

A complex network of black lines and dots representing particle tracks, located in the top left corner of the slide.

The Hunt for the Z' Boson in ATLAS: A Statistical Perspective

Etienne Dreyer

*Winter Nuclear & Particle Physics Conference
Banff, AB, February 2017*

Outline



1) Background

2) How do we search for a signal?

3) The *look-elsewhere* effect

4) Latest (public) search results

5) Summary

Outline



1) Background

2) How do we search for a signal?

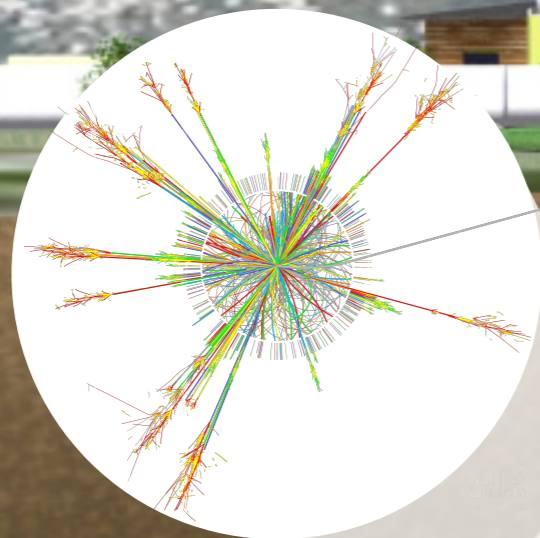
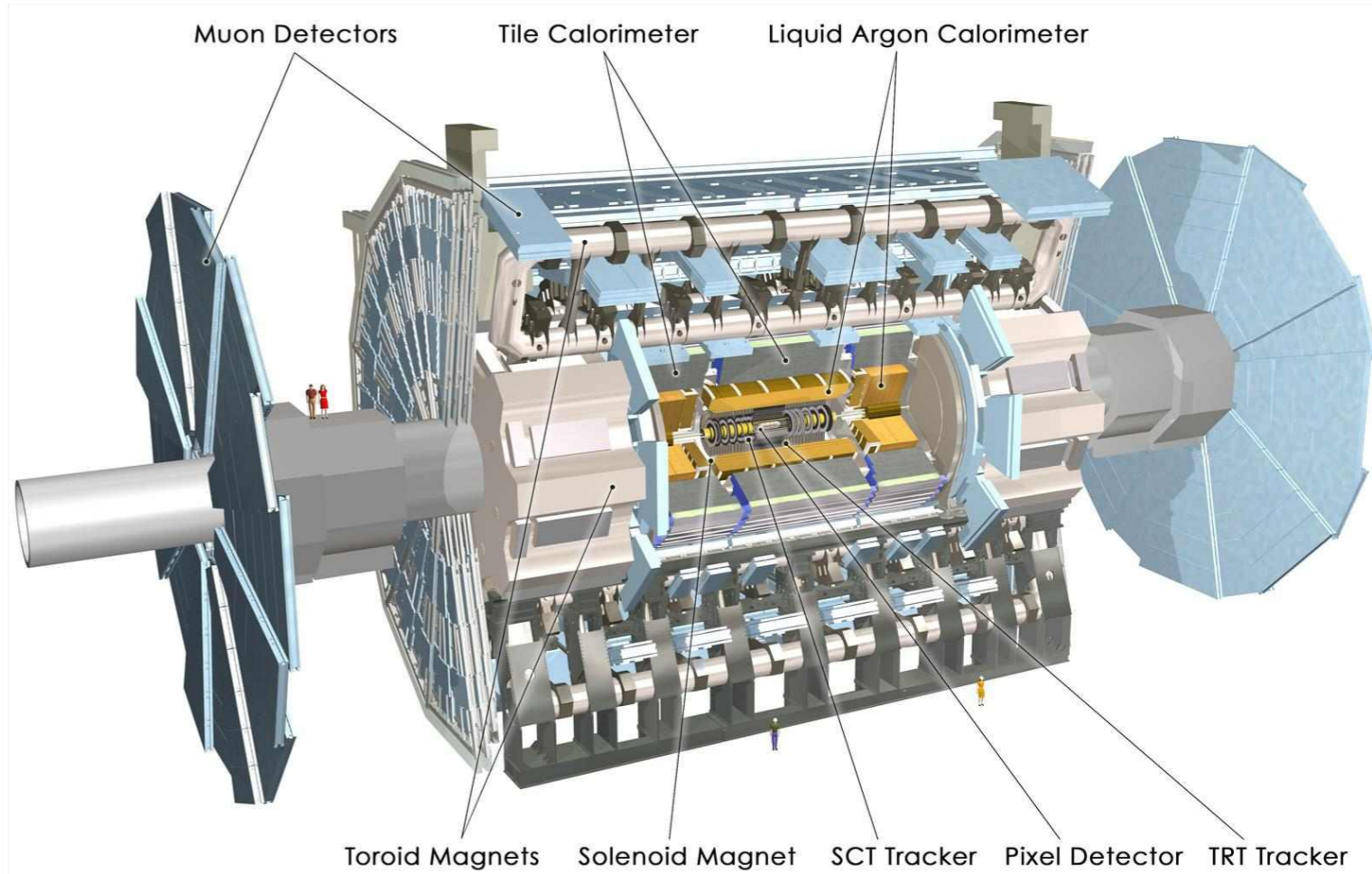
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ATLAS

- ▶ 100MP camera
- ▶ Weight ~ Eiffel tower
- ▶ ~ 1 billion collisions/s



$0.999999999c$

Large Hadron Collider

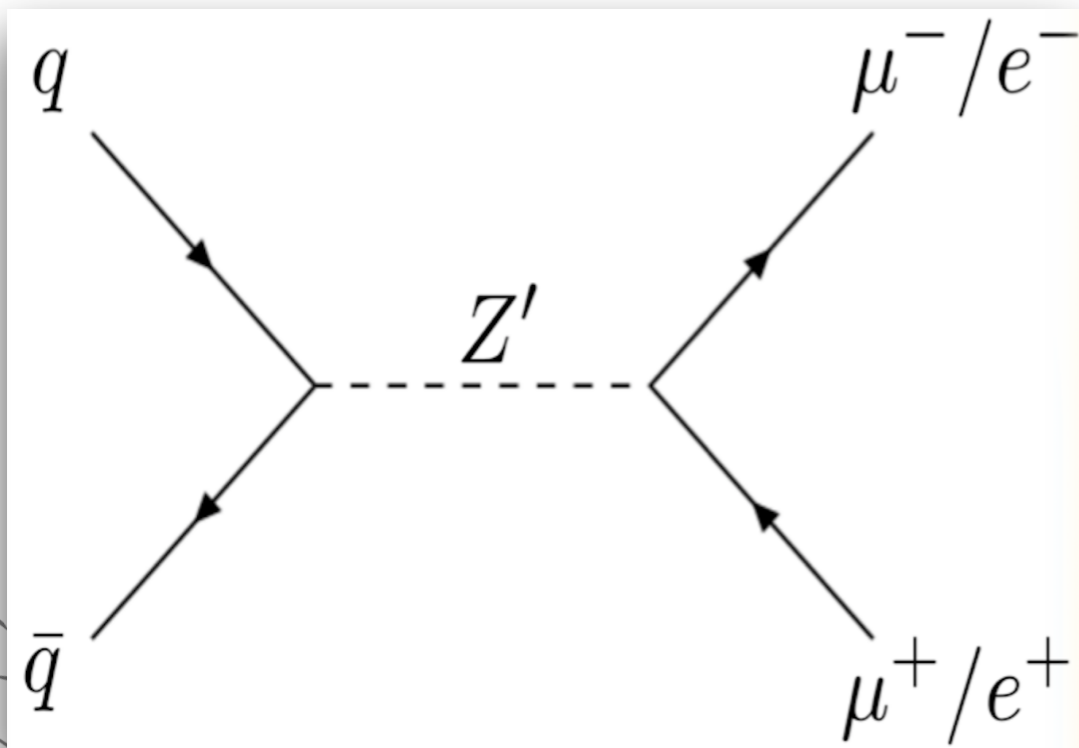
The Z' Boson

- ▶ The *Standard Model* is accurate but not **complete**
- ▶ Several beyond-Standard-Model theories predict exotic gauge particles including a neutral *Z' boson*

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$$Z' \rightarrow l^+ l^-$$

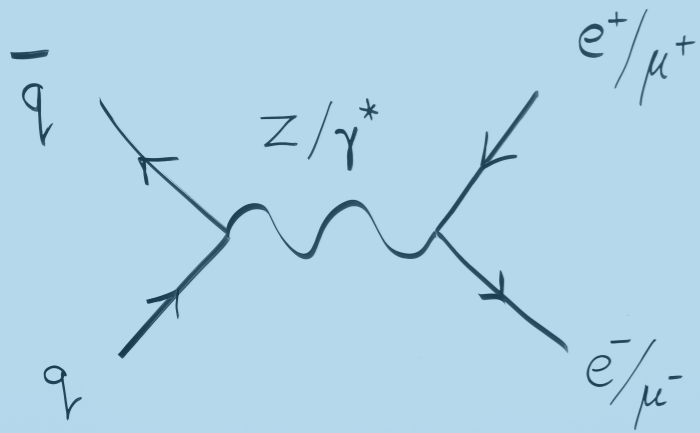


- ▶ Similar to the electroweak Z boson but heavier
- ▶ Should produce an excess number of lepton pairs with energies clustered around the Z' mass (*resonance*)

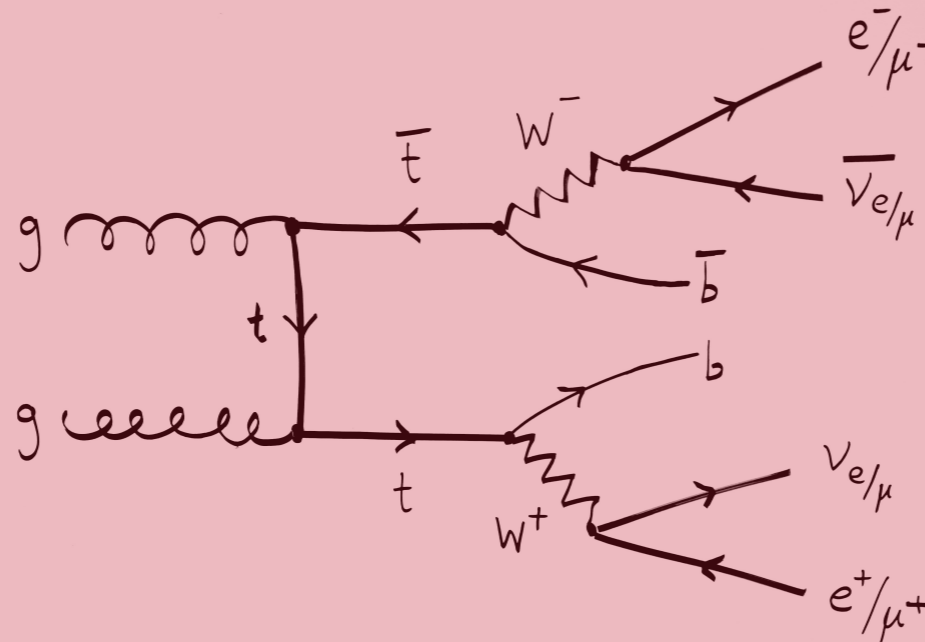
Hunting the Z' in ATLAS

- **Background** processes also produce dilepton final states

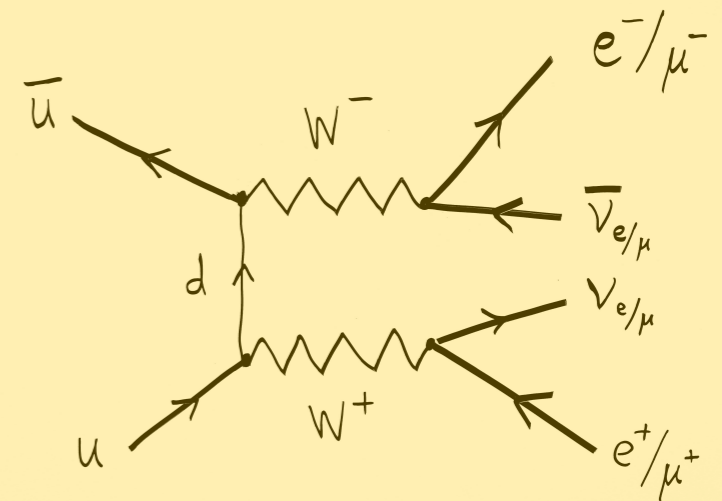
Drell-Yan (Z/γ^*)



Top quarks (t t-bar)



Diboson (WW, WZ, ZZ)

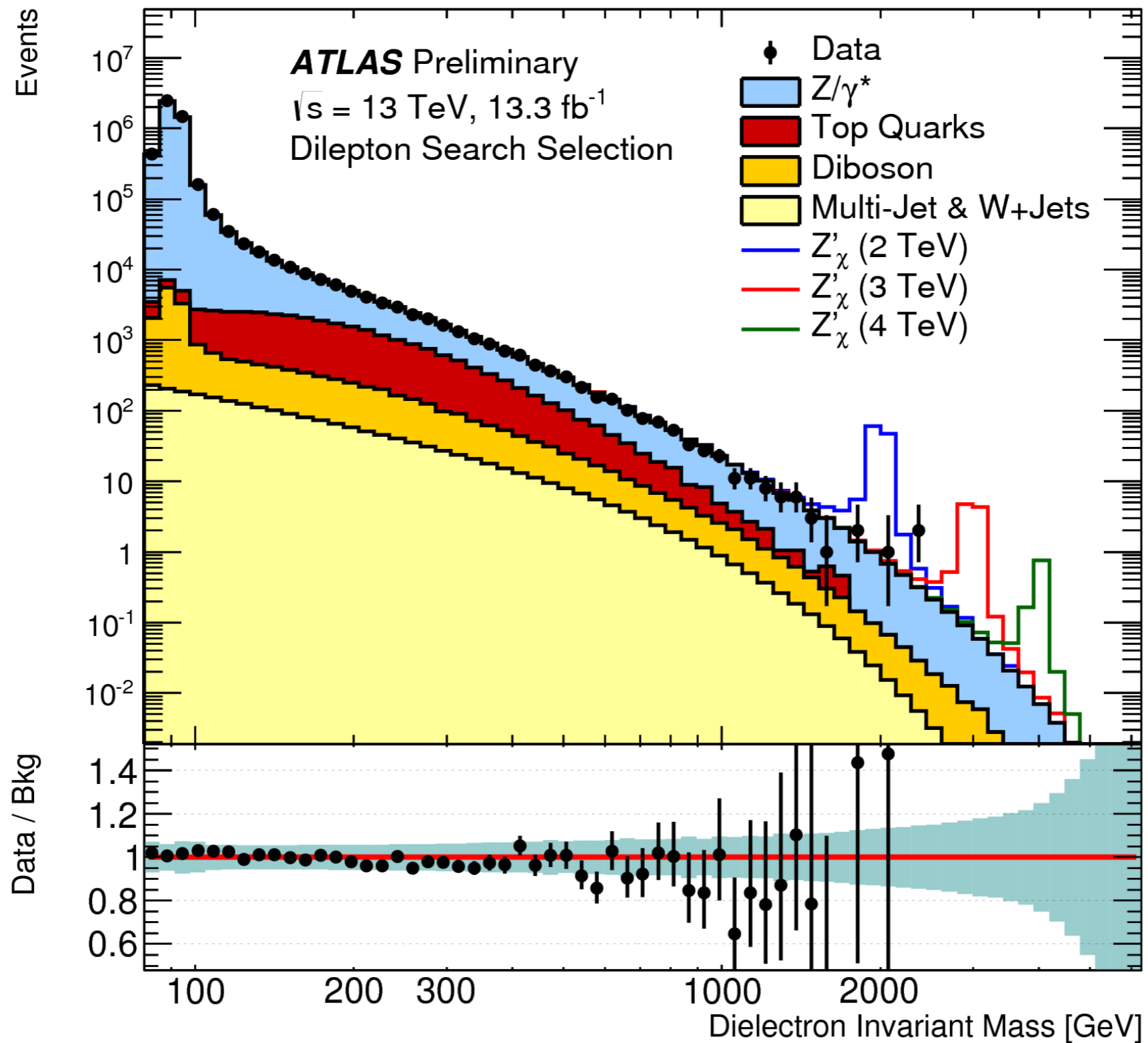


Increasing cross section

also multi-jet and W +jets events where jets fake electrons (small)

- Simulate how many lepton pairs to expect as a function of their **invariant mass** and compare to the actual number recorded by ATLAS

Mass spectrum (ee channel)



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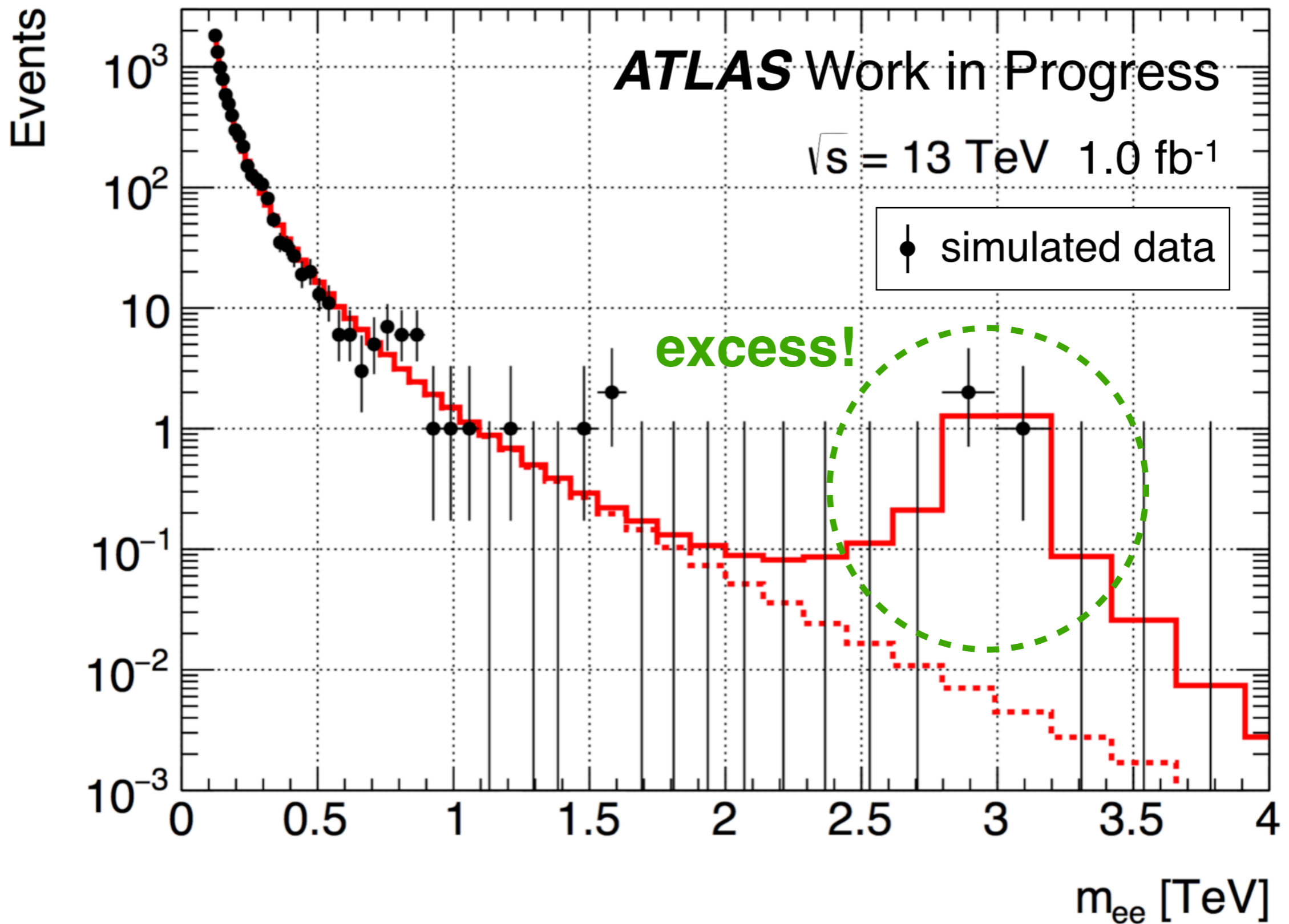
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maybe in 2017...

Pseudodata with injected 3 TeV signal



Search for signals using templates

- ▶ What's the *likelihood* of getting these data under the **background-only** vs. the **signal+background** hypotheses?

$$\mathcal{L}(\text{data}|H) = \prod_{i \in \text{bins}} \frac{(N_i^{\text{exp}} | H)^{N_i^{\text{obs}}} e^{-(N_i^{\text{exp}} | H)}}{(N_i^{\text{obs}})!}$$

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$$N_i^{\text{exp}} = \begin{cases} B_i & , H_B \\ B_i + \mu S_i & , H_{B+S} \end{cases}$$

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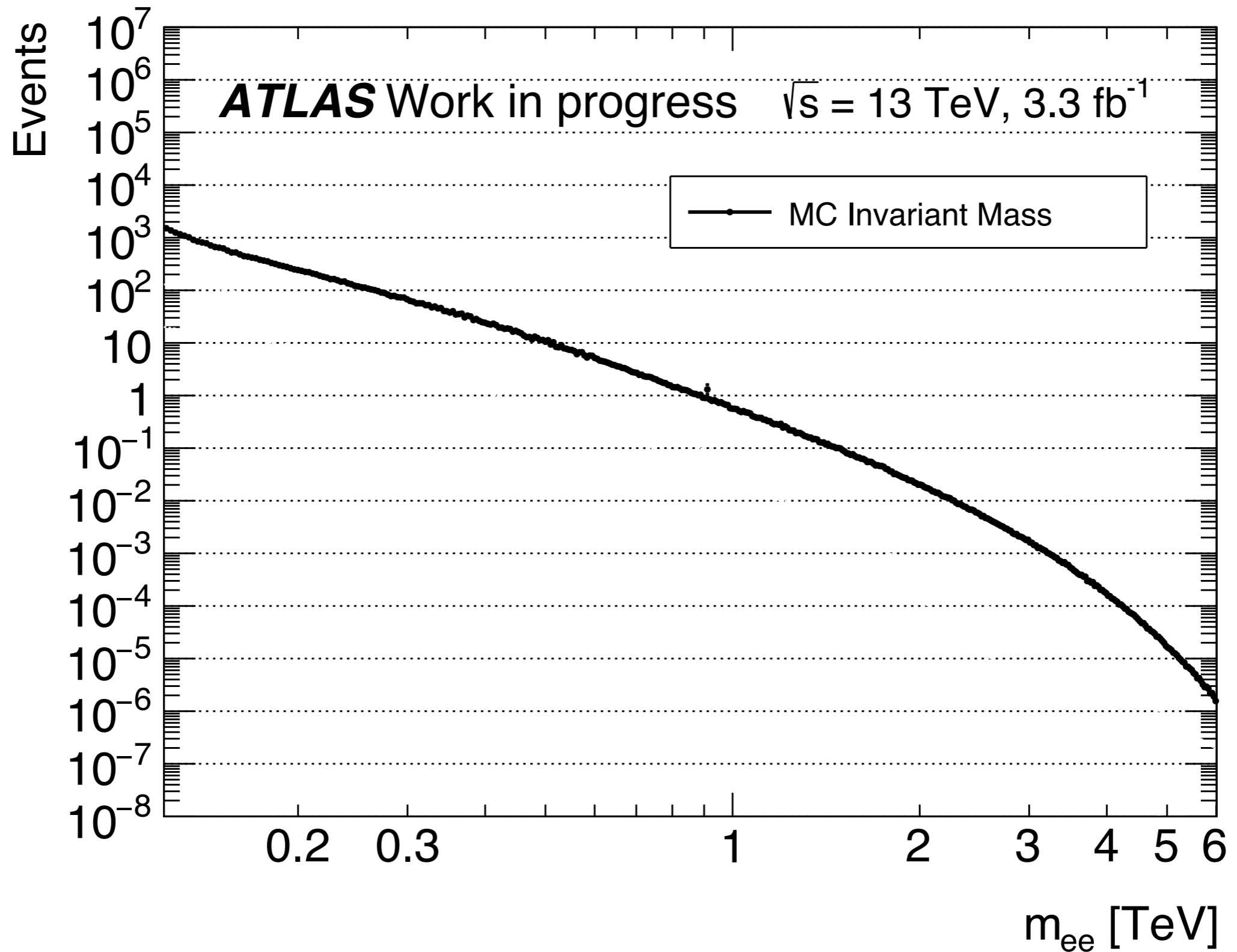
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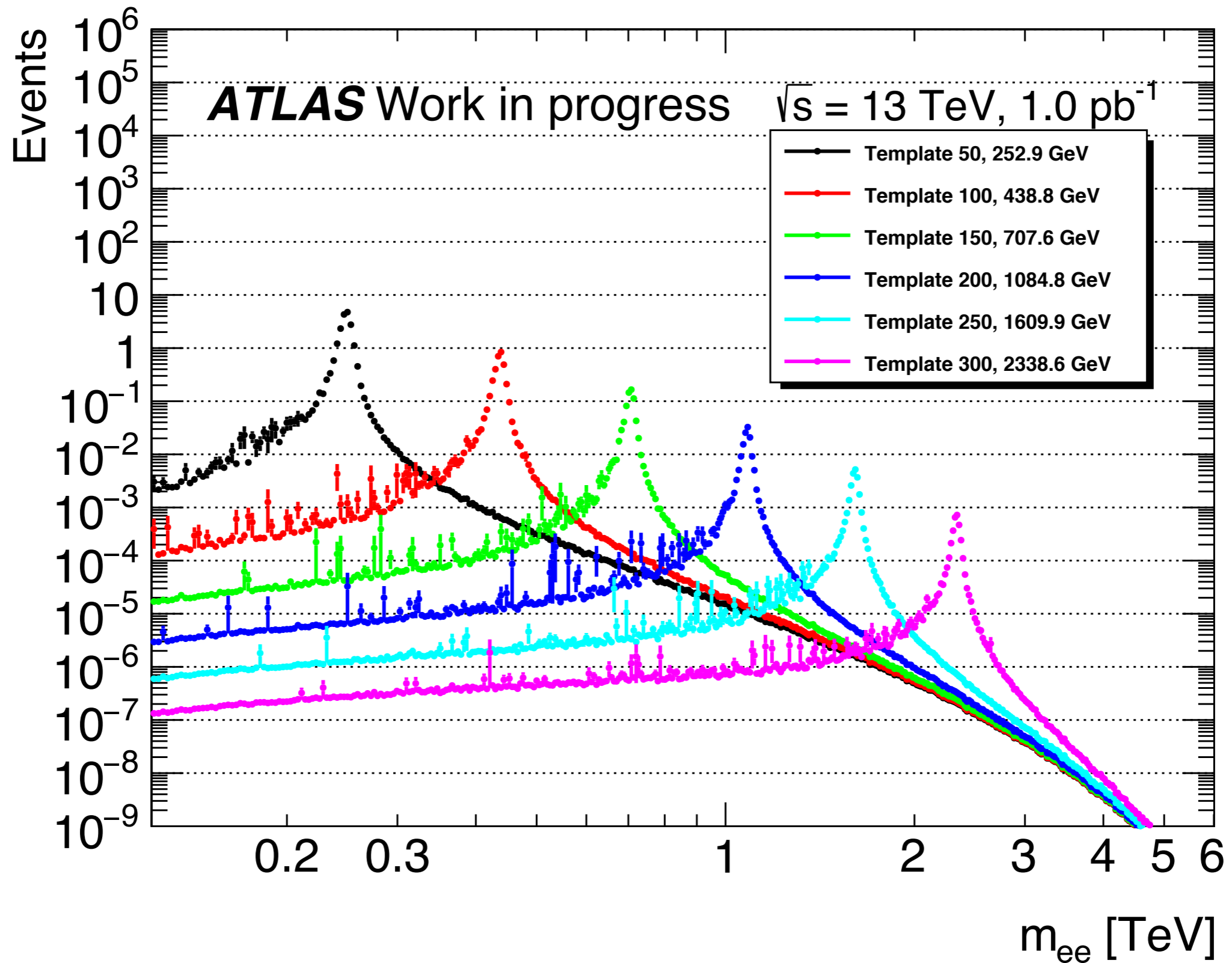
$$N_i^{\text{exp}} = \begin{cases} B_i & , H_B \\ B_i + \mu S_i & , H_{B+S} \end{cases}$$

- ▶ We find the maximum likelihood under both hypotheses by fitting the data with *templates* of the background and signal distributions

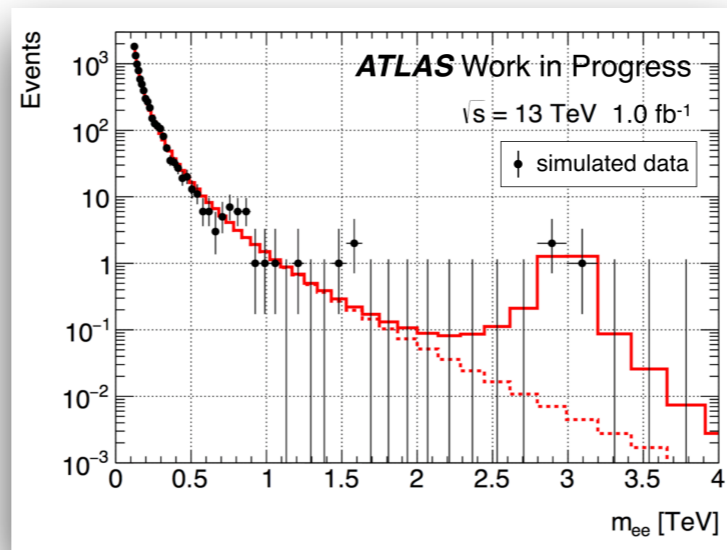
ee background template



ee signal templates (sampler)

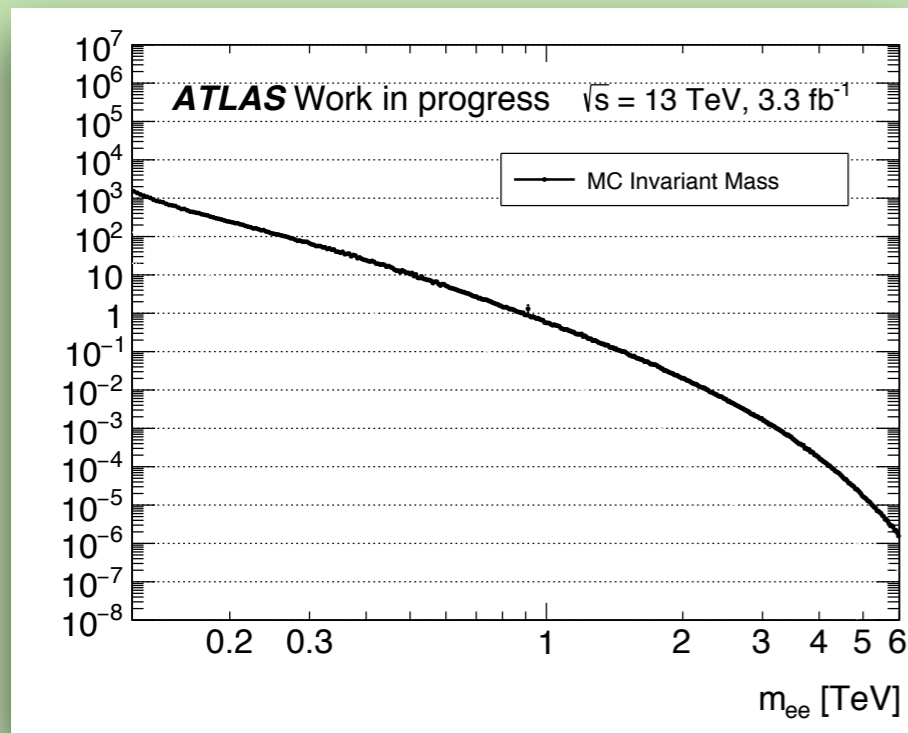


“data” =



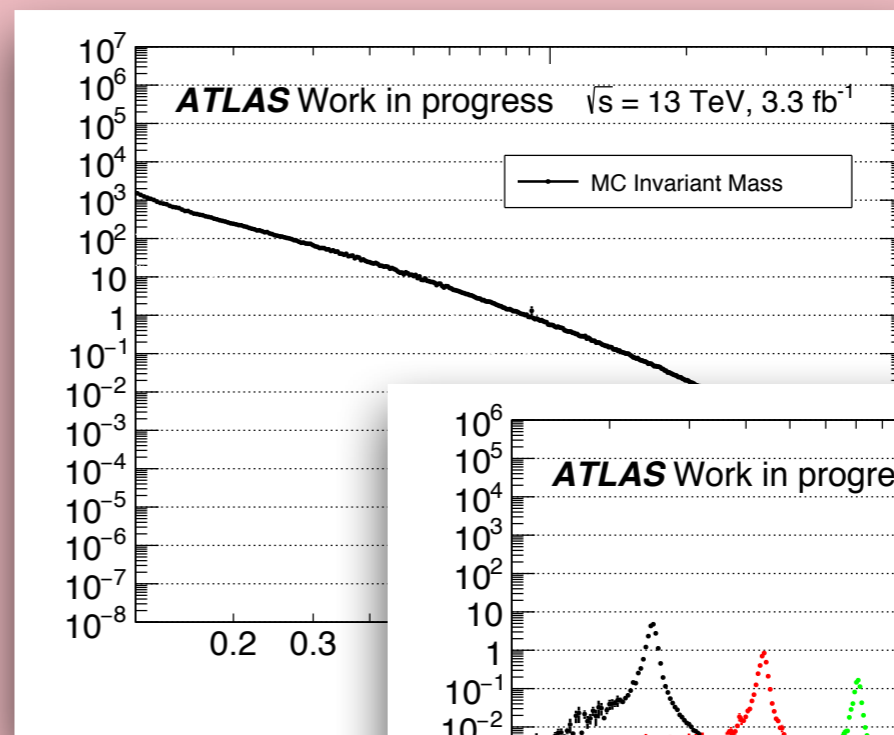
=

Background-only Hyp

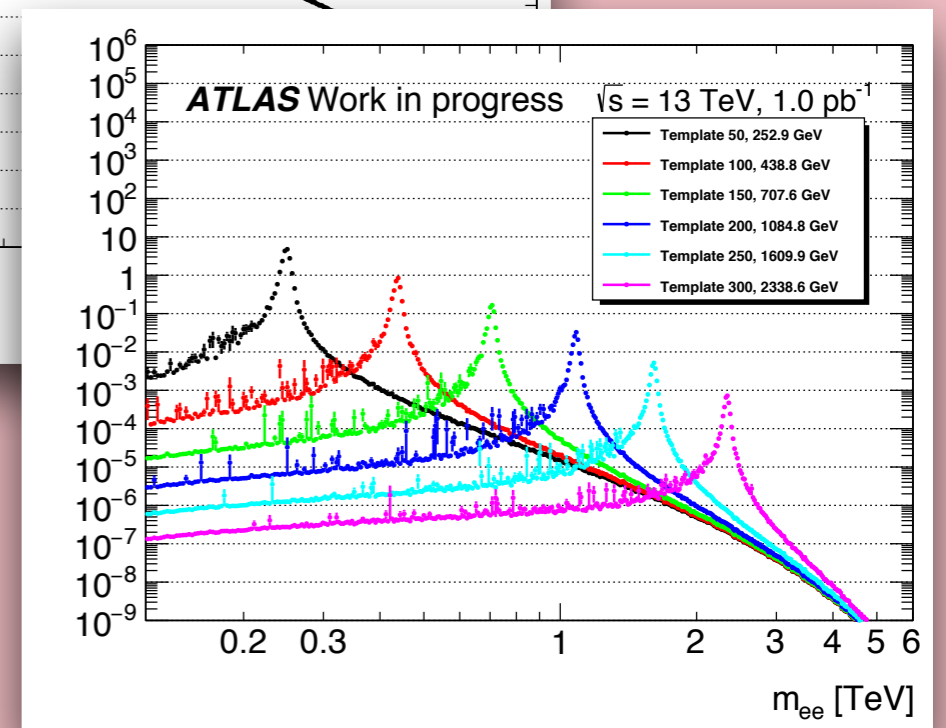


OR

Background plus signal Hyp



+ μ



$$\mathcal{L}(data | H_B)$$

$$\mathcal{L}(data | H_{B+S})$$

Deciding between hypotheses



- ▶ How should we evaluate the difference in the data's likelihood under the two hypotheses?

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- ▶ **Neyman-Pearson Lemma:**

The optimal test statistic for distinguishing between hypotheses is the “log-likelihood-ratio” (*LLR*):

$$q_0 = \ln \left[\frac{\mathcal{L}(\text{data} | H_{B+S})}{\mathcal{L}(\text{data} | H_B)} \right]^2 \times \text{Sign}(\hat{\mu})$$

best-fit signal strength

Deficit

$$q_0 < 0$$

Nominal

$$q_0 = 0$$

Excess

$$q_0 > 0$$

The odds of being fooled

Q: What's the odds the observed \hat{q}_0 is a bkg fluctuation?

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- ▶ We can generate many bkg-only pseudo experiments (*toys*) and count how many fluctuate with $q_0 \geq \hat{q}_0$
- ▶ **Wilks' Theorem** $\Rightarrow q_0$ should asymptotically follow a χ^2 distribution with 1 degree of freedom¹ :

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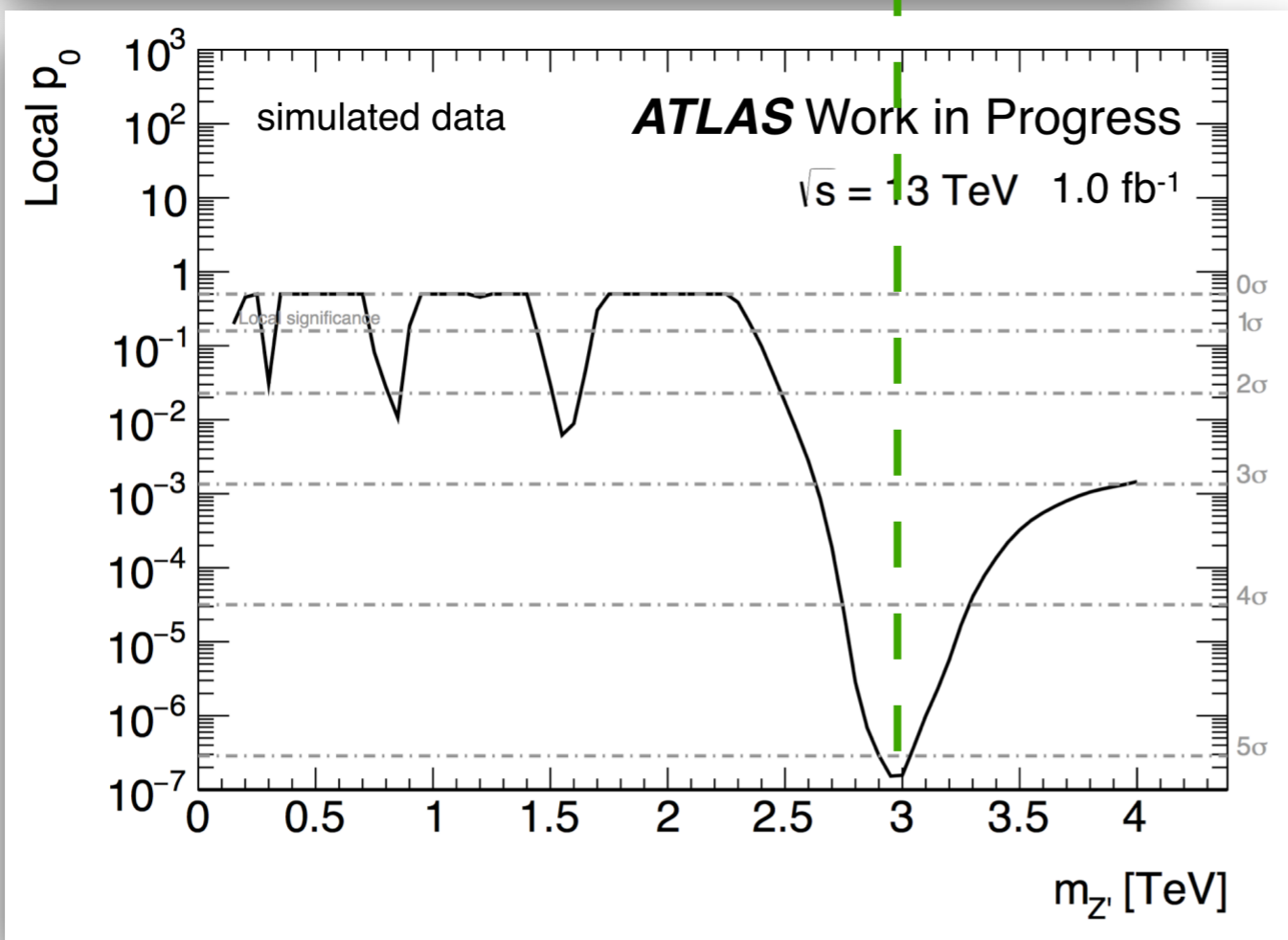
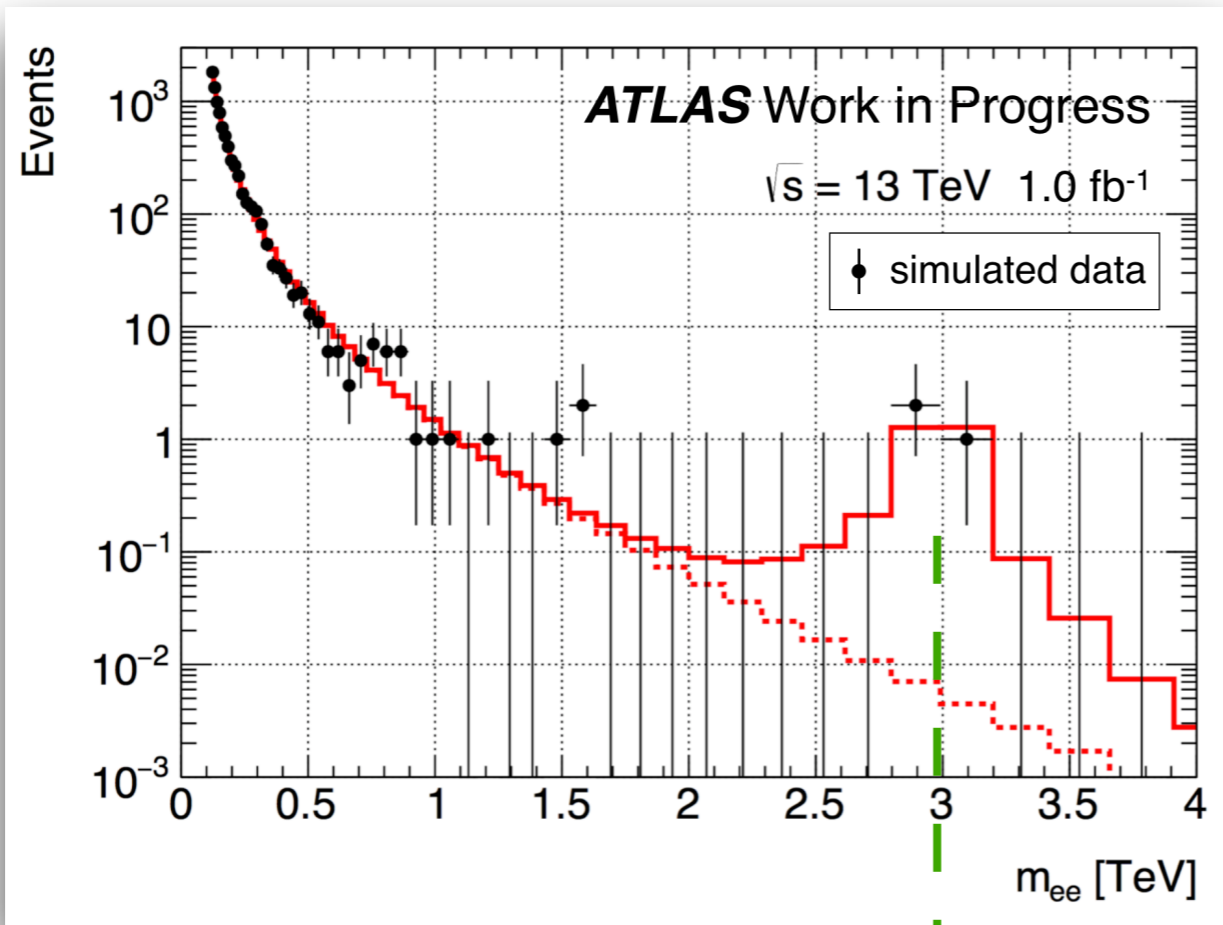
$$p_0 = \int_{\hat{q}_0}^{\infty} P_{\chi^2}(q_0) dq_0$$

i.e. 5 σ

- ▶ p-value often measured in *Gaussian significance*, aka z_0

¹Fine print: assuming the bin contents are gaussian-distributed and the two hypotheses differ by only 1 parameter **23**

Pseudodata with injected 3 TeV signal



$$\mathcal{L}(data|H_B)$$

$$\mathcal{L}(data|H_{B+S})$$

likelihood

log-likelihood ratio q_0

p-value p_0

significance z_0

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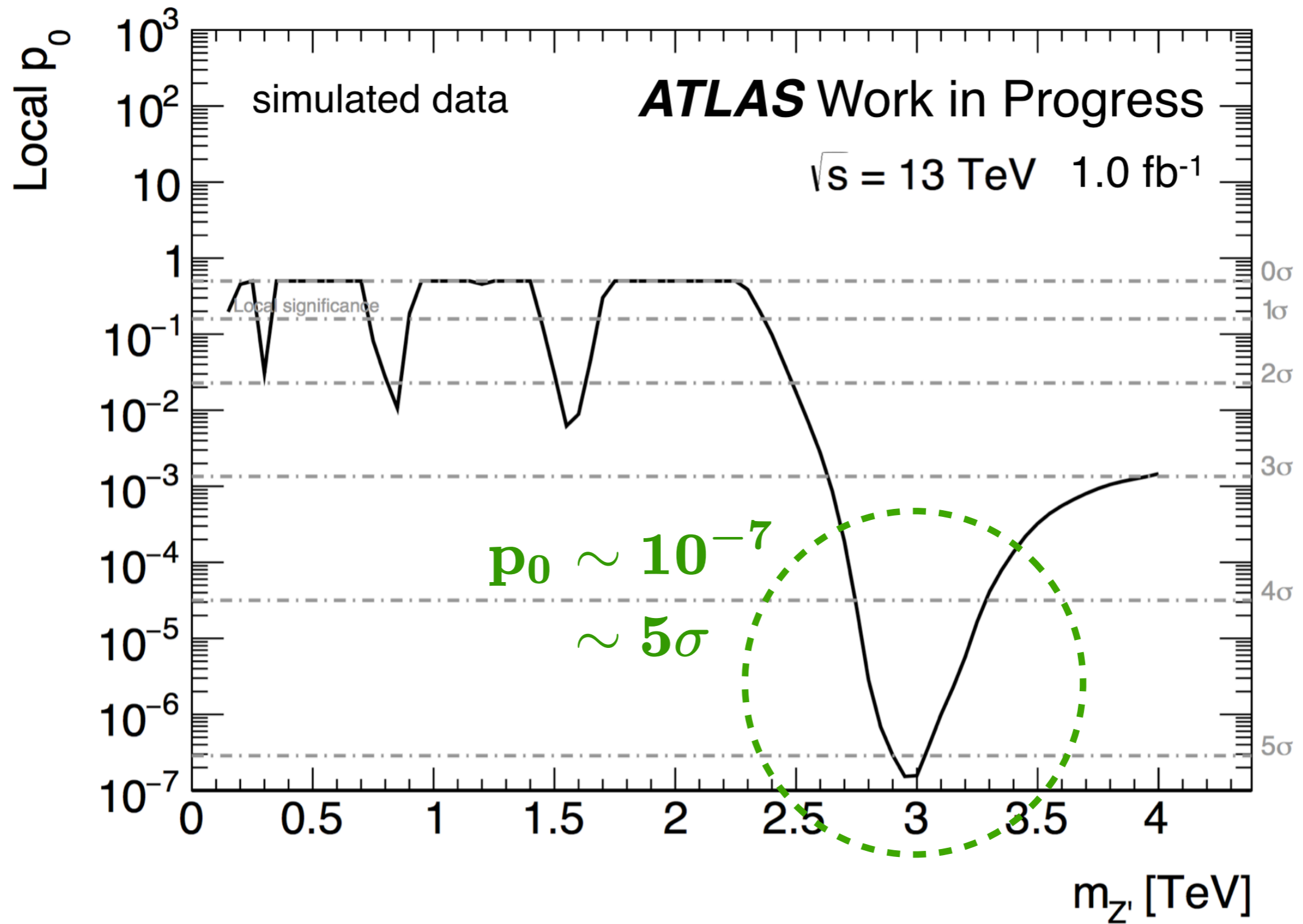
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Looking around

- ▶ Since we don't know the Z' mass, we test many signal “locations” and find the largest excess

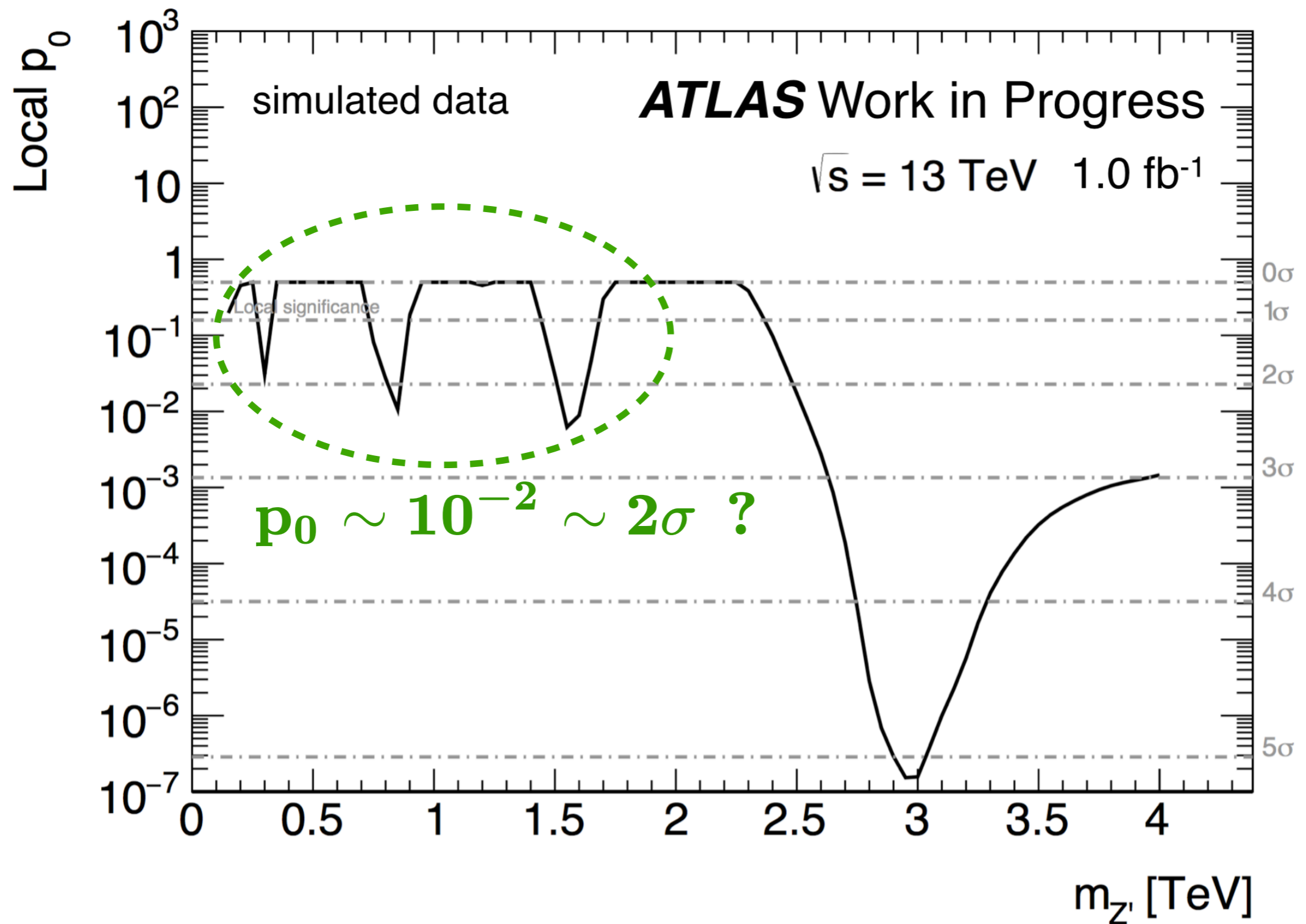


► HEP conventions for “evidence” & “discovery” are

$$z_0 = 3\sigma \quad (p_0 = 1.4 \times 10^{-3}) \quad z_0 = 5\sigma \quad (p_0 = 2.9 \times 10^{-7})$$

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- ▶ This increases our chances of observing a fluctuation somewhere (*look-elsewhere effect*)



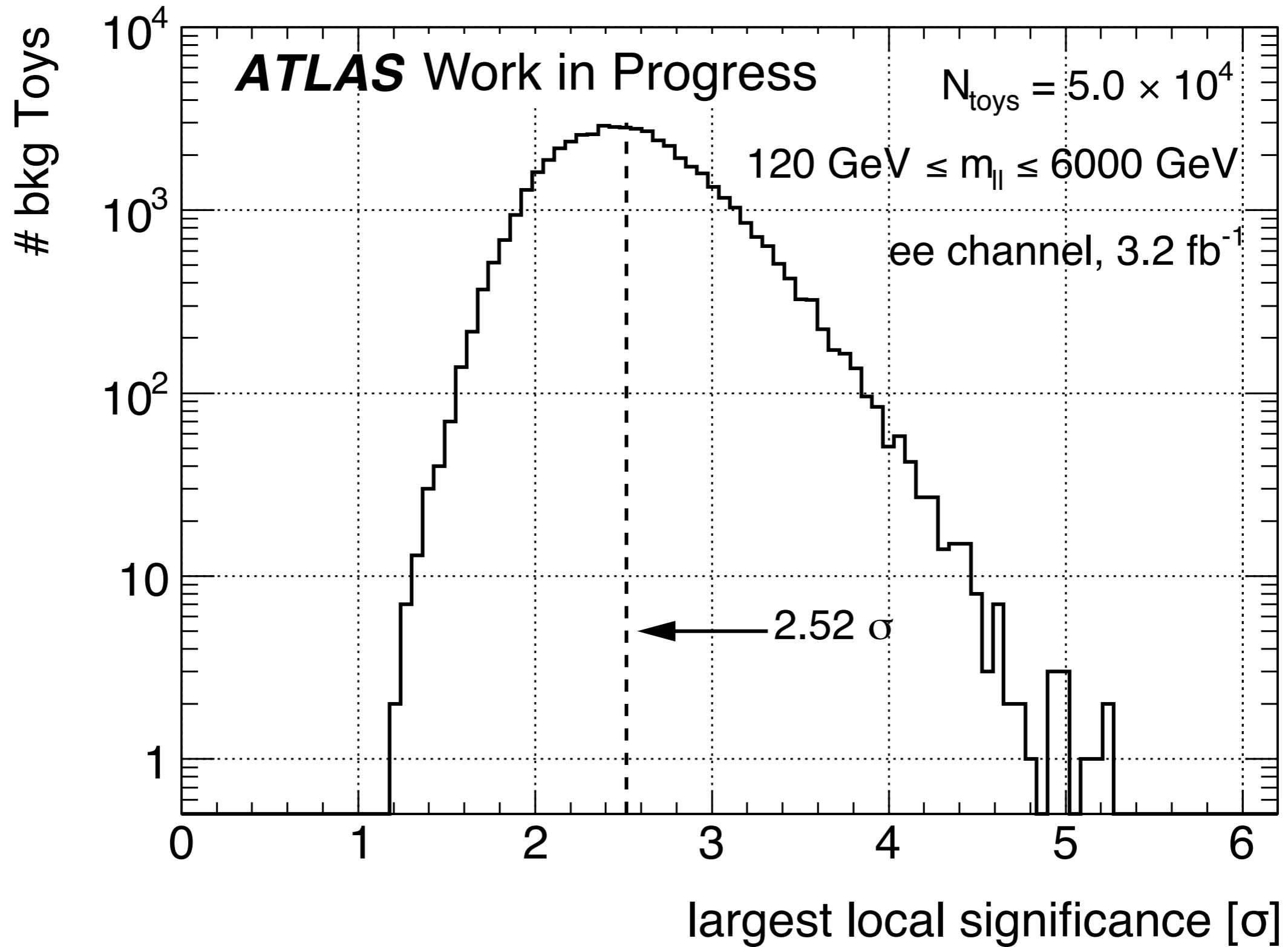
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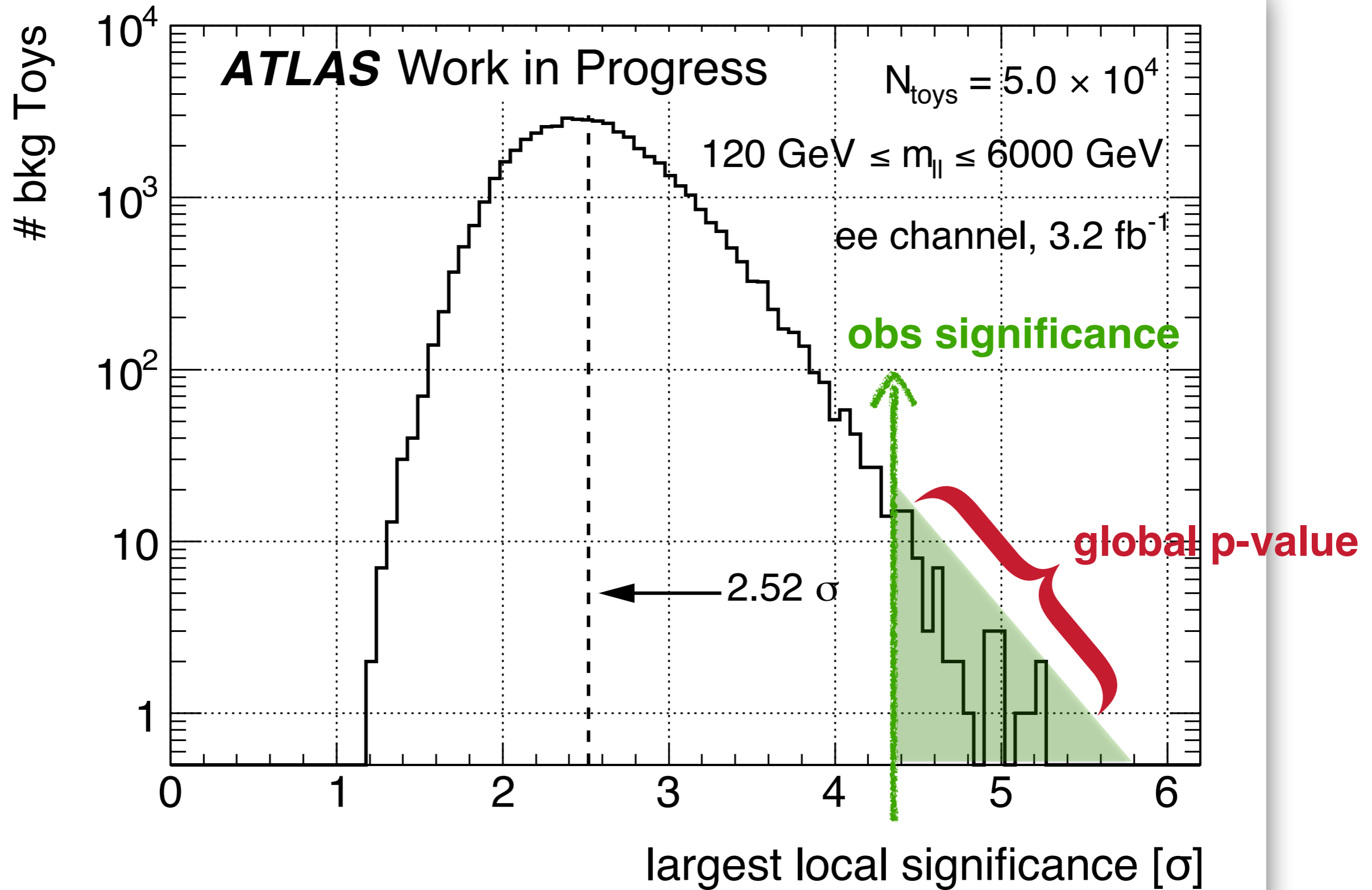
Looking around

- ▶ Since we don't know the Z' mass, we test many signal “locations” and find the largest excess
- ▶ This increases our chances of observing a fluctuation somewhere (*look-elsewhere effect*)
- ▶ The *global p-value* compensates by reporting the probability of observing a fluctuation at least as significant as the observed excess *anywhere* in the mass scan
- ▶ We can again generate many bkg toys and calculate the global p-value by brute force

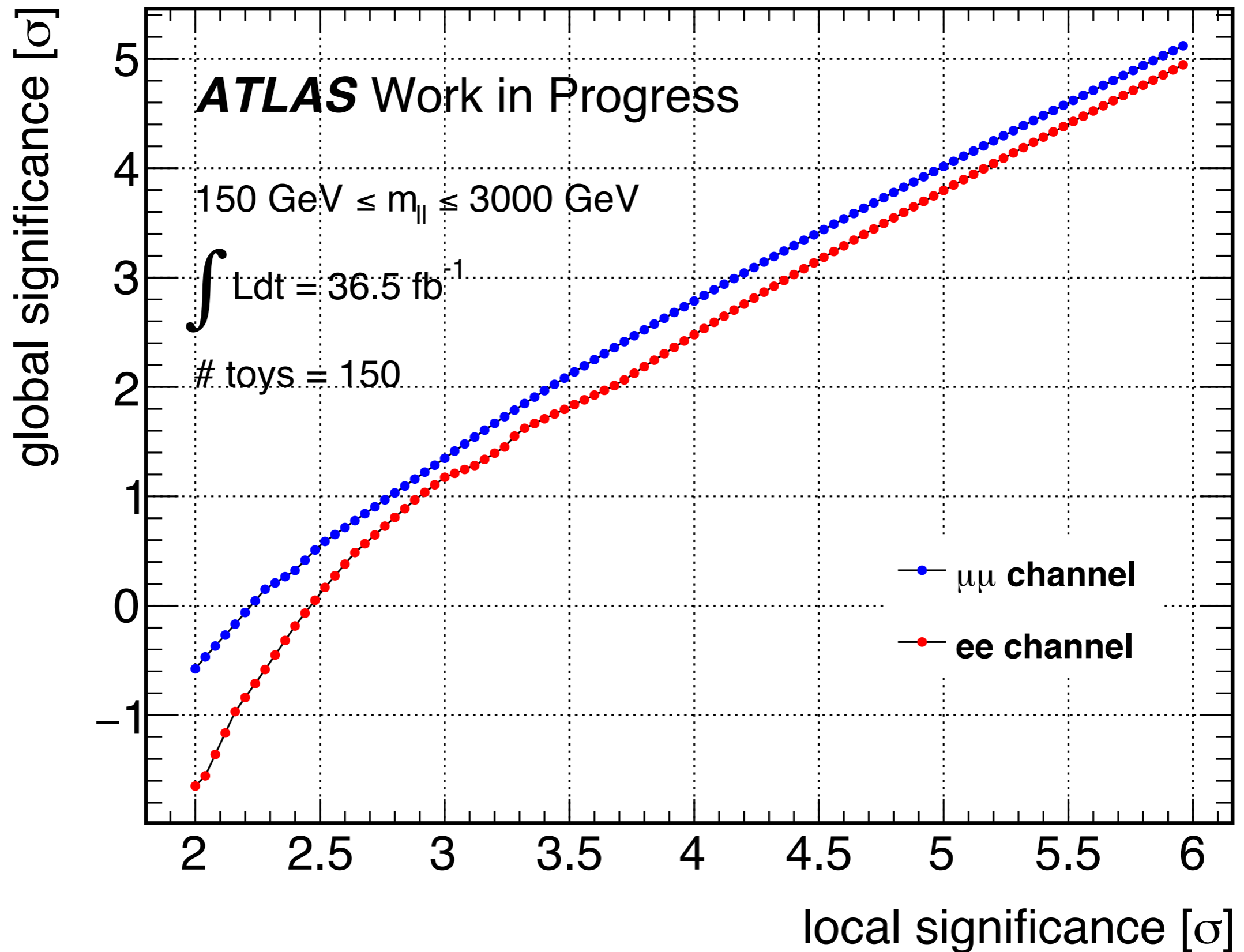
Largest local z-values found in 50,000 toys



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Global vs. Local Significance



Outline



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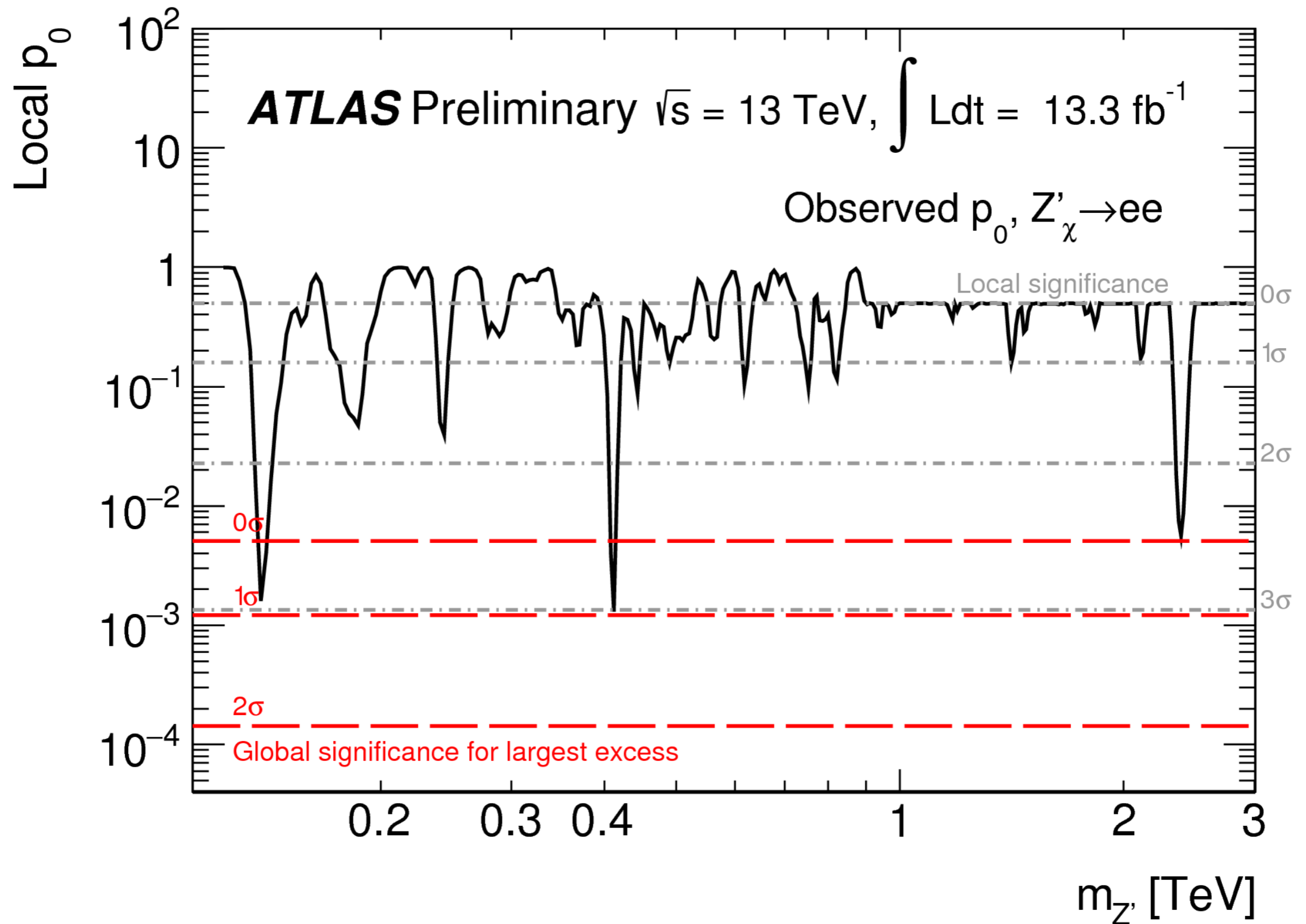
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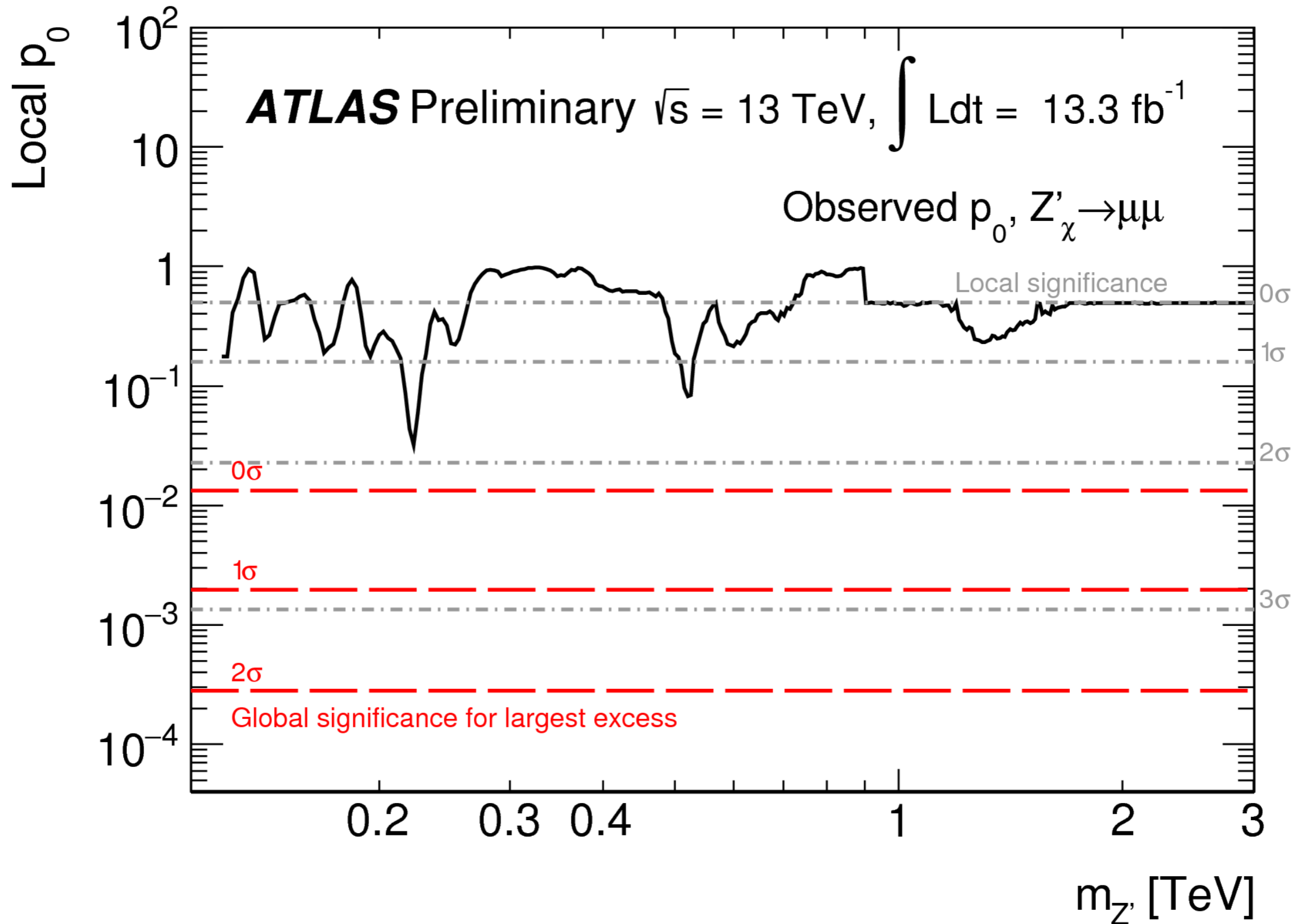
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ee channel p-value scan



$\mu\mu$ channel p-value scan



Summary

- ▶ We're looking for a localized excess of dilepton final states in ATLAS caused by a hypothetical *Z' boson*
- ▶ The *log-likelihood ratio* q_0 is the optimal test statistic for discriminating between H_B and H_{B+S}
- ▶ The *global p-value* of an observed excess is the probability that the bkg would produce a fluctuation at least as significant *anywhere* in the mass range
- ▶ No signal observed in ICHEP 2016 results (13.3 fb⁻¹)

Questions?



Pacific

Vancouver

SFU

etienned@sfu.ca

<http://cern.ch/edreyer>



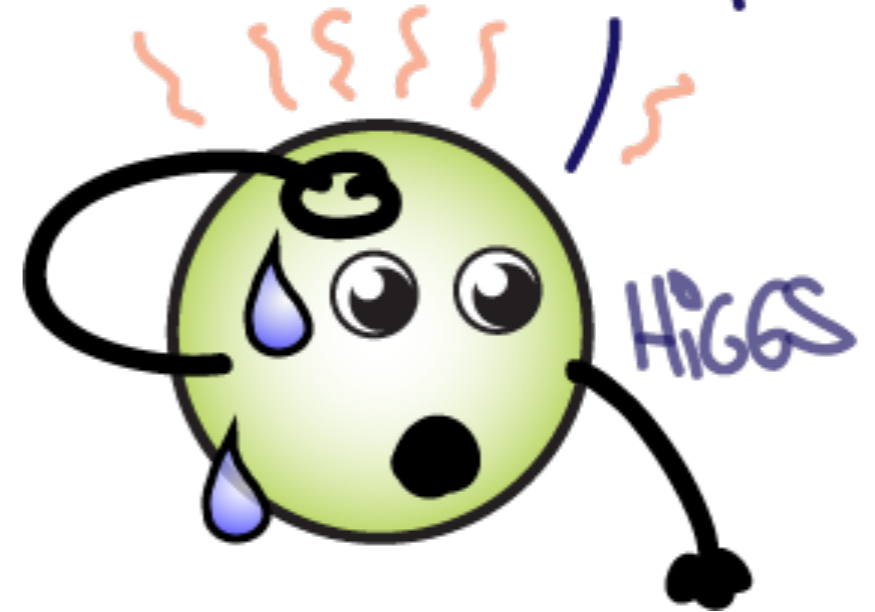
Bonus



Dark matter?

Naturalness

IT'S A LITTLE TOO HOT FOR 125 GeV...



| | | | |
|--|--|--|---|
| 1968: SLAC u up quark | 1974: Brookhaven & SLAC c charm quark | 1995: Fermilab t top quark | 1979: DESY g gluon |
| 1968: SLAC d down quark | 1947: Manchester University s strange quark | 1977: Fermilab b bottom quark | 1923: Washington University γ photon |
| 1956: Savannah River Plant ν_e electron neutrino | 1962: Brookhaven ν_μ muon neutrino | 2000: Fermilab ν_τ tau neutrino | 1983: CERN W W boson |
| 1897: Cavendish Laboratory e electron | 1937: Caltech and Harvard μ muon | 1976: SLAC τ tau | 1983: CERN Z Z boson |

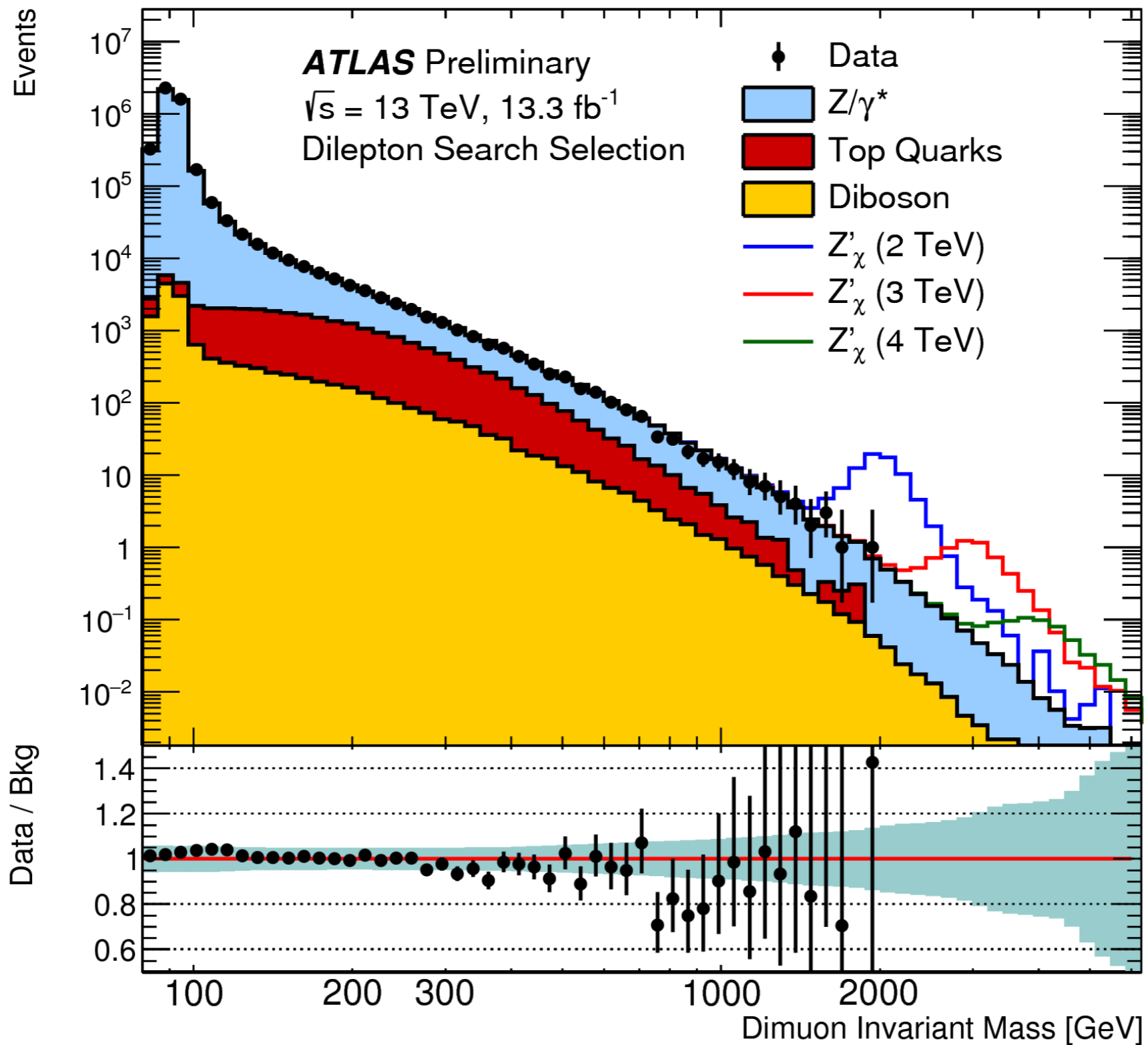
Neutrino masses?



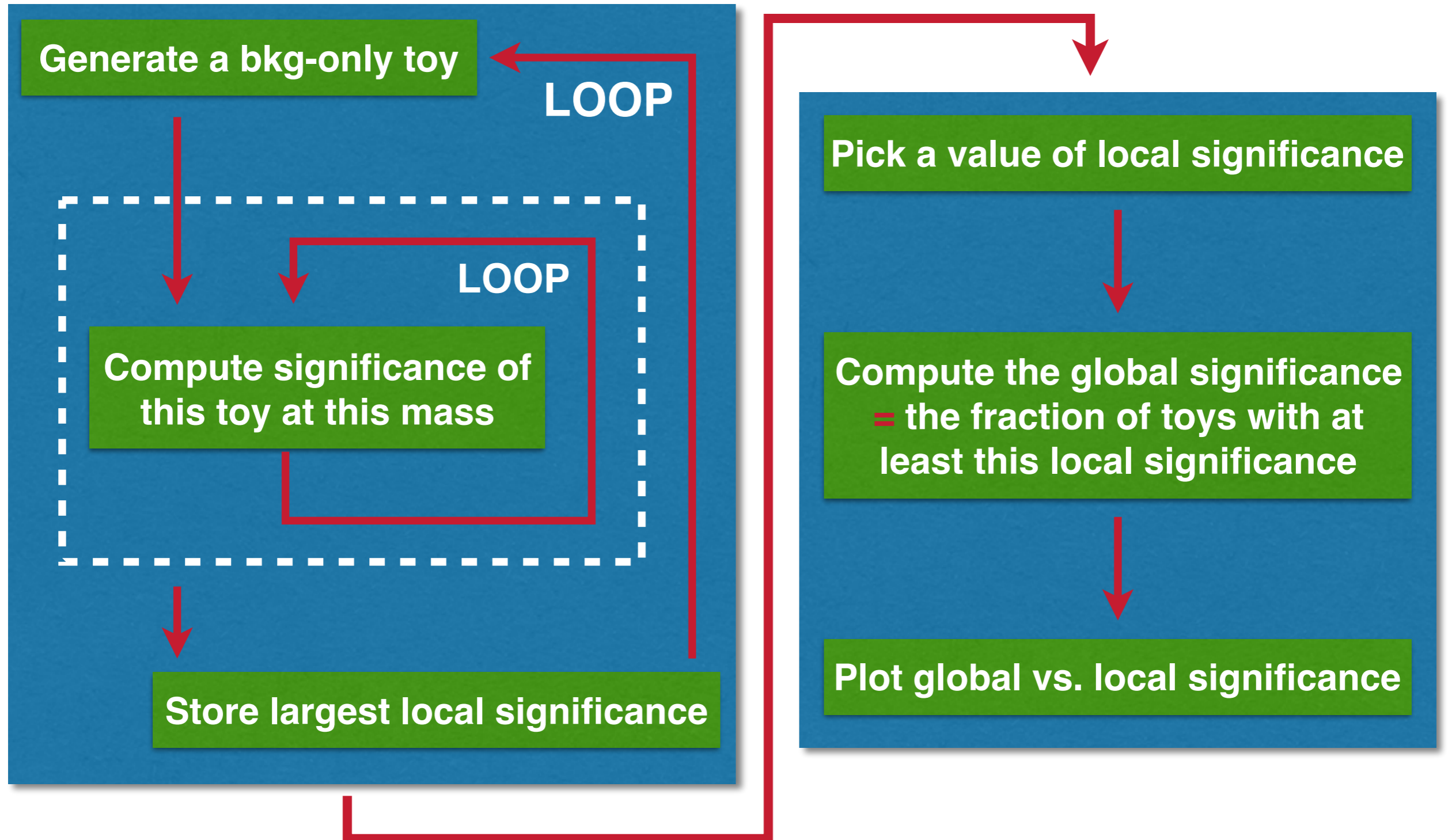
Z' Models

- ▶ Sequential Standard Model (SSM)
 - Accessible as a benchmark but not very attractive theoretically
 - Fermion couplings identical to that of Standard Model Z
- ▶ E6 Grand Unified Theory
 - Physical Z' states are a mixture of two residual U(1) after E6 breaking
- ▶ Randall-Sundrum Graviton
 - Z' is an excitation of the spin-2 graviton propagating in bulk 5D space
- ▶ Little Higgs

Mass spectrum ($\mu\mu$ channel)



Brute-force global p_0 calculation



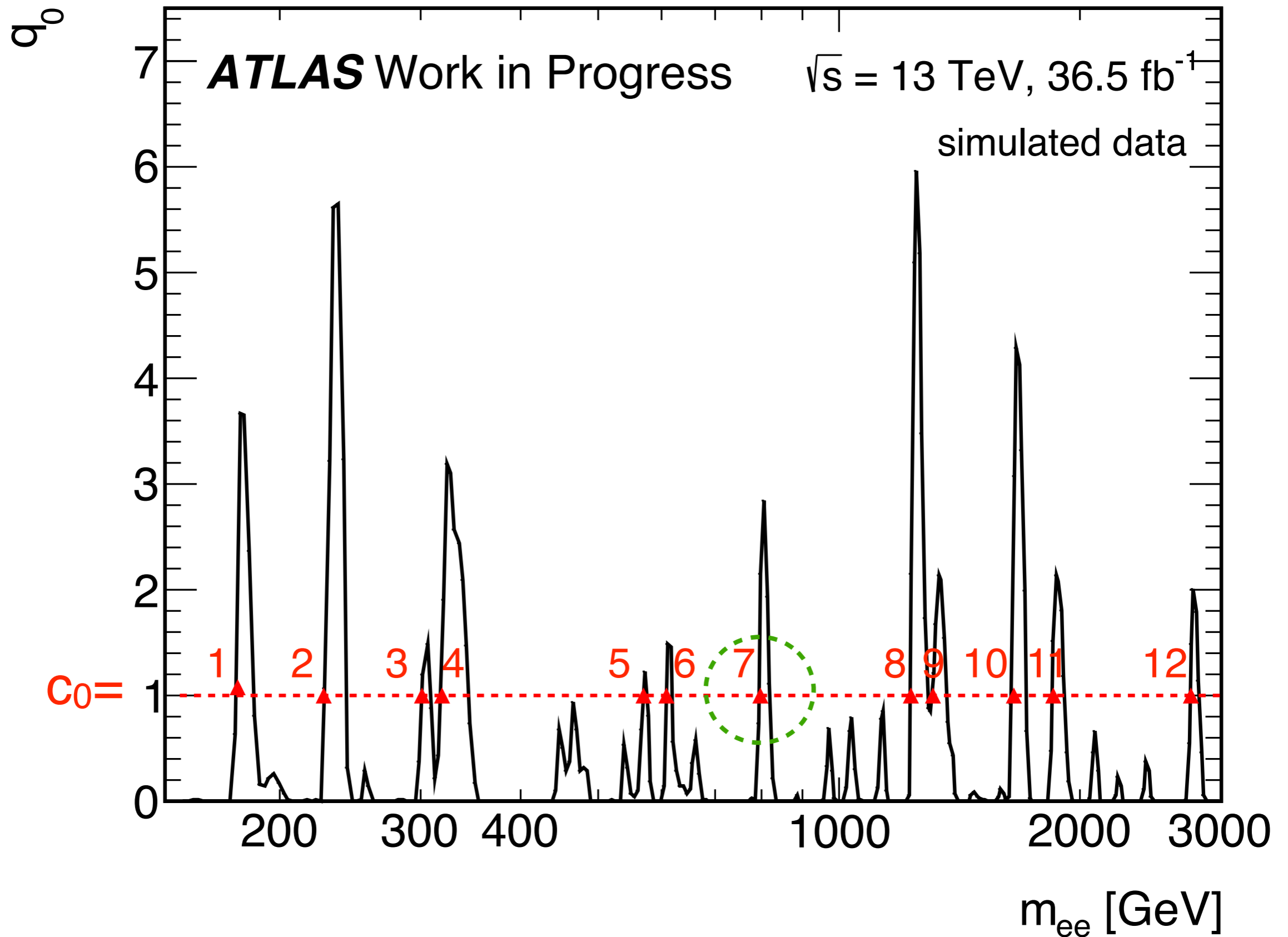
Global p-value from “upcrossings”

- ▶ Scanning toys takes a *long* time!
- ▶ *Gross & Vitells* derive an analytic description of the look-elsewhere effect which asymptotically approaches the slow “brute-force” method

Gross, Eilam, and Ofer Vitells. "Trial factors for the look elsewhere effect in high energy physics." *The European Physical Journal C - Particles and Fields* 70.1 (2010): 525-530.

Idea: the bkg's tendency to fluctuate is related to the average number of *upcrossings* where q_0 crosses above some threshold c_0 in pseudo-experiments

“▲” are upcrossings above $c_0=1$



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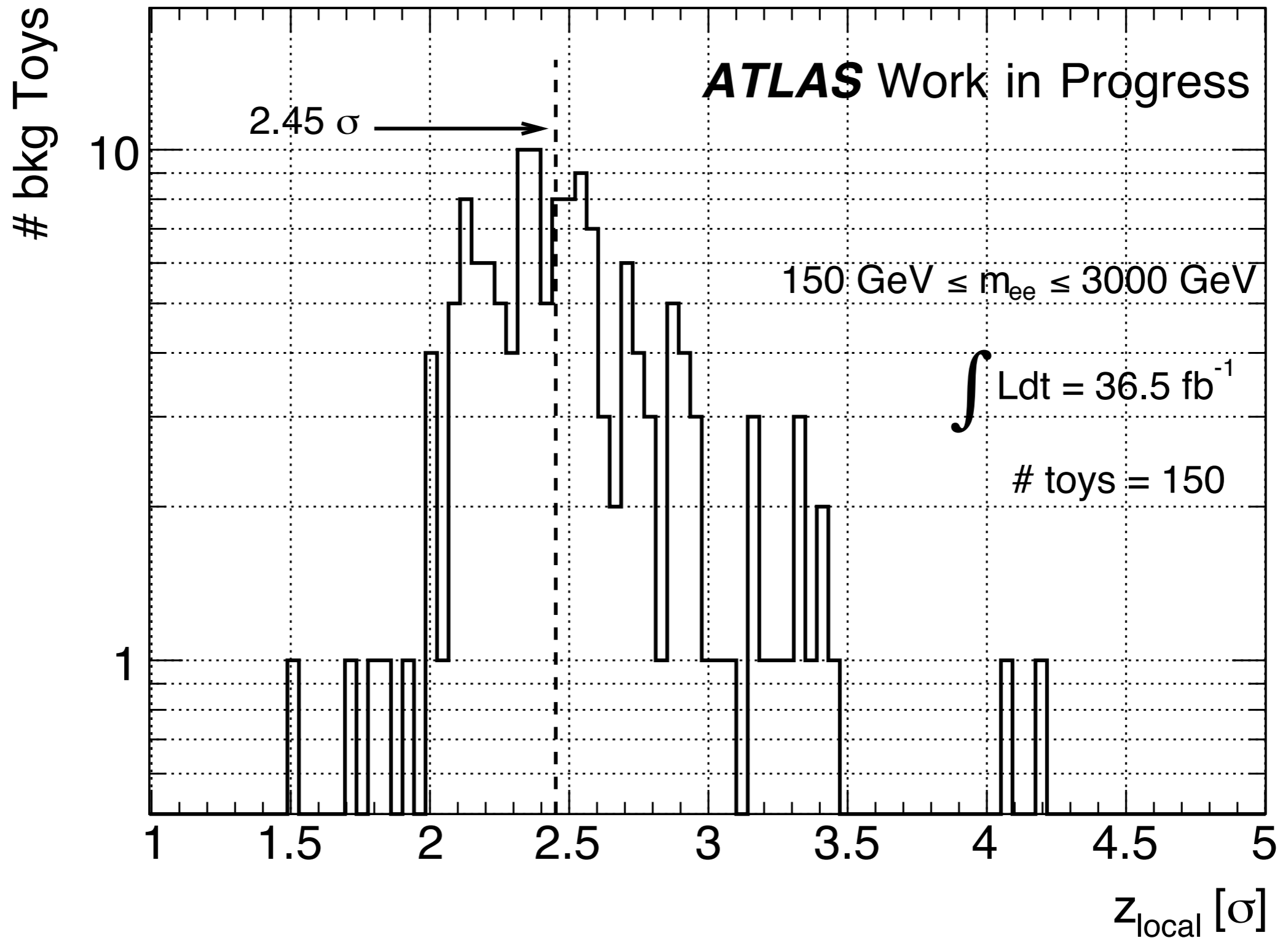
$$p_{\text{global}} \leq P(\chi^2 > \hat{q}_0) + \langle N(c_0) \rangle e^{-(\hat{q}_0 - c_0)/2}$$

local p-value

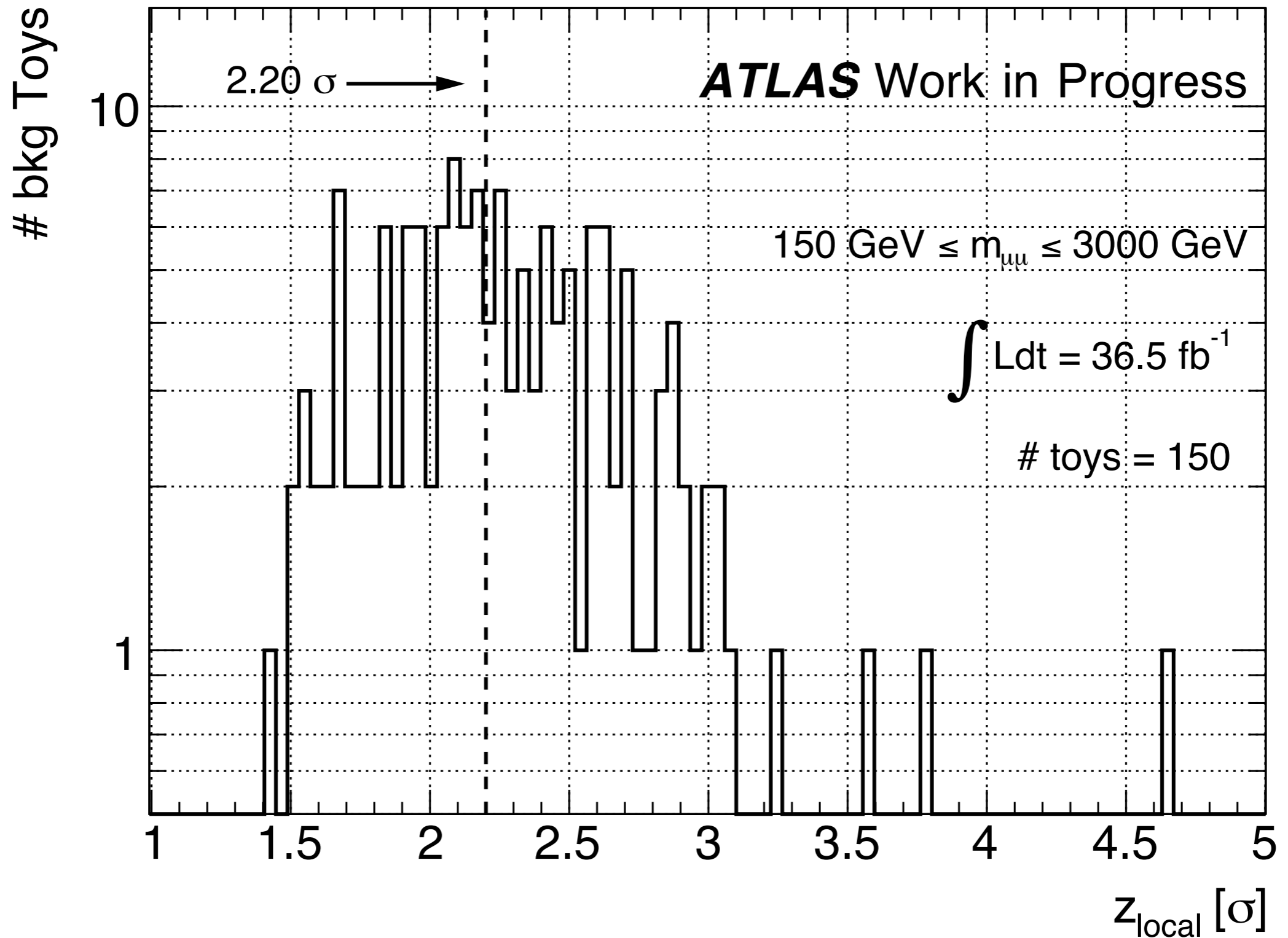
avg # of
upcrossings/toy

scaling law for
threshold c_0

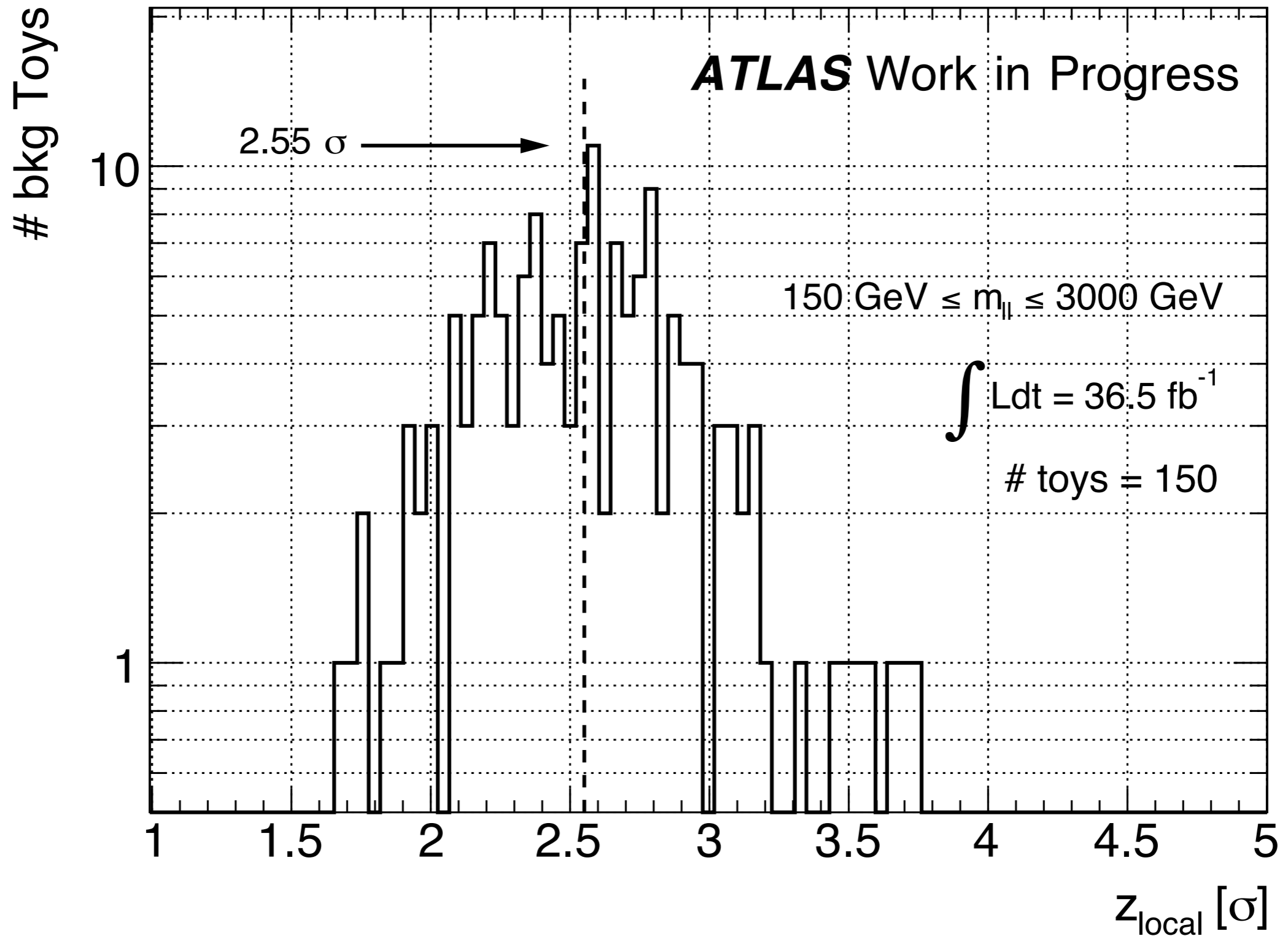
Largest local z-values (ee)



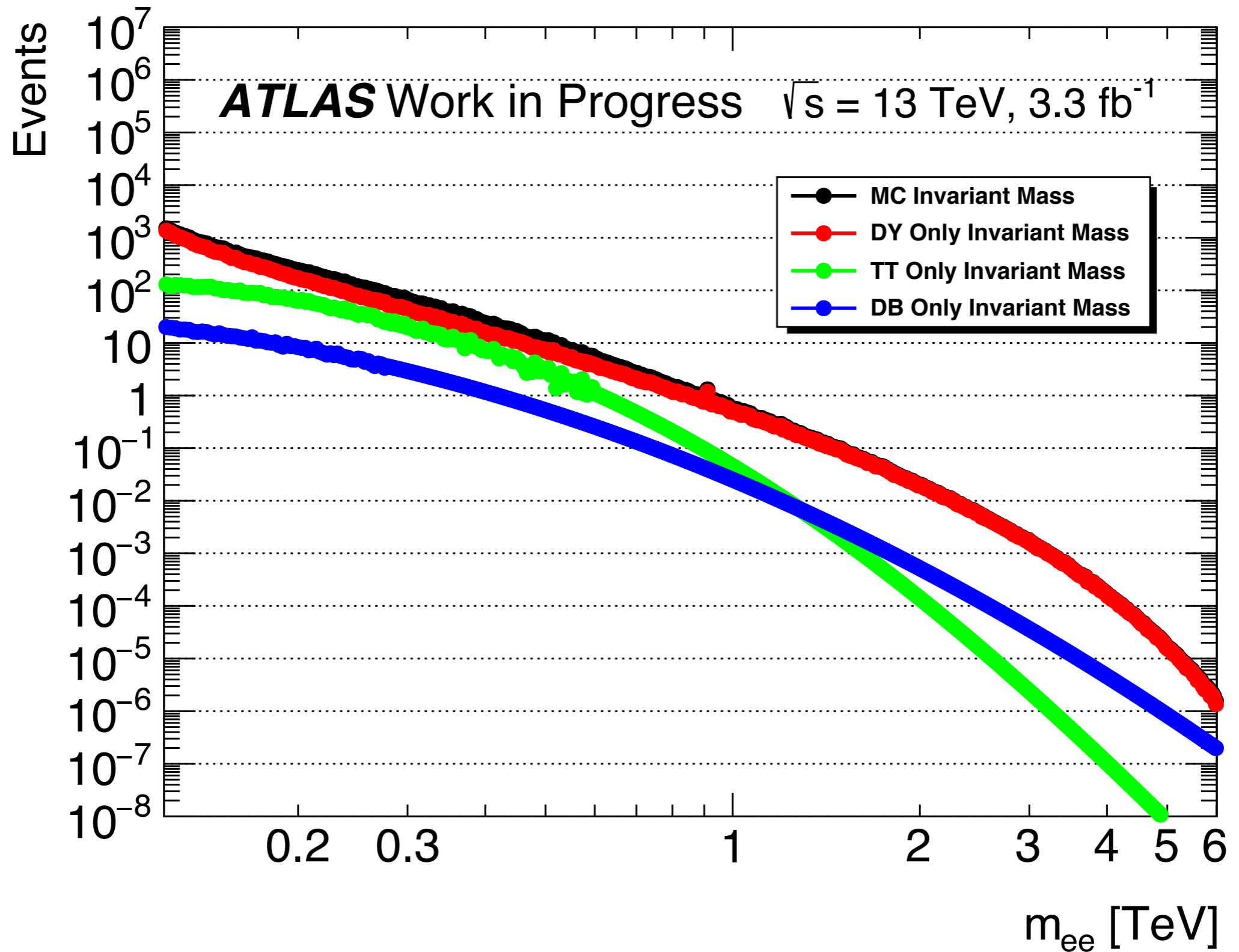
Largest local z-values ($\mu\mu$)



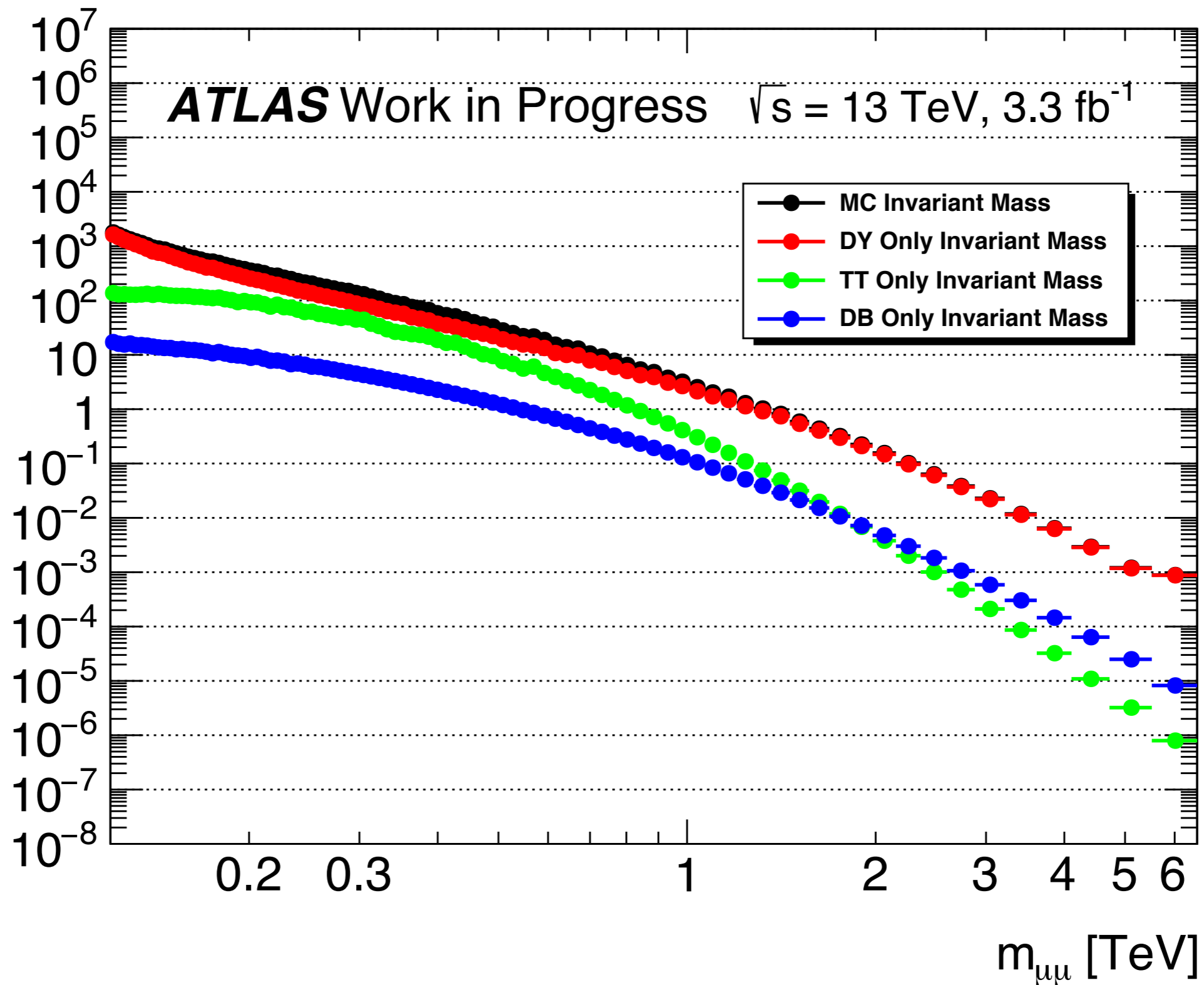
Largest local z-values (comb)



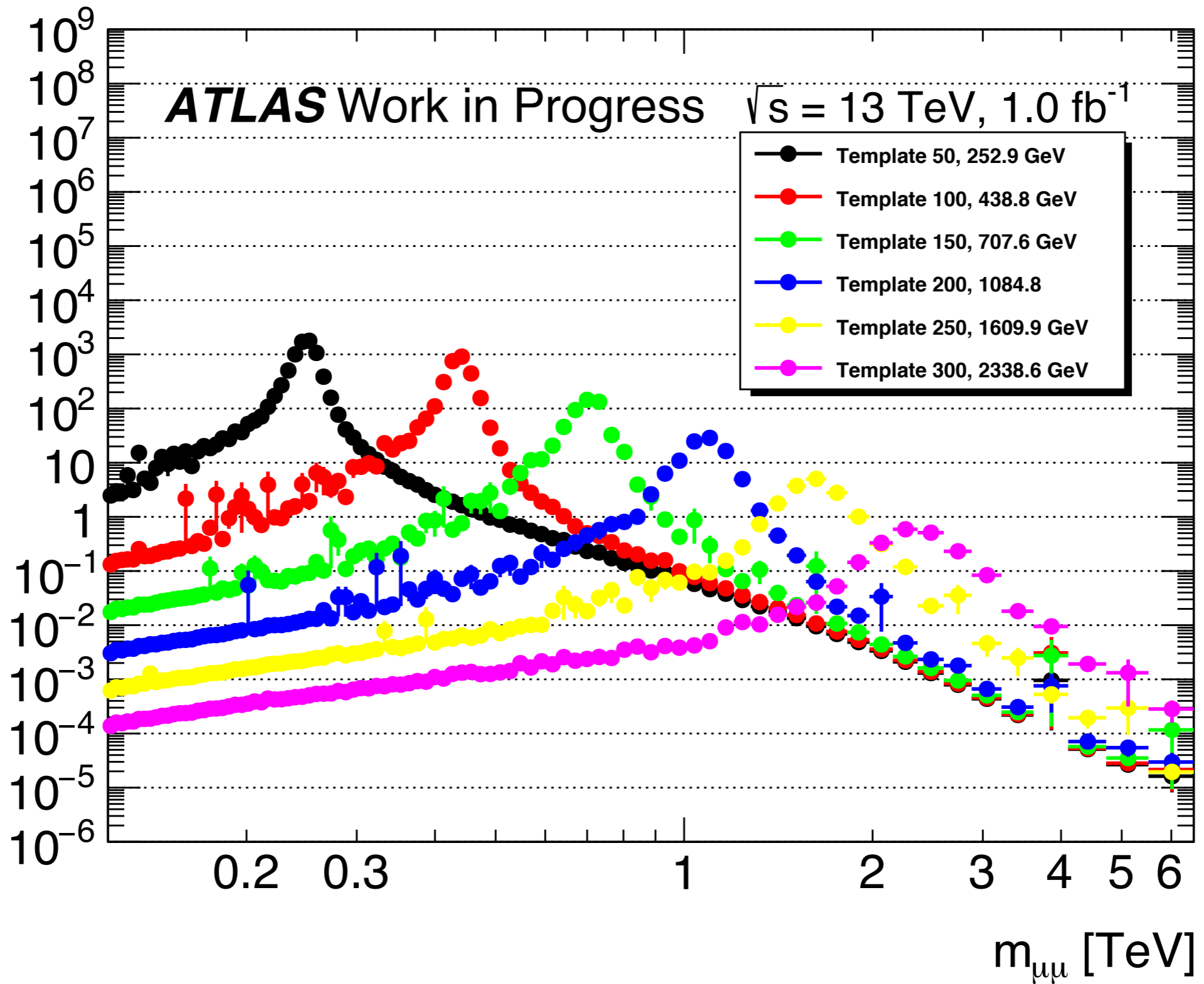
ee background templates



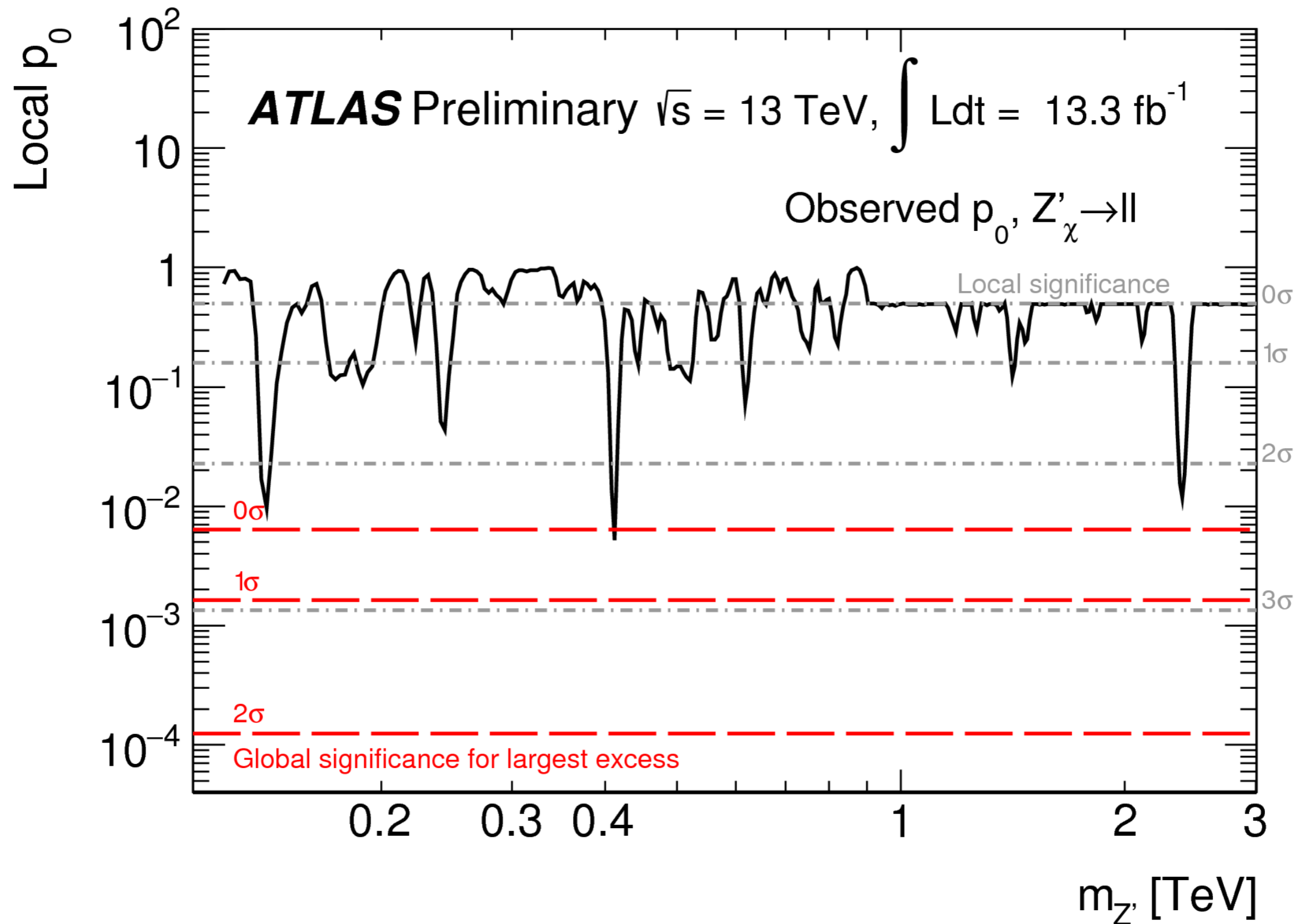
$\mu\mu$ background templates



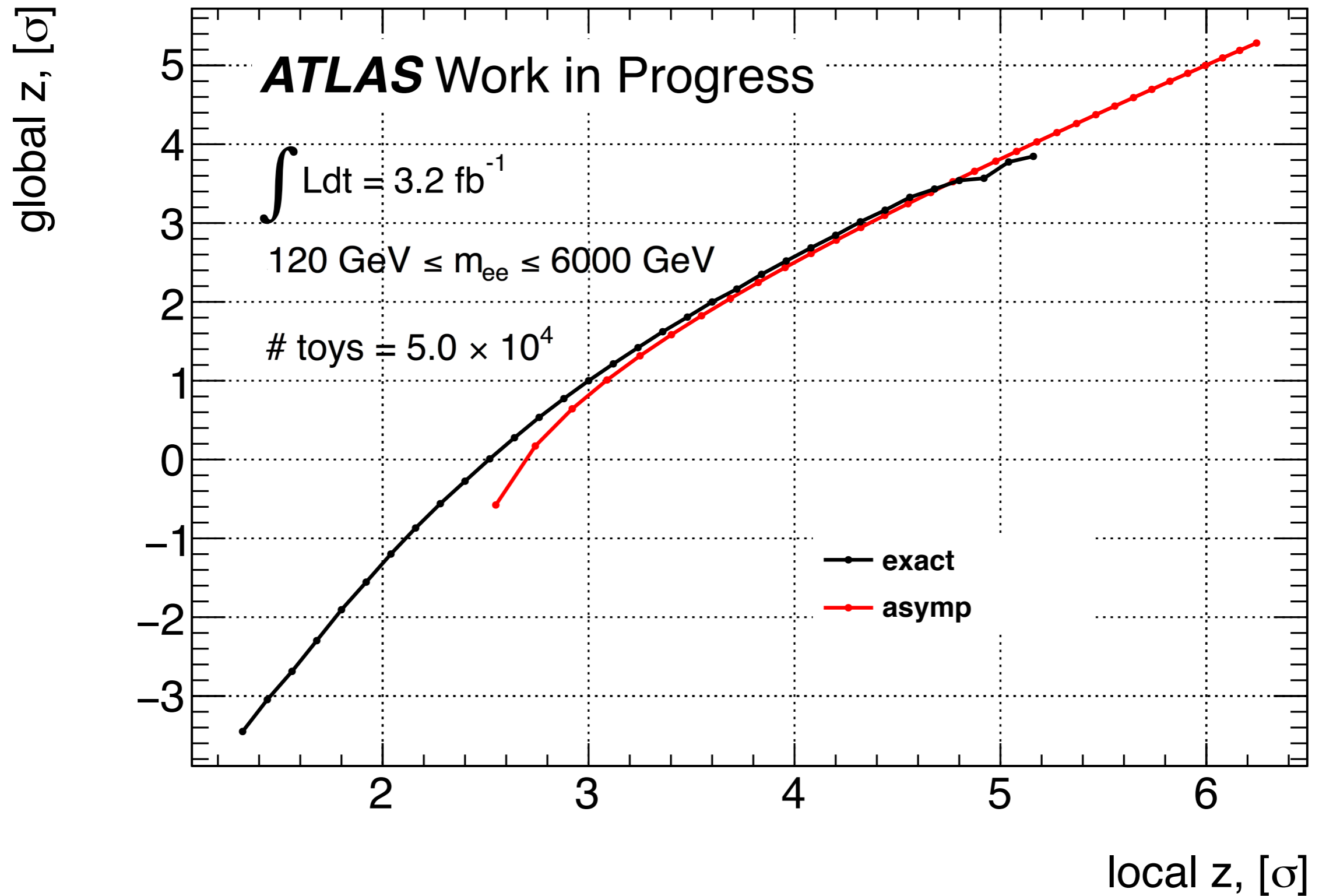
Signal templates ($\mu\mu$)



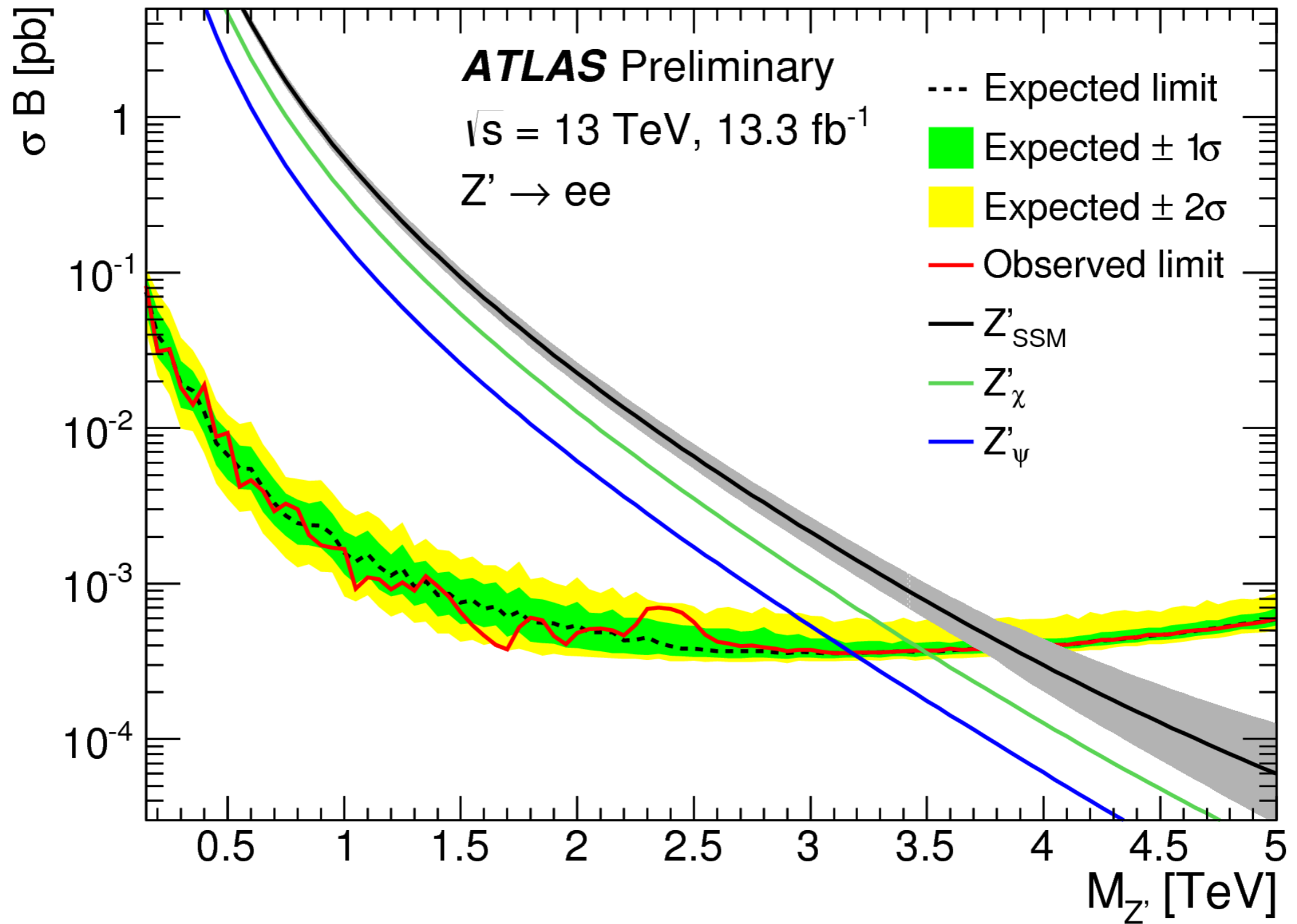
comb channel p-value scan



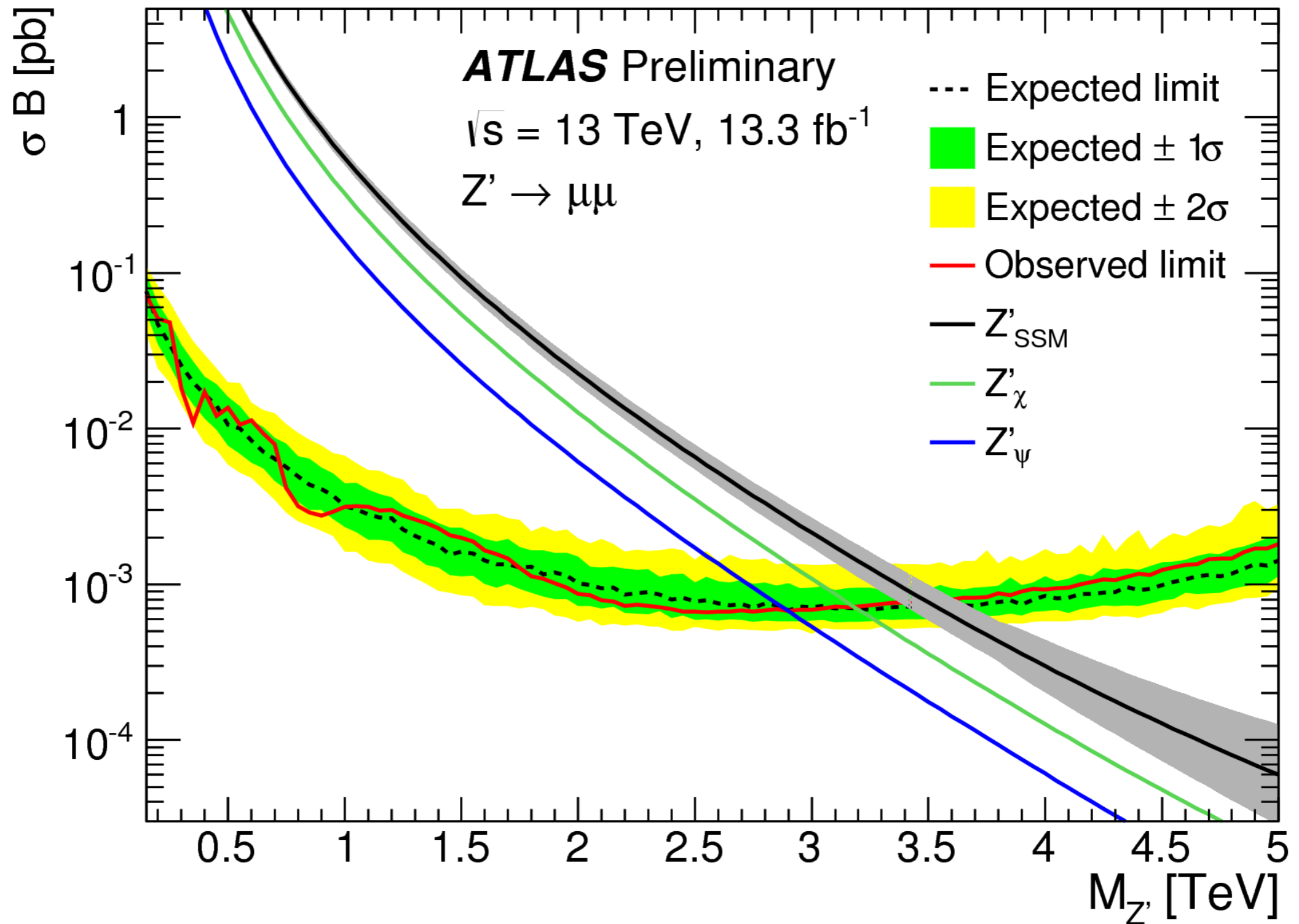
Validation without systematics



Exclusion limits (ee)



Exclusion limits ($\mu\mu$)



Exclusion limits (comb)

