

```
In [1]: %cd ../../
```

```
/home/jan/FMF/masters
```

```
In [2]: saved = "ml_hep_sim/analysis/results/ul/"
```

Get hists pipeline

```
In [3]: from ml_hep_sim.analysis.hists_pipeline import get_hists_pipeline
```

```
In [4]: use_class = False
```

```
hists_pipeline = get_hists_pipeline(use_classifier=use_class)
hists_pipeline.pipes = hists_pipeline.pipes[:-1] # this one only makes 1 hist
```

```
WARNING:root:available variables: {'lepton pT': 0, 'lepton eta': 1, 'missing energy': 2, 'jet1 pT': 3, 'jet1 eta': 4, 'jet2 pT': 5, 'jet2 eta': 6, 'jet3 pT': 7, 'jet3 eta': 8, 'jet4 pT': 9, 'jet4 eta': 10, 'm jj': 11, 'm jjj': 12, 'm lv': 13, 'm jlv': 14, 'm bb': 15, 'm wbb': 16, 'm wwbb': 17}
```

```
In [5]: if use_class:
        saved += "class_"
    else:
        saved += "mbb_"
```

```
In [6]: saved
```

```
Out[6]: 'ml_hep_sim/analysis/results/ul/mbb_'
```

Make many hists

```
In [7]: from ml_hep_sim.analysis.hists_pipeline import MakeHistsFromSamplesLumi
        from ml_hep_sim.analysis.ul_pipeline import UpperLimitScannerBlock
        import numpy as np
```

```
In [8]: lumi_start, lumi_end, lumi_step = 10, 300, 24
        lumi = [lumi_start, lumi_end, lumi_step]
```

```
sig_frac = 0.1
xsec = 10
```

Lumi table

```
In [9]: _sig, _bkg = [], []

        for l in np.linspace(*lumi):
            _sig.append(l * xsec * sig_frac)
            _bkg.append(l * xsec)
            print(f"lumi: {l} sig: {_sig[-1]}, bkg: {_bkg[-1]}")
```

```
lumi: 10.0 sig: 10.0, bkg: 100.0
lumi: 22.608695652173914 sig: 22.608695652173914, bkg: 226.08695652173913
lumi: 35.21739130434783 sig: 35.21739130434783, bkg: 352.17391304347825
lumi: 47.826086956521735 sig: 47.82608695652174, bkg: 478.2608695652174
lumi: 60.43478260869565 sig: 60.434782608695656, bkg: 604.3478260869565
lumi: 73.04347826086956 sig: 73.04347826086956, bkg: 730.4347826086956
lumi: 85.65217391304347 sig: 85.65217391304348, bkg: 856.5217391304348
lumi: 98.26086956521739 sig: 98.26086956521739, bkg: 982.6086956521739
lumi: 110.8695652173913 sig: 110.86956521739131, bkg: 1108.695652173913
lumi: 123.4782608695652 sig: 123.4782608695652, bkg: 1234.782608695652
lumi: 136.08695652173913 sig: 136.08695652173913, bkg: 1360.8695652173913
lumi: 148.69565217391303 sig: 148.69565217391303, bkg: 1486.9565217391303
lumi: 161.30434782608694 sig: 161.30434782608697, bkg: 1613.0434782608695
lumi: 173.91304347826085 sig: 173.91304347826087, bkg: 1739.1304347826085
lumi: 186.52173913043478 sig: 186.52173913043478, bkg: 1865.2173913043478
lumi: 199.1304347826087 sig: 199.13043478260872, bkg: 1991.304347826087
lumi: 211.7391304347826 sig: 211.73913043478262, bkg: 2117.391304347826
lumi: 224.3478260869565 sig: 224.3478260869565, bkg: 2243.478260869565
lumi: 236.9565217391304 sig: 236.9565217391304, bkg: 2369.565217391304
lumi: 249.56521739130434 sig: 249.56521739130437, bkg: 2495.6521739130435
lumi: 262.17391304347825 sig: 262.17391304347825, bkg: 2621.7391304347825
lumi: 274.78260869565213 sig: 274.78260869565213, bkg: 2747.826086956521
lumi: 287.39130434782606 sig: 287.39130434782606, bkg: 2873.9130434782605
lumi: 300.0 sig: 300.0, bkg: 3000.0
```

UL setup

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

[illegible]

```
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=236.956521739  
1304 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=300.0 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=274.782608695  
65213 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=224.347826086  
9565 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=287.391304347  
82606 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=249.565217391  
30434 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=262.173913043  
47825 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=10.0 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=22.6086956521  
73914 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=35.2173913043  
4783 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=47.8260869565  
21735 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=60.4347826086  
9565 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=85.6521739130  
4347 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=73.0434782608  
6956 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=136.086956521  
73913 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=211.739130434  
7826 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=123.478260869  
5652 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=110.869565217  
3913 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=98.2608695652  
1739 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=148.695652173  
91303 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=199.130434782  
6087 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=161.304347826  
08694 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=186.521739130  
43478 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=173.913043478  
26085 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=224.347826086  
9565 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=287.391304347  
82606 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=262.173913043  
47825 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=300.0 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=236.956521739  
1304 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=249.565217391  
30434 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d739190> with N=274.782608695  
65213 done  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=10.0 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=73.0434782608  
6956 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=35.2173913043  
4783 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=47.8260869565  
21735 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=85.6521739130  
4347 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=60.4347826086  
9565 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=98.2608695652  
1739 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=123.478260869  
5652 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=22.6086956521  
73914 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=136.086956521  
73913 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=110.869565217  
3913 in loop  
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=148.695652173  
91303 in loop  
WARNING:root:calculator <ml hep sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=161.304347826
```

08694 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=173.913043478
26085 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=211.739130434
7826 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=186.521739130
43478 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=199.130434782
6087 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=236.956521739
1304 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=224.347826086
9565 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=274.782608695
65213 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=287.391304347
82606 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=300.0 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=262.173913043
47825 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=249.565217391
30434 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca802ccb20> with N=10.0 done
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73914 done
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21735 done
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9565 done
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4347 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=98.2608695652
1739 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=136.086956521
73913 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=73.0434782608
6956 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=211.739130434
7826 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=186.521739130
43478 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=148.695652173
91303 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=123.478260869
5652 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=110.869565217
3913 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=274.782608695
65213 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=161.304347826
08694 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=173.913043478
26085 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=249.565217391
30434 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=224.347826086
9565 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=199.130434782
6087 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=236.956521739
1304 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=300.0 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=287.391304347
82606 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7a90> with N=262.173913043
47825 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=10.0 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=22.6086956521
73914 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=73.0434782608
6956 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=47.8260869565
21735 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=110.869565217
3913 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=35.2173913043
4783 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=123.478260869
5652 in loop
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d733a30> with N=98.2608695652
1739 in loop

[illegible]

[illegible]

[illegible]

[illegible]

```

WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=136.086956521
73913 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=186.521739130
43478 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=148.695652173
91303 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=211.739130434
7826 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=161.304347826
08694 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=262.173913043
47825 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=287.391304347
82606 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=224.347826086
9565 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=300.0 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=173.913043478
26085 done
WARNING:root:calculator <ml_hep_sim.stats.ul.UpperLimitCalculator object at 0x7fca4d6f7fd0> with N=199.130434782
6087 done

```

```
Out[15]: <ml_hep_sim.pipeline.pipes.Pipeline at 0x7fca7c2541f0>
```

```
In [16]: # idx for results from pipeline
idxs_gen = [-1, -3, -5, -7, -9, -11]
idxs_mc = [-13, -15, -17, -19, -21, -23]
```

```
In [17]: sig_fracs
```

```
Out[17]: array([0.01 , 0.028, 0.046, 0.064, 0.082, 0.1  ])
```

Plot UL

```
In [18]: import matplotlib.pyplot as plt
from ml_hep_sim.plotting.style import style_setup, set_size

set_size()
style_setup(seaborn_pallete=True)
```

```
In [19]: for i, (idx_gen, idx_mc) in enumerate(zip(idxs_gen, idxs_mc)):
    res_gen = pipe.pipes[idx_gen].results
    res_mc = pipe.pipes[idx_mc].results

    plt.fill_between(res_mc.N, res_mc.minus_sigma_2, res_mc.plus_sigma_2, color="yellow", label="$\pm 2\sigma$")
    plt.fill_between(res_mc.N, res_mc.minus_sigma_1, res_mc.plus_sigma_1, color="green", label="$\pm 1\sigma$")

    plt.plot(res_mc.N, res_mc.minus_sigma_1, c='k', ls='dotted')
    plt.plot(res_mc.N, res_mc.minus_sigma_2, c='k', ls='dotted')

    plt.plot(res_mc.N, res_mc.plus_sigma_1, c='k', ls='dotted')
    plt.plot(res_mc.N, res_mc.plus_sigma_2, c='k', ls='dotted')

    plt.plot(res_mc.N, res_mc.cls_obs, zorder=20, color='k', label="$\mu$ MC obs")
    plt.plot(res_mc.N, res_mc.cls_exp, color='k', ls='--', label="$\mu$ exp")

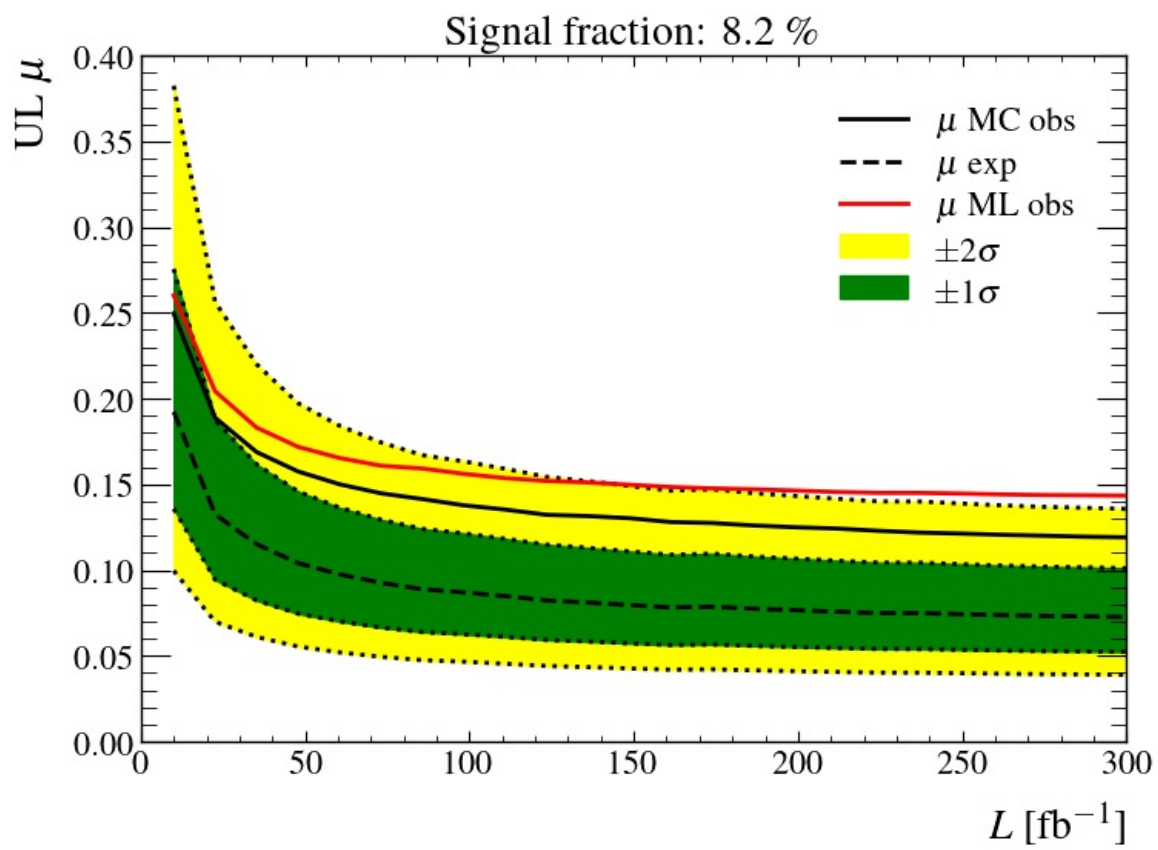
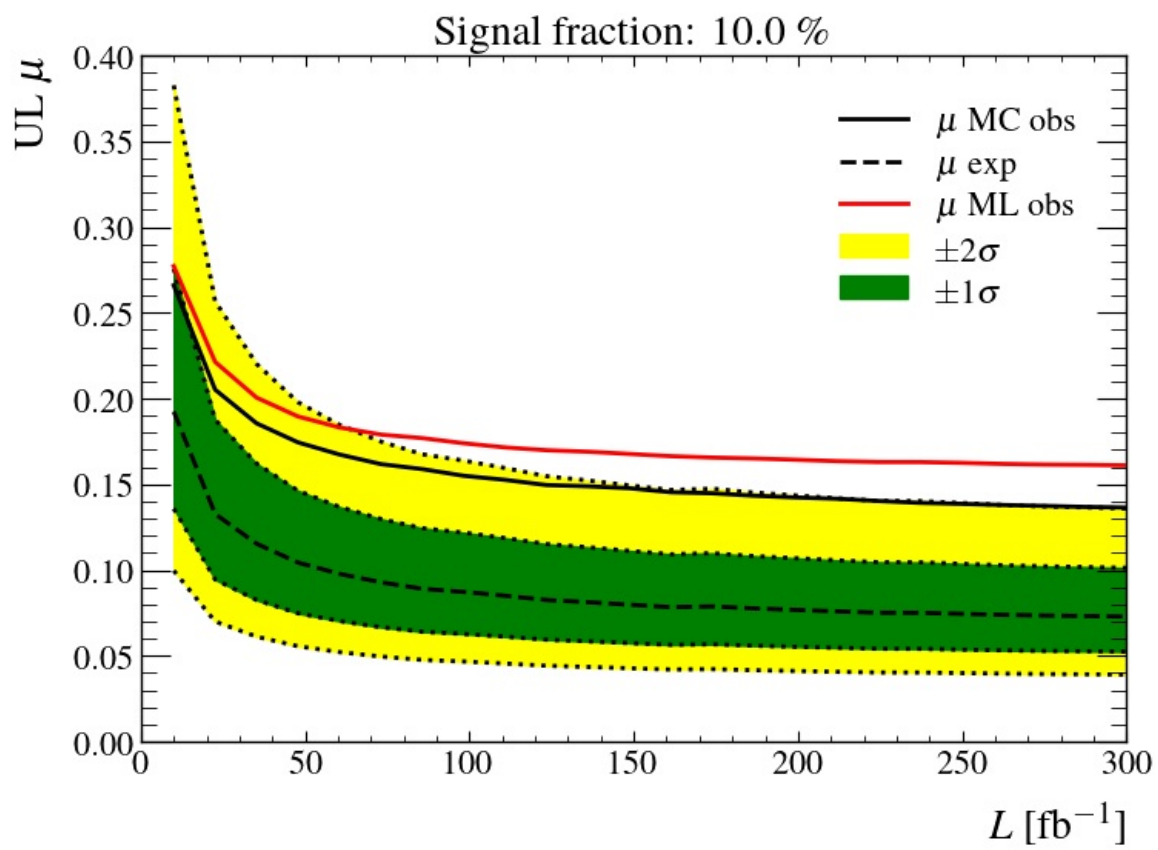
    plt.plot(res_gen.N, res_gen.cls_obs, zorder=20, color='r', label="$\mu$ ML obs")
    # plt.plot(res_gen.N, res_gen.cls_exp, color='r', ls='--', label="$\mu$ exp")

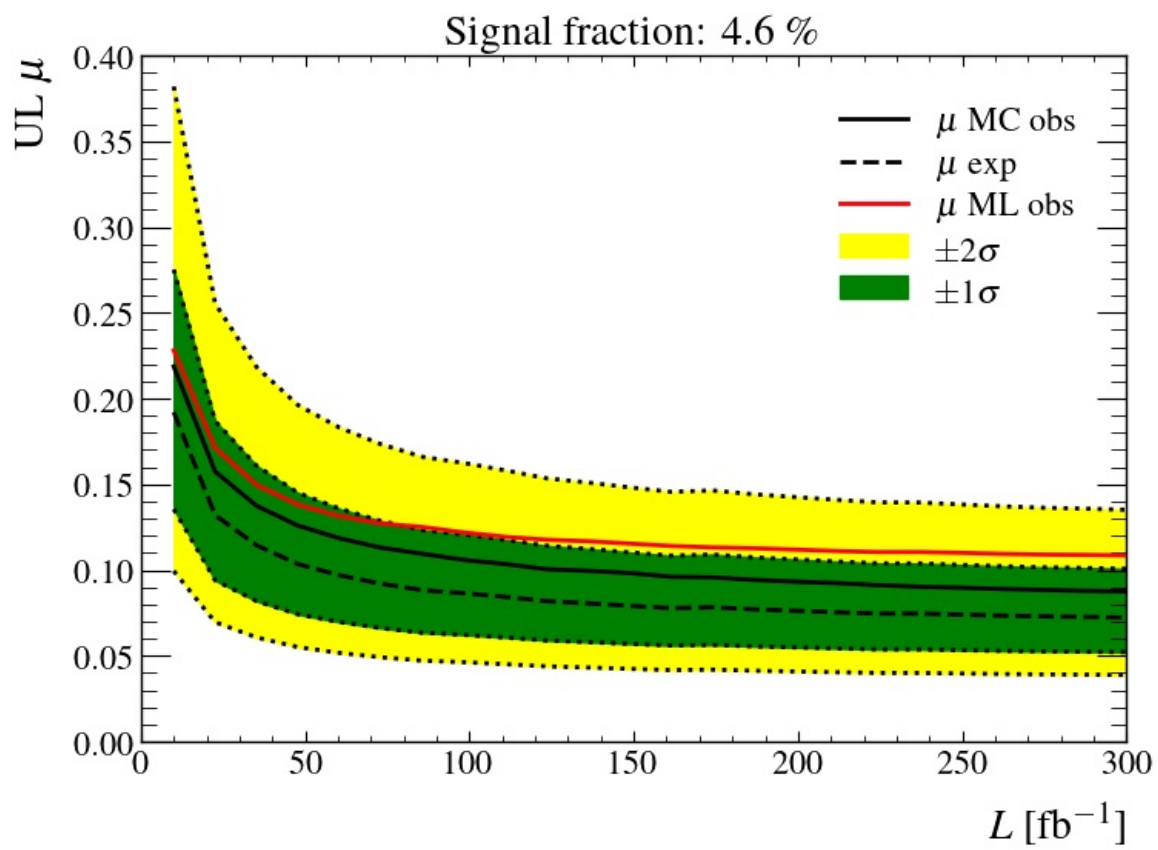
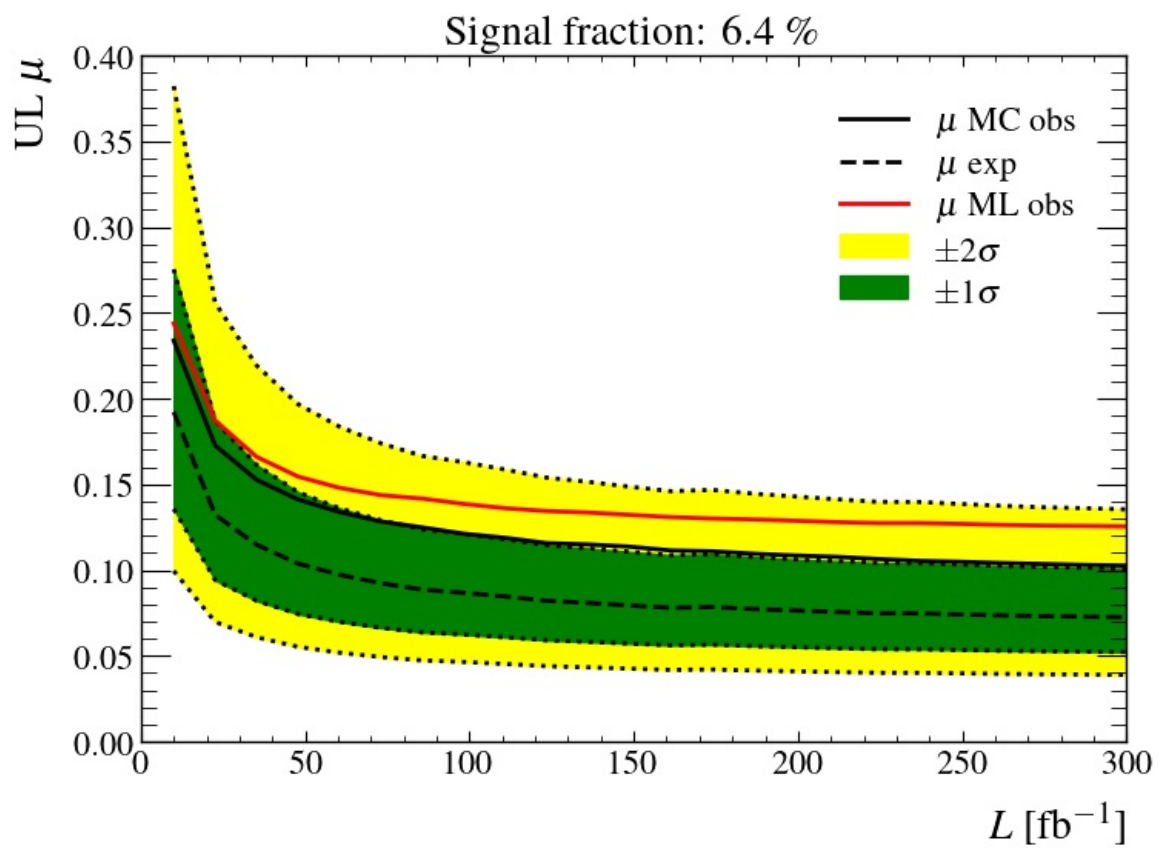
    # plt.xlabel("$N_{gen}^{bkg}$", loc="center")
    plt.xlabel("$L$ [fb$^{-1}$]")
    plt.ylabel("UL $\mu$")

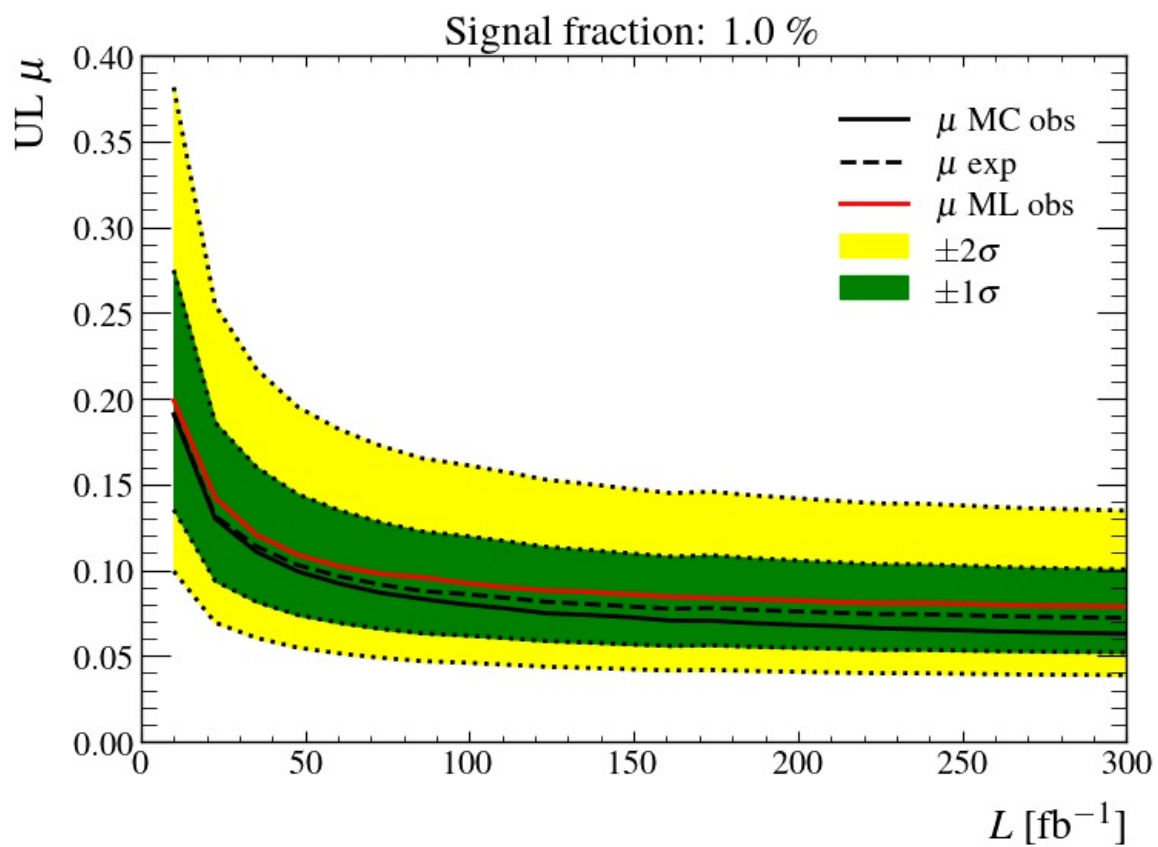
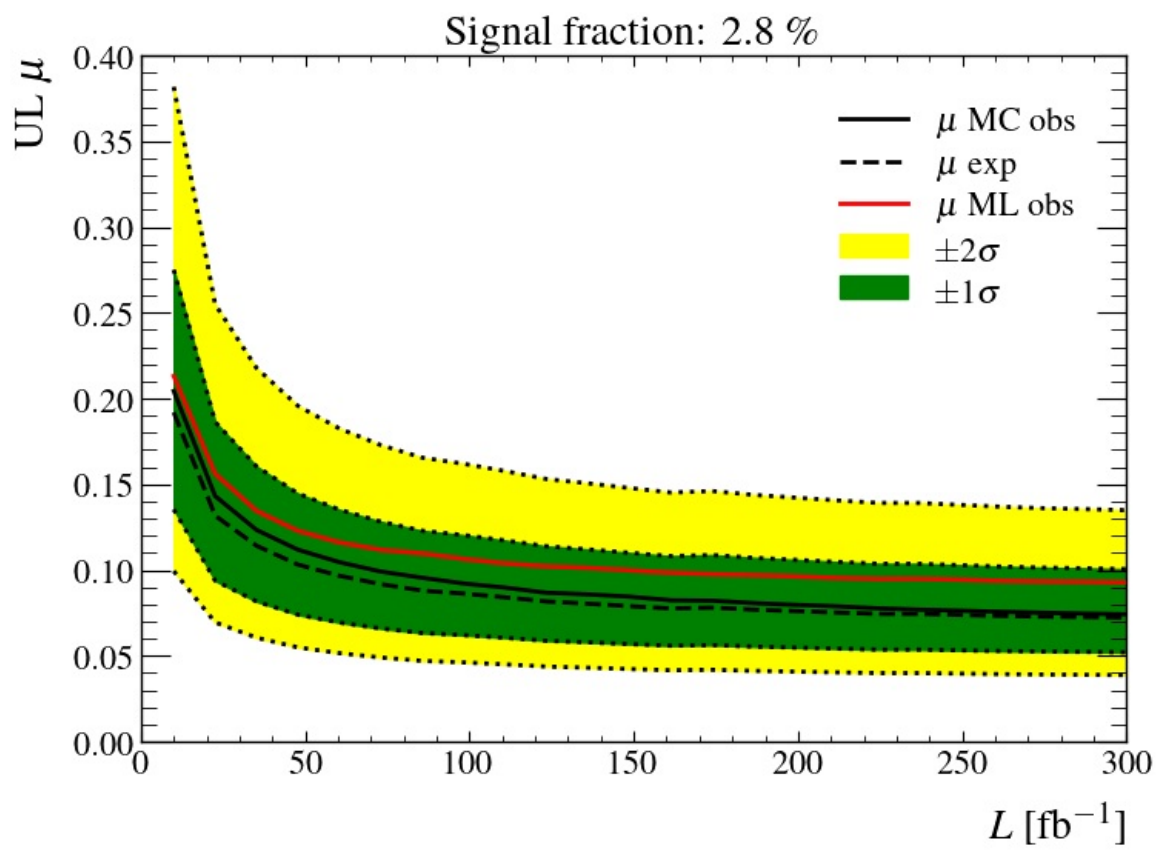
    # plt.xscale("log")

    plt.title("Signal fraction: {:.1f} %".format(sig_fracs[:: -1][i] * 100))

    plt.legend()
    plt.tight_layout()
    plt.savefig(saved + f"ul_mu_alpha{i+1}.pdf")
    plt.show()
```







In []: