

# STATISTICAL BIASES OF SPECTRAL ANALYSIS WITH THE ON-OFF LIKELIHOOD STATISTIC

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# ON-OFF spectral Analysis

- Typical source observation covers wide range of observational parameters (e.g. efficiency, zenith, offset)
- Strong IRFs (Instrument Response Function) dependence with the observational parameters and energy → IRFs are calculated for each observation.
- Strong Background event distribution dependence with the observational parameters:
  - ON, OFF (reflected background) → background spectrum for each observation
- But Low counts → Maximum Likelihood (M.L.) method taking into account the Poissonian statistic
- Background: no satisfactory background model so far → marginalize the background (“profile likelihood”):
  - *interest parameters*: spectral model parameters
  - *nuisance parameters*: Background (from ON and OFF)

# Motivation

- In order to keep all the information related to the observation conditions:
  - ➔ processes all the observations individually for the likelihood maximization
  - ➔ estimators of the number of events in the ON and OFF regions for each reconstructed energy bin.
  - ➔ Issue: Where there is as many nuisance parameters as observations: **estimators can be inconsistent** (i.e. do not converge to the right value even for an infinite number of observations)
- Observation grouping require to limit the number of nuisance parameters. How much grouping is needed to have negligible biases?
- *To test the impact of observation grouping on the estimators biases ➔ MC (Monte Carlo) tool that simulate ON & OFF spectra*

# MCs tool in the H.E.S.S. analysis framework

- For each observation (given set of observational parameters: zenith angle  $Z$ , offset  $\theta$  and optical efficiency  $\epsilon$ ): simulation of the ON and OFF data.

For each run  $j$  and enrgy bin  $i$ :

• **Signal:**

$$\overline{S_{i,j}} = \Delta T \int_{E_{m_i}}^{E_{m_{i+1}}} dE_m \int_{E=0}^{\infty} \phi(E) A(E, Z_j, \theta_j, \epsilon_j) R(E, E_m, Z_j, \theta_j, \epsilon_j) dE$$

Intrinsic source spectrum

IRFs



$$S_{i,j} = P(\overline{S_{i,j}})$$

# MCs tool in the H.E.S.S. analysis framework

- For each run (given set of observational parameters: zenith angle  $Z$ , offset  $\theta$  and optical efficiency  $\epsilon$ ): simulation of the ON and OFF data.

- Signal:** 
$$\overline{S}_{i,j} = \Delta T \int_{E_{m_i}}^{E_{m_{i+1}}} dE_m \int_{E=0}^{\infty} \phi(E) A(E, Z_j, \theta_j, \epsilon_j) R(E, E_m, Z_j, \theta_j, \epsilon_j) dE$$

- Background:**

$$\overline{B}_{i,j E < 1 \text{ TeV}} = N_{OFF i,j}$$

$$N_{OFF i,j} = \overline{B}_{i,j} \quad (E < 1 \text{ TeV})$$

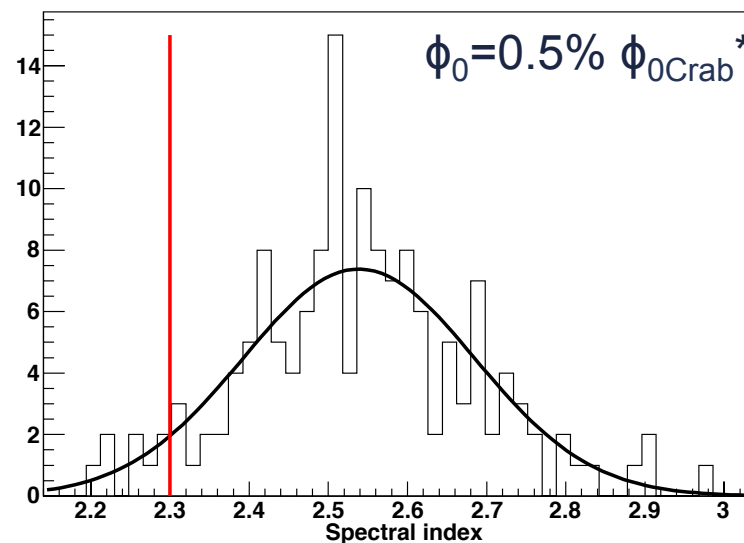
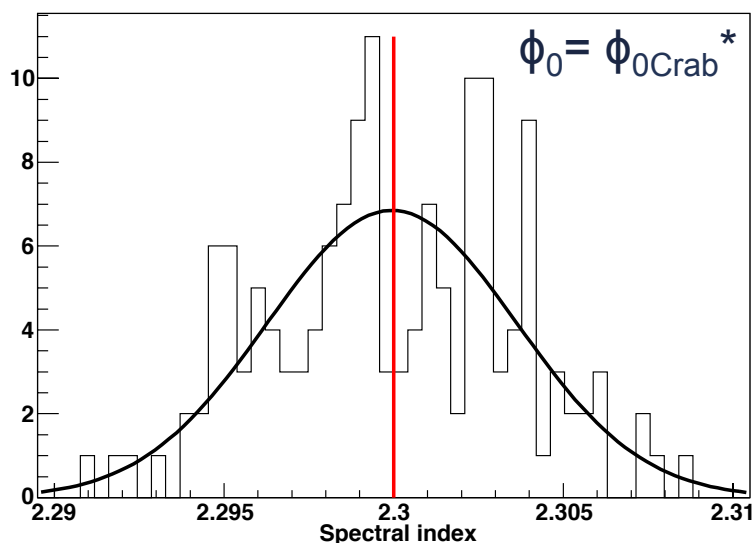
$$\overline{B}_{i,j E > 1 \text{ TeV}} = \int_{E_i}^{E_{i+1}} \phi_j \times E^{-2.7} dE$$

$$N_{OFF i,j} = P(\overline{B}_{i,j}) \quad (E > 1 \text{ TeV})$$

# MC simulation for bright and faint sources

- 250h of observation with a large variation of the observational parameters
- We generate 150 simulated spectra and apply each time the fitting procedure to these individual fake data

## Distribution of the spectral index $\Gamma$ fitted on 150 simulated spectra



## Processes all the observations individually for the likelihood maximization

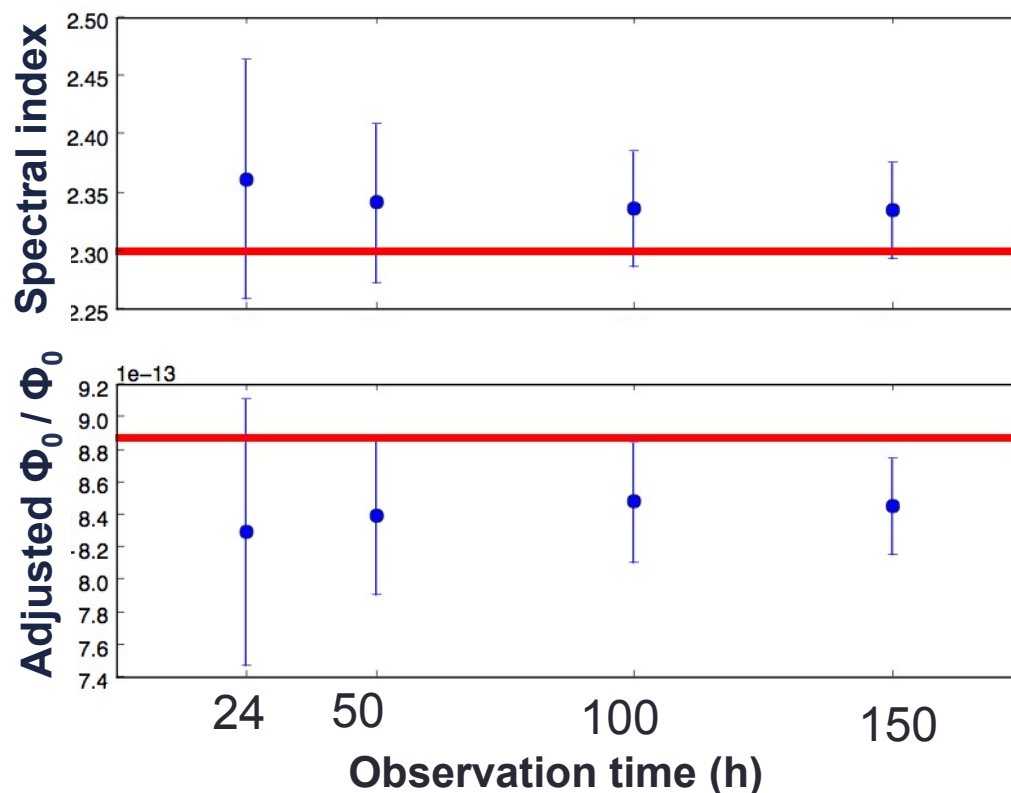
- Bright source: estimators consistent and not biased
- For faint sources: Necessity of spectral grouping to avoid inconsistency

\* $\phi_{0\text{Crab}} = 4.44 \cdot 10^{-11} \text{ cm}^{-2} \text{ s}^{-1} \text{ TeV}^{-1}$

# No grouping: Inconsistent estimators

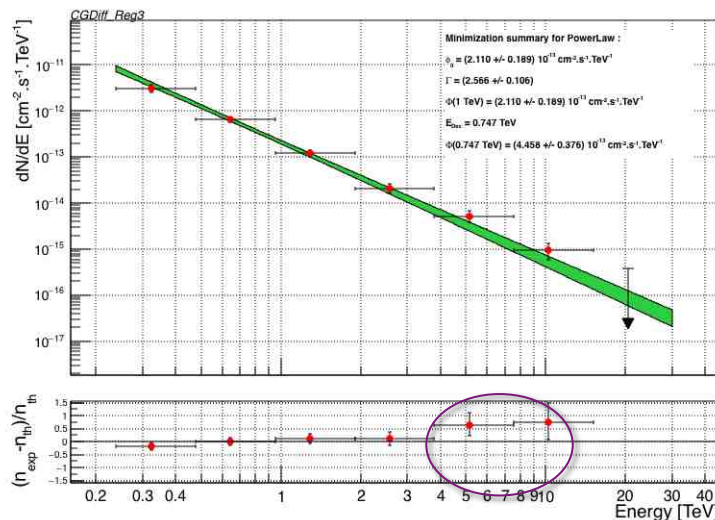
- Several observations time: 24h, 50h, 100h, 150h
- Power-law:  $\Gamma=2.3$  and  $\phi_0 = 2\% \phi_{0\text{Crab}}^*$

**Mean value of the adjusted parameters. distribution on the 150 simulated spectra.**

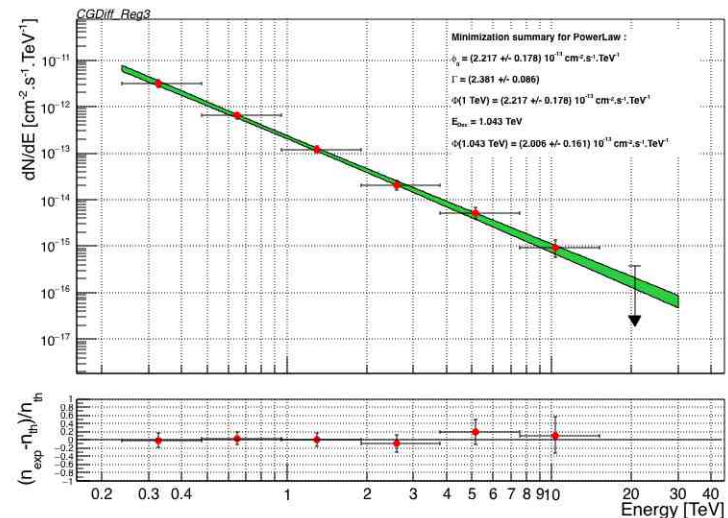


# Observations grouping

- The IRFs and OFF event distribution: large variations depending on the observational parameters
- The observation grouping **combines the observations with similar observational conditions** in various bands of zenith, offset and efficiency.
- *The maximization of the likelihood function is done band by band with this observations grouping option.*



Without any observation grouping

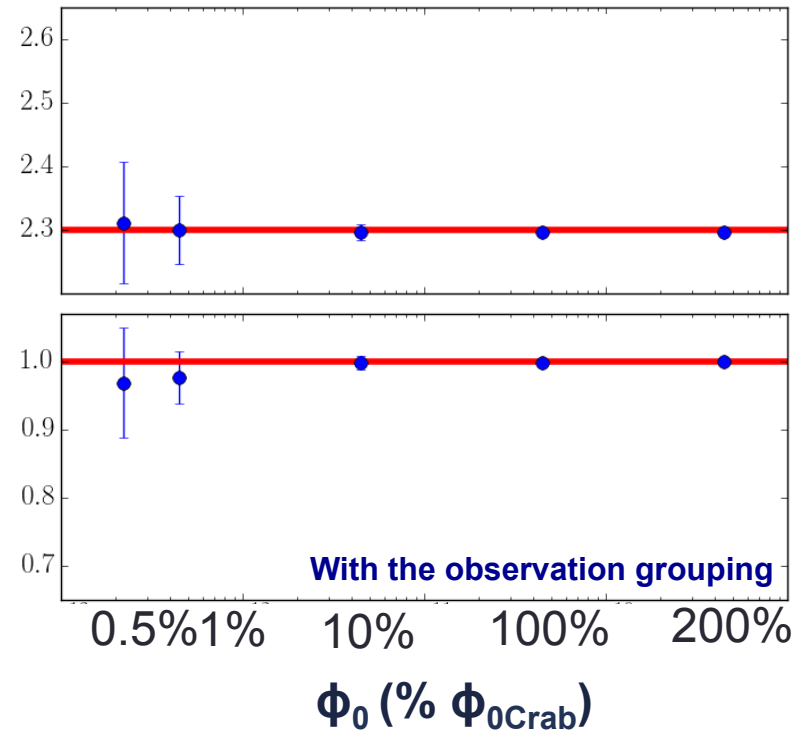
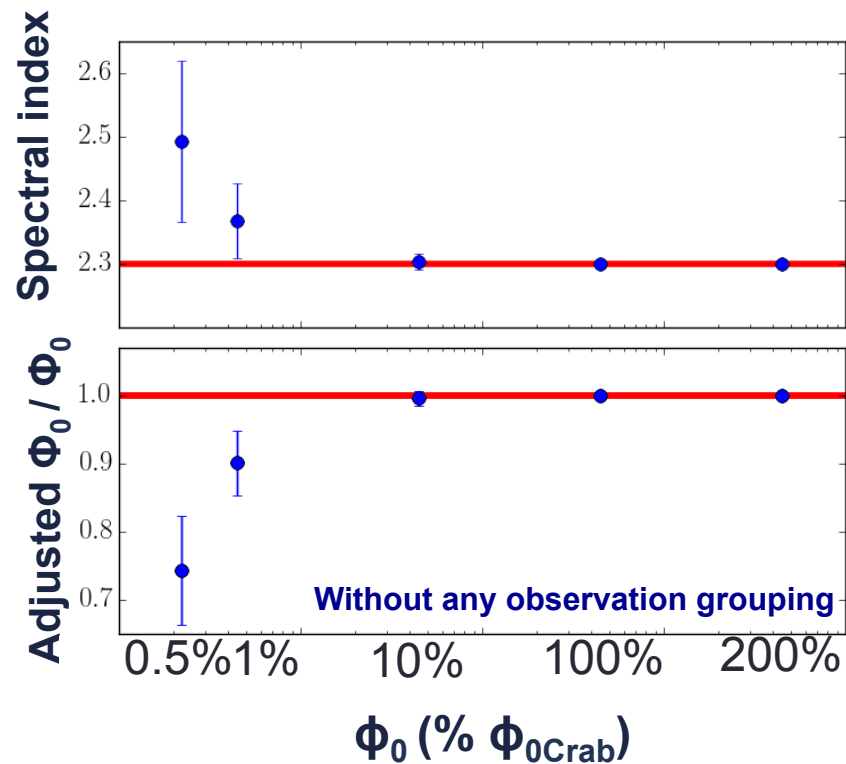


With the observation grouping



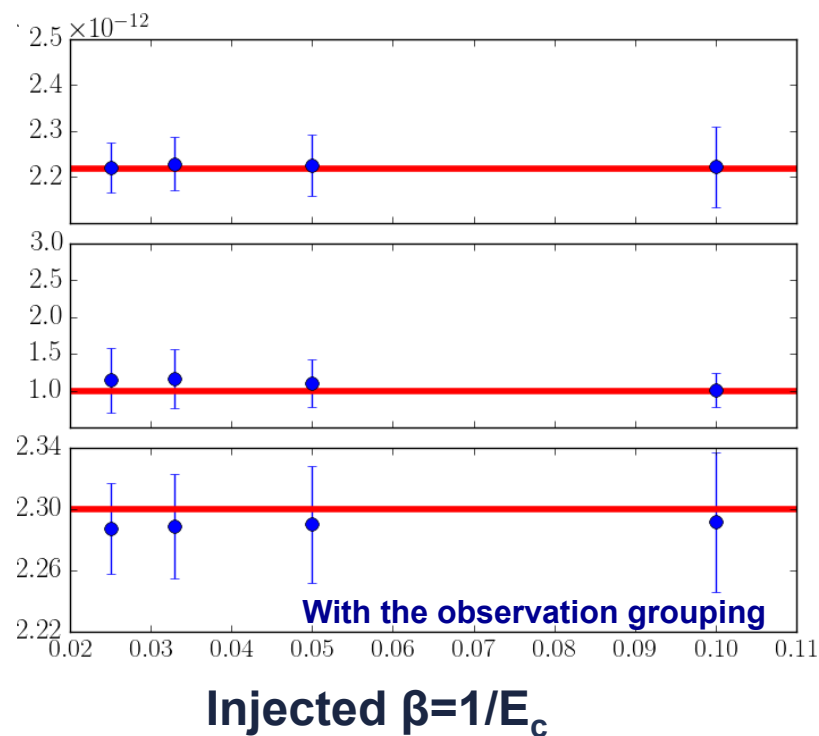
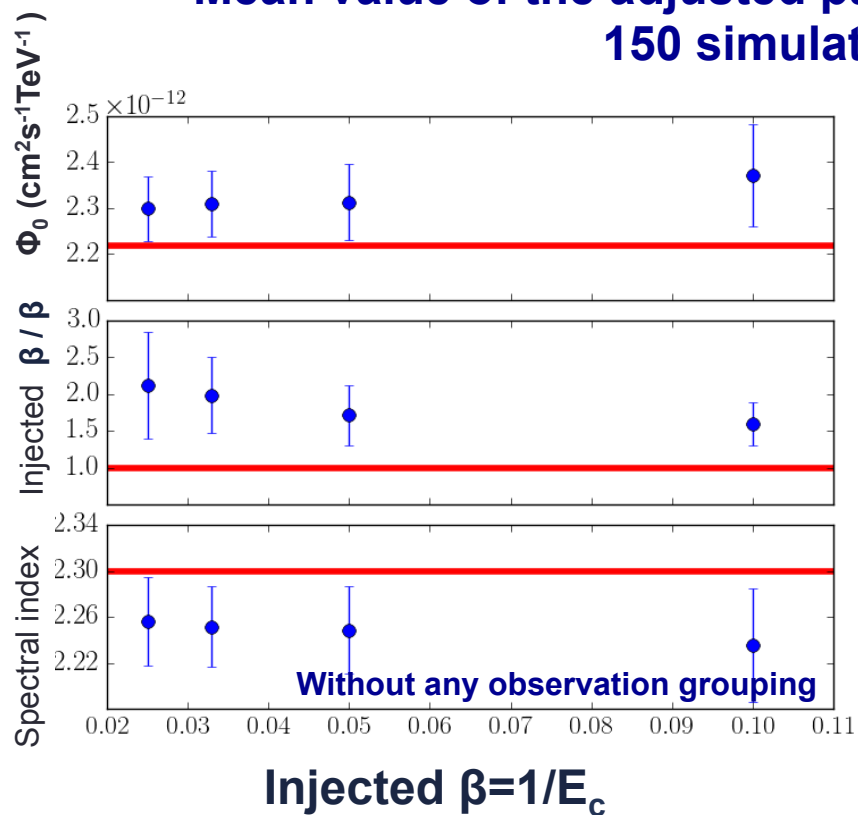
# Power-law ( $\Gamma=2.3$ ) : impact of the differential flux normalization $\phi_0$

Mean value of the adjusted parameters. distribution on the 150 simulated spectra.



# Power-law with an exponential cutoff ( $\Gamma=2.3$ and $\phi_0=5\%\phi_{0\text{Crab}}$ ): impact of the cutoff $E_c$

**Mean value of the adjusted parameters. distribution on the 150 simulated spectra.**



# Conclusion

- **ON-OFF likelihood** can lead to **bias spectral parameters** especially **for faint sources**.
- **Combining** the observations greatly **improves the reconstruction** of the spectral parameters.
- MC simulation is necessary to test the consistency of the fitted spectral parameters.
  - Spectral analysis package must provide the ability to fake a data set
- Using a hadronic background model remove this issue but introduce a systematic effect

Thanks for your attention