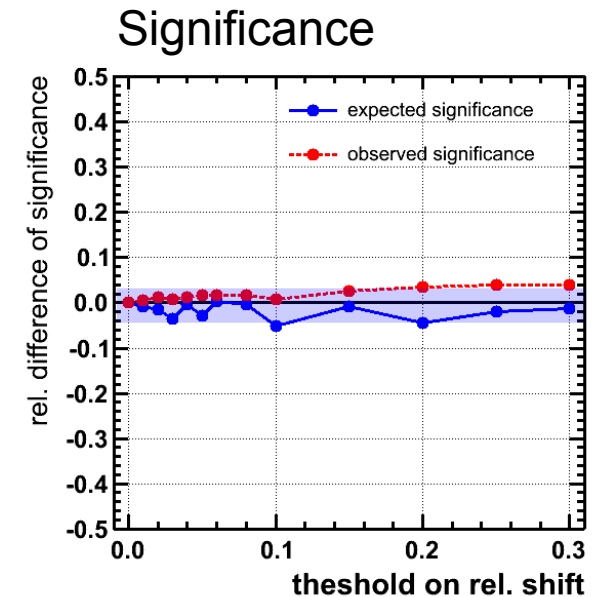
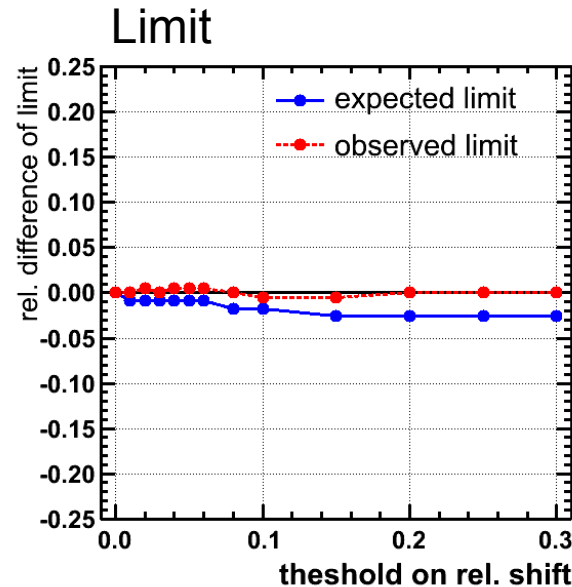
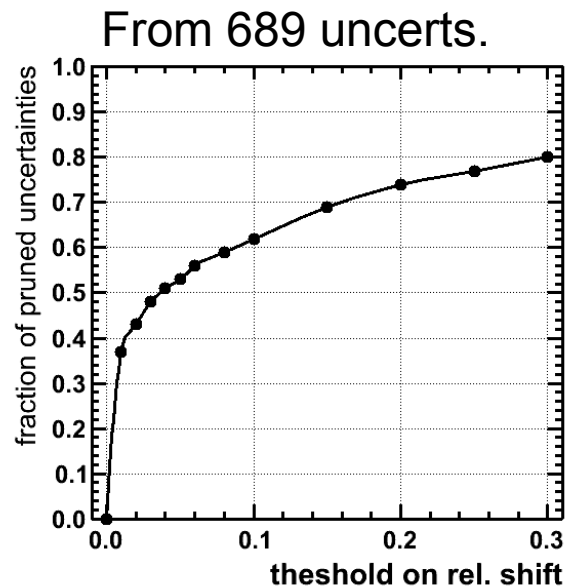
- Run Maximum Likelihood fit with *combine* with all bin-by-bin uncertainties included (i.e. „once“).
- Check **pull of bin-by-bin uncertainties** .  
Chosse between pull on *b-only*, *s+b* or *all*:  $\max(b\text{-only}, s+b)$ .
- Feasible to run on **combined datacards**.
- **Problem**: Small pulls for large uncertainties do not necessarily mean small effects on the results.

# Pruning --byShift

- Run Maximum Likelihood fit with *combine* with all bin-by-bin uncertainties included (i.e. „once“).
- Check **pull of bin-by-bin uncertainties • size of the original uncertainty** (corresponds to relative shift).  
Chosse between pull on *b-only*, *s+b* or *all*:  $\max(b\text{-only}, s+b)$ .
- Feasible run on **combined datacards**.
- **Better measure of effect on results** (small shift  $\rightarrow$  small effect on limits)
- Proper threshold to be defined. Minimize influence on significance and limit.

# Test of --byShift implementation (w/o 'shielding')

## ■ Checking effects on Limit and (Bayesian) Significance



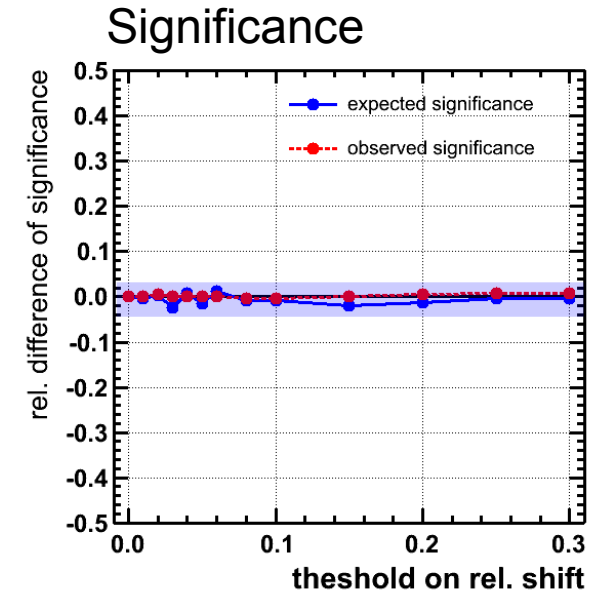
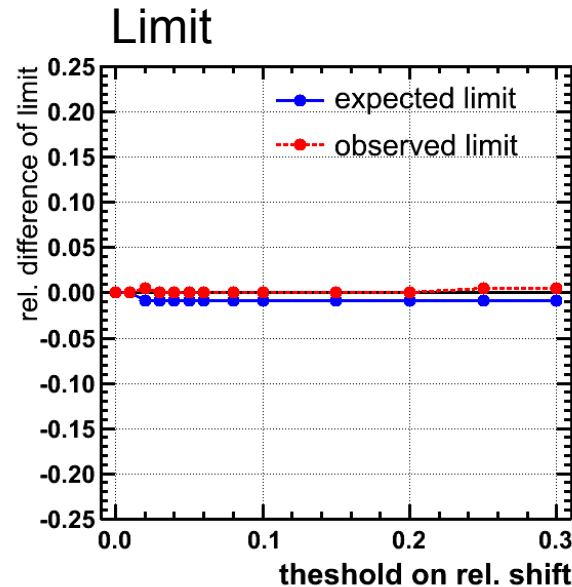
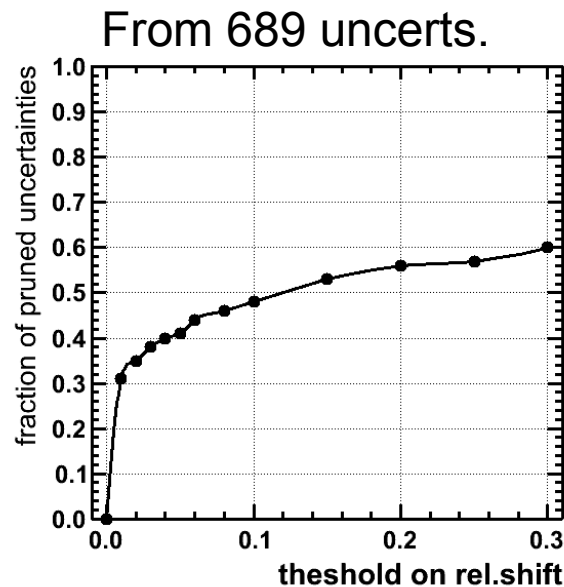
App.  $\pm 3.2\%$  stat. uncertainty from 1000 independent toys.

**Effects < 3% shifts on limit, < 5 % in significance**



# Test of --byShift implementation (w/ 'shielding')

## ■ Checking effects on Limit and (Bayesian) Significance



App.  $\pm 3.2\%$  stat. uncertainty from 1000 independent toys.

**Effects  $< 1\%$  shifts on limit,  $< 3\%$  in significance**

# Conclusions and actual Status Quo

- Three ways to prune bin-by-bin uncertainties have been implemented and tested.
- **Chose pruning --byShift**. Biases in the order of 3-5%. „Shielding“ of bins in the signal region does reduce biases on obs. and exp. limit or significance to 1-3%.
- Could go with a fairly high threshold, but it improves the computing performance already a lot to **prune just those 10-20% of the nuisance parameters, which do have only a small shift** in the fit.
- **Status Quo** (= done for Moriond):
  - Go with --byShift
  - „Shielding“ of 125GeV  $\pm 30\%$  window
  - Threshold of 0.3
    - → number of bin-by-bin uncertainties reduces from **689 to 276**
    - → Maximum Likelihood fit takes **~2h (down from ~12h)**

# BACKUP

# Bin-by-bin Uncertainties to $H\tau\tau$ Analysis

- For each bin of a histogram add a shape uncertainty by scaling that bin up and down by its statistical error (all other bins stay as they are)
  - 2 additional histograms UP and DOWN
  - Add bin-by-bin if stat uncertainty  $>10\%$  ( $>1\%$  for  $\tau\tau$ )
- Renormalize the UP and DOWN histograms in respect to the central value histogram
- Tool in [HiggsToTauTau](#) package to add bin-by-bin uncertainties:  
*add\_bbb\_errors.py* (makes use of *add\_stat\_shapes.py*)
  - Check usage from [SWGGuideHiggs2TauLimits](#)