

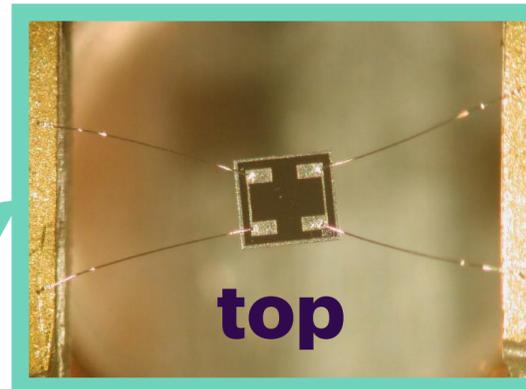
BAYESIAN ANALYSIS OF ^{187}Re DATA FROM THE MIBETA EXPERIMENT

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MIBETA (1996 - 2003)

- **Calorimetric** measurement of the electronic **anti-neutrino mass** from ^{187}Re beta decay ($Q \approx 2470$ eV).
- Detector: 2 arrays of 5 **microcalorimeters** consisting of an **AgReO4 crystal** and **Si thermistor** [1][2].



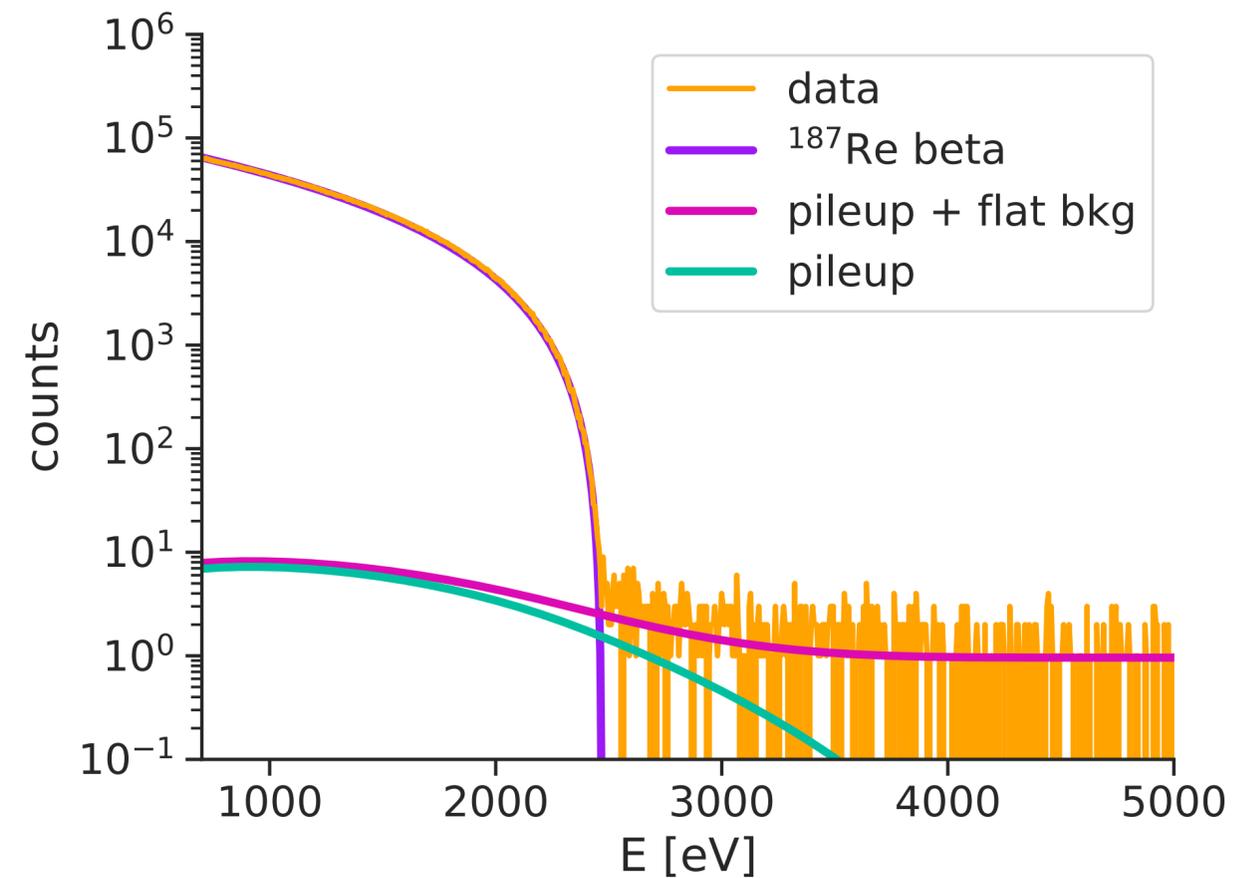
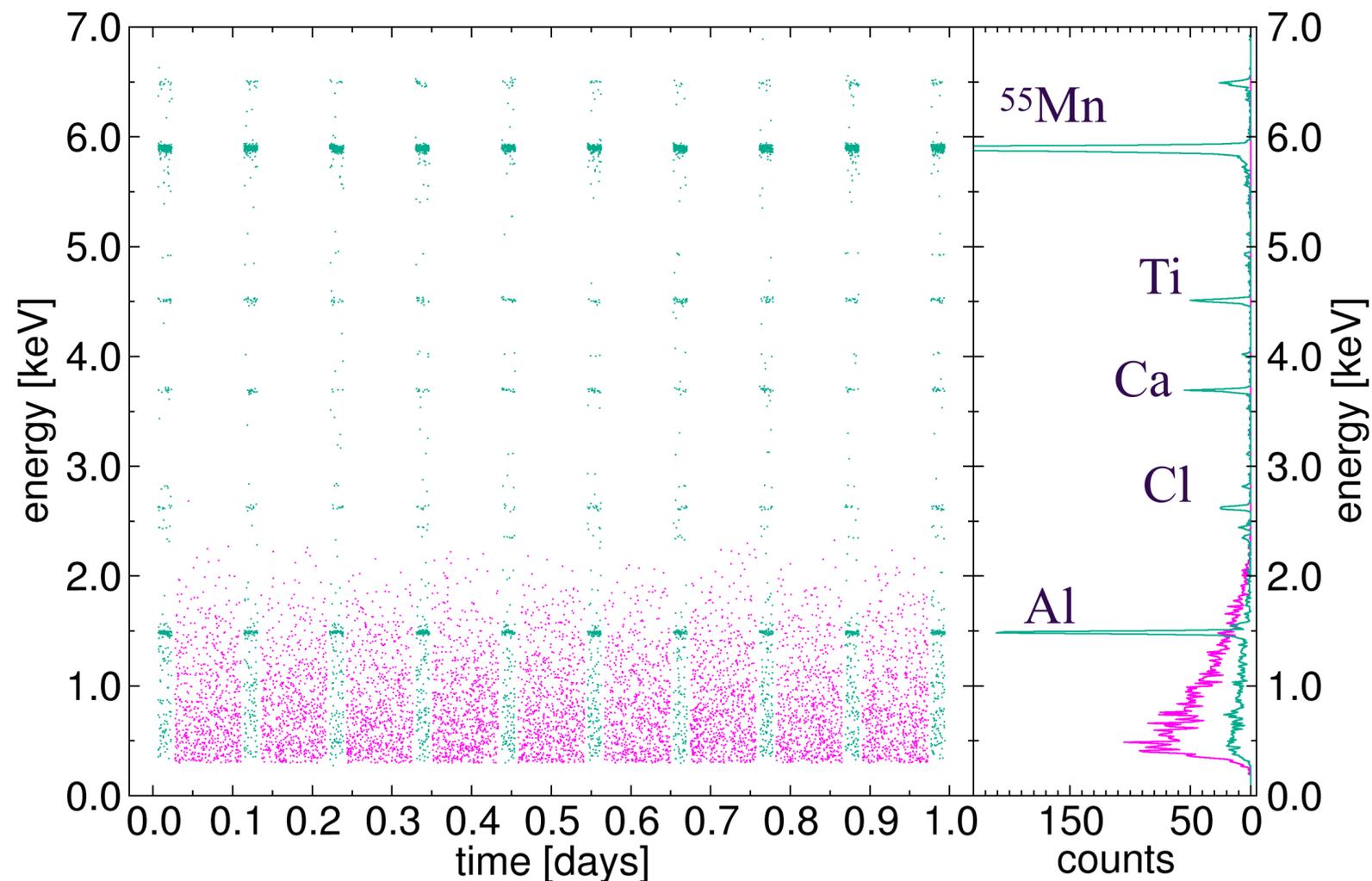
- **Detectors performance:**
FWHM = 28 eV, ^{187}Re activity 0.15 Bq, rise time 0.5 ms
- **Frequentist result** (unpublished) of measurement campaign: $m_\nu \leq 15.3 \pm 2$ (syst) eV at 90% CL, $Q = 2465.3 \pm 0.5 \pm 1.5$ eV
- **This work:** treatment of additional systematics, build robust bayesian fitting procedure for the endpoint to use in future **HOLMES** analysis.

[1] M. Sisti and others, "New limits from the Milano neutrino mass experiment with thermal microcalorimeters," Nucl. Instrum. Meth. A, vol. 520, pp. 125–131, 2004,

[2] C. Arnaboldi and others, "Bolometric bounds on the anti-neutrino mass," Phys. Rev. Lett., vol. 91, p. 161802, 2003

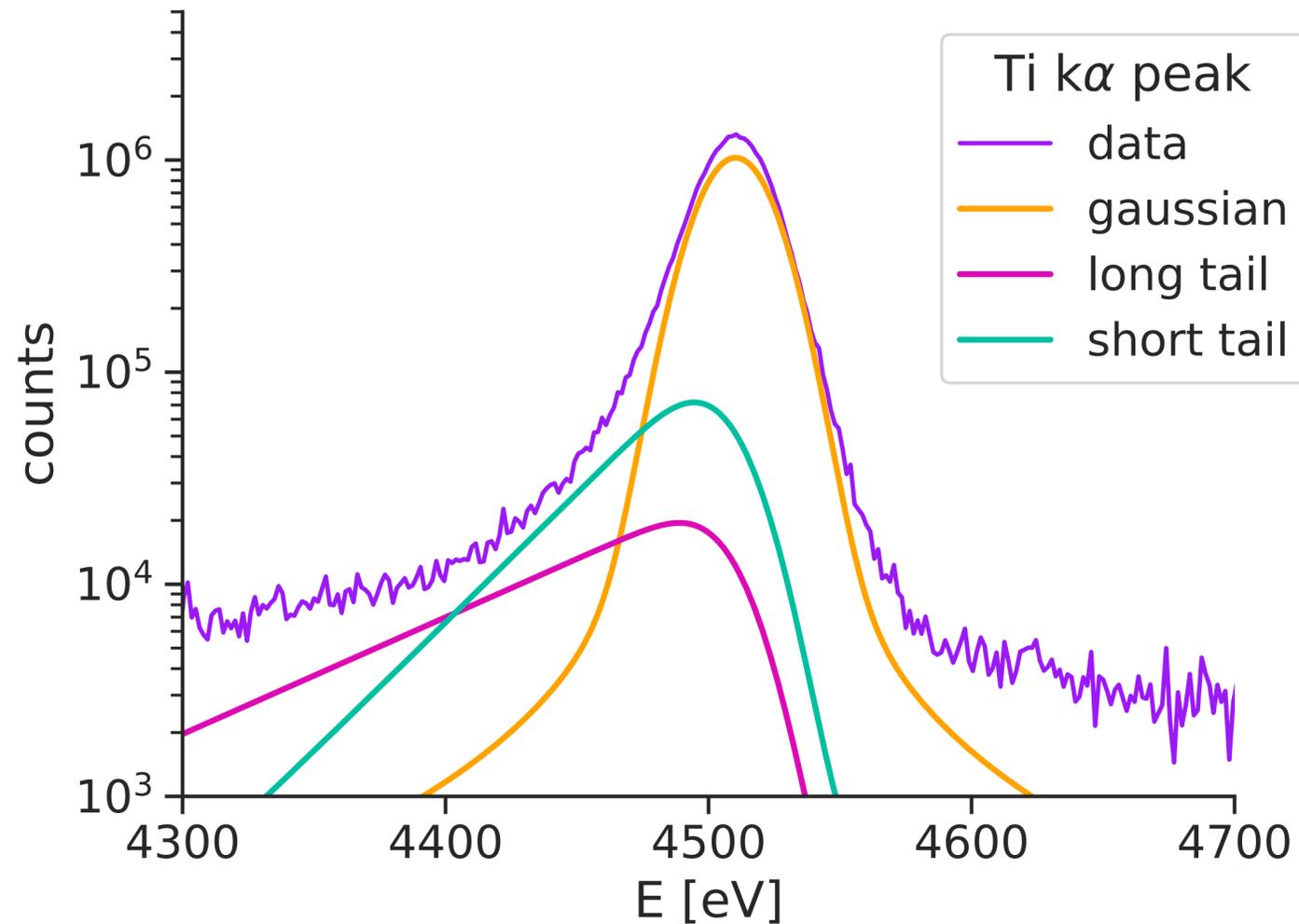
AVAILABLE DATA

- $N_{tot} \sim 10^7$ beta events from 8 detectors in RUN 14 (5 months between 2002-2003).
- Data is **already calibrated and binned** with 0.6 eV bin width.



- Additional events from ^{55}Fe **calibration source** collected intermittently during the measurement.
- Considered **compound spectrum** of all detectors due to similar activity, FWHM and very small energy offsets from calibration.

EXPERIMENTAL RESPONSE



- Observed calibration peaks are **asymmetric** towards lower energies due to detector's response.
- Response can be described by mixture of a symmetric gaussian and its convolution with two different exponentials.

$$R(E, FWHM, A_1, A_2, \lambda_1, \lambda_2) = (1 - A_{long} - A_{short})Gauss(E,0,FWHM) + A_{long}Exp(E, \lambda_{long}) \otimes Gauss(E,0,FWHM) + A_{short}Exp(E, \lambda_{short}) \otimes Gauss(E,0,FWHM) +$$

- Long exponential tail attributed to surface effects and **limited to external source only [3]**.
- **Short tail must be included** in the internal detector response.

[3] E. Ferri and others, "Investigation of peak shapes in the MIBETA experiment calibrations." *The European Physical Journal A* 48, 2012

FIT LIKELIHOOD AND METHOD

- **Updated theoretical description [4]:** interpolation within 10^{-5} relative accuracy of spectrum considering atomic effects.
- **Analytic approximation of pileup** $y_{pu}(E, Q)$ obtained by auto-convolution of $(Q - E)^2$ dependence which was used in previous analyses.

$$y_{th}(E, Q, m_\nu) \propto F(E)pE(Q - E)\sqrt{(Q - E)^2 - m_\nu^2}D_{exc}(E)$$

$$y_{pu}(E, Q) \propto (Q - E)^2 \otimes (Q - E)^2$$

$$y(E, m_\nu, Q, N_{bkg}, f_{pu}, A, FWHM, \lambda, A_{exp}) \propto A[(1 - f_{pu})y_{th}(E, Q, m_\nu) + f_{pu}y_{pu}(E, Q) + N_{bkg}] \otimes R(E, FWHM, A_{exp}, \lambda)$$

- 8 parameters total: 5 parameters for the spectrum and 3 for the experimental response.
- Fit performed over binned data considering **poisson fluctuations** for each bin, 1.2 eV bins.
- Model implemented in **Stan**, an **Hamiltonian Monte Carlo** engine.
- Given a **model = priors + likelihood**, fit result consists of **samples from the posterior distribution**.

[4] O. Nițescu, R. Dvornický, and F. Šimkovic “Atomic corrections for the unique first-forbidden β transition of ^{187}Re ” Phys. Rev. C 109, 2023

PRIORS - SPECTRUM

- **How to choose priors?** measurement, physical limits, model stability and regularization.

- Priors can be used to **model the systematics** of the experiment

- Flat prior for $m_\nu \sim \text{uniform}(0 \text{ eV}, m_{max} \geq 300 \text{ eV})$

- Prior for Q centered on PENTATRAP measurement [5]
 $Q = 2470.9 \pm 1.3 \text{ eV} \rightarrow Q \sim \text{normal}(2740.9 \text{ eV}, 10 \text{ eV})$

- Background estimated from mean and number of events **between 4 keV and 6 keV**

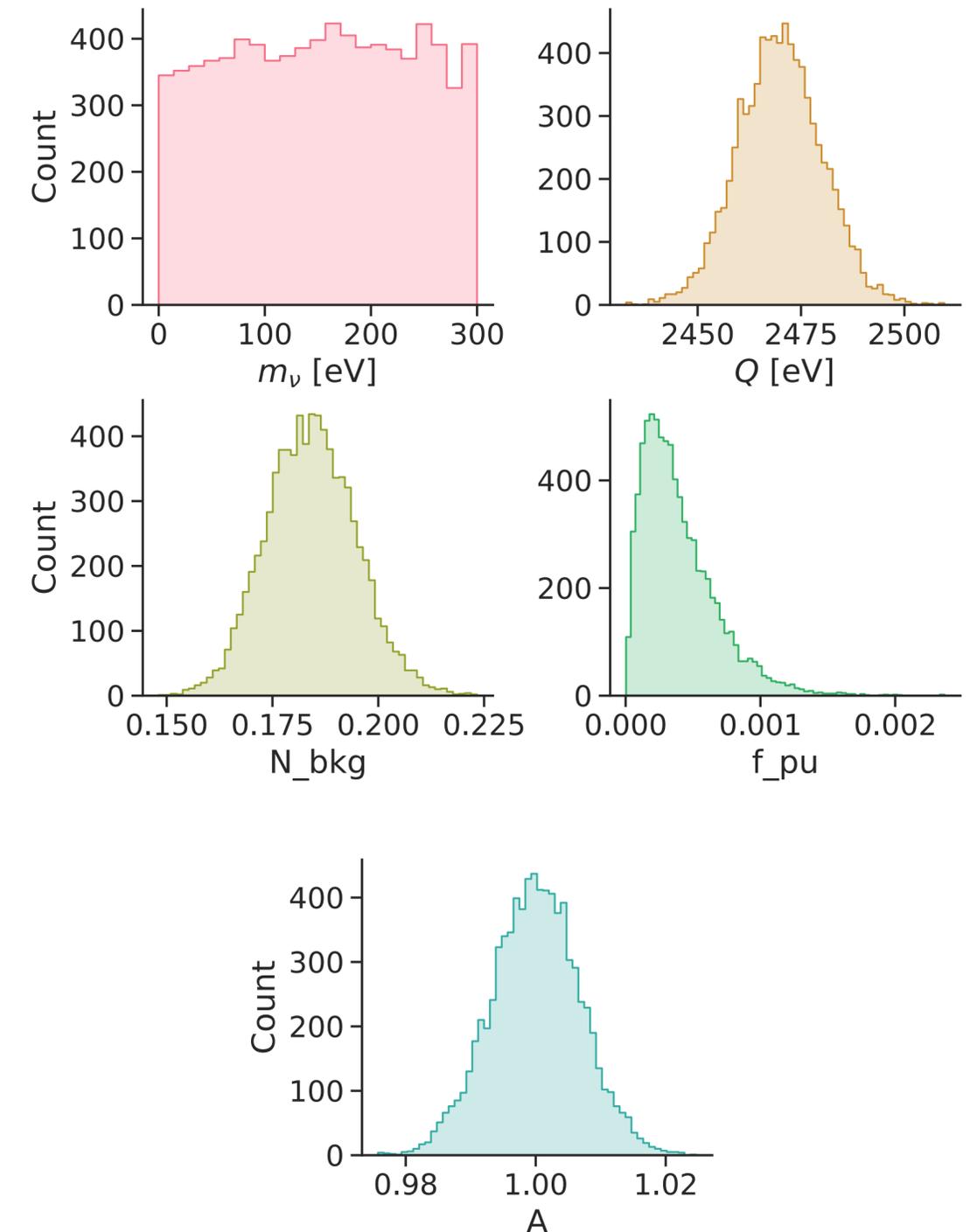
$$N_{bkg} \sim \text{gamma} \left(\sum y(E_i), \text{len}(y(E_i)) \right)$$

- Pileup fraction prior centered on $A_{Re}\tau_R = 0.15 \times 0.5 \times 10^{-3} \text{ s}$

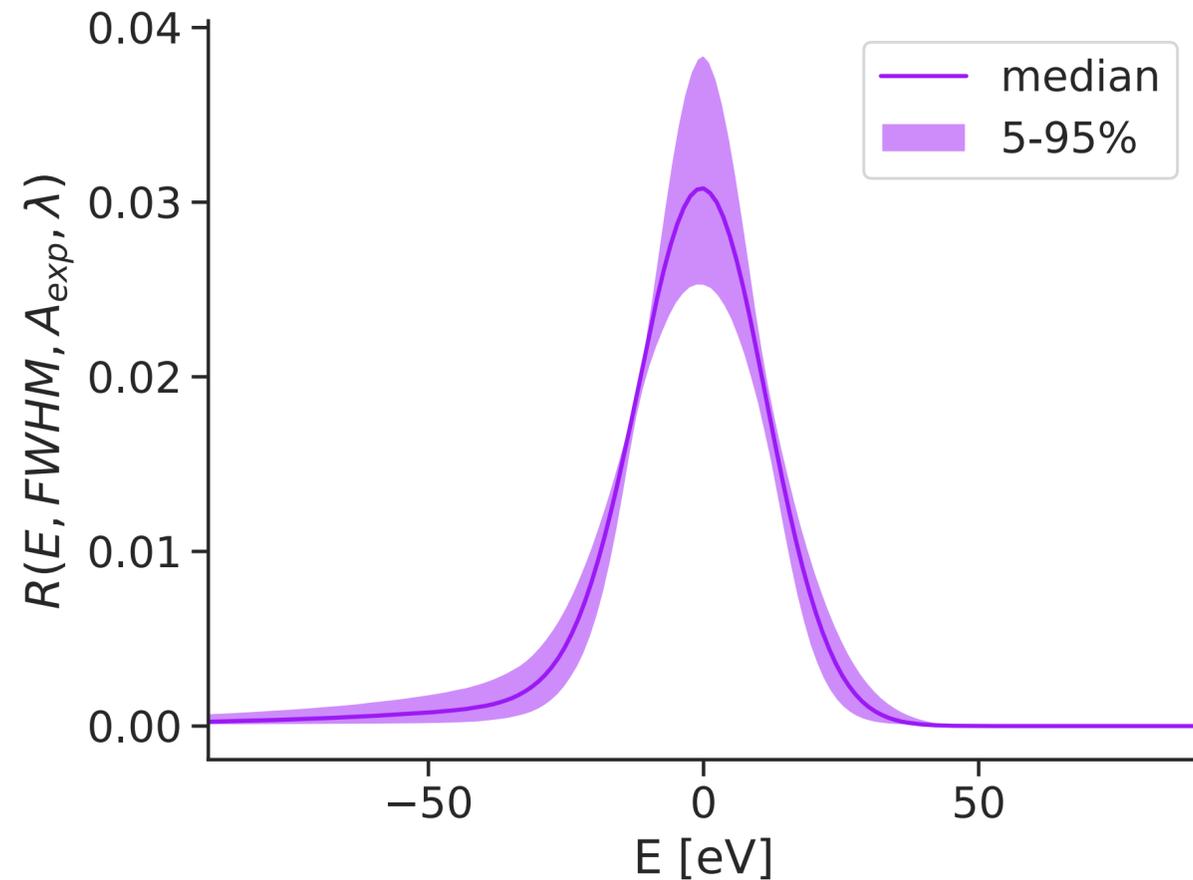
$$f_{pu}(\times 10^4) \sim \text{gamma}(3.5, 0.5)$$

- Normalization prior from Poisson statistics

$$A \sim \text{normal}(1, 1/\sqrt{N_{ev}})$$

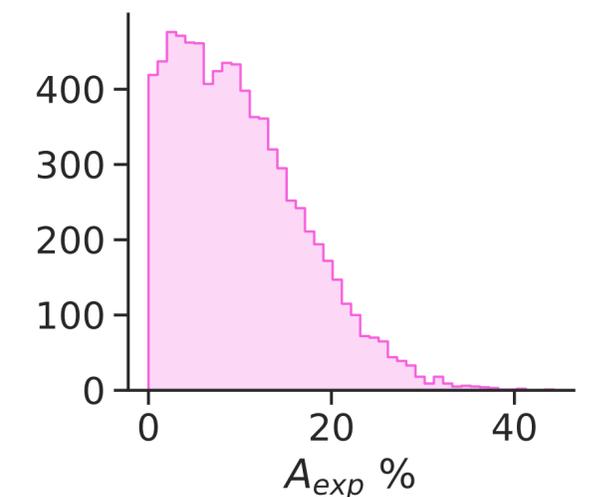
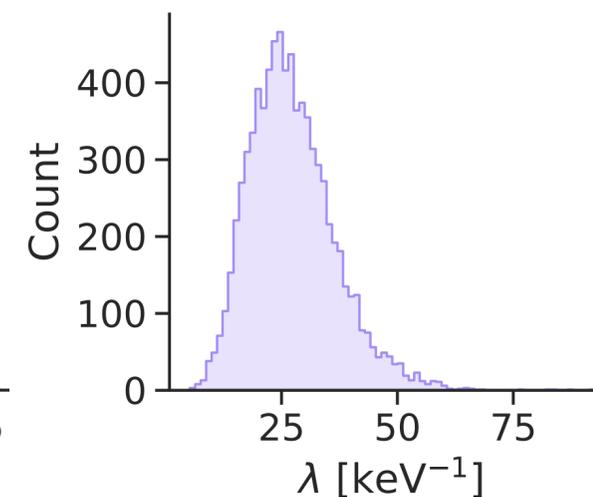
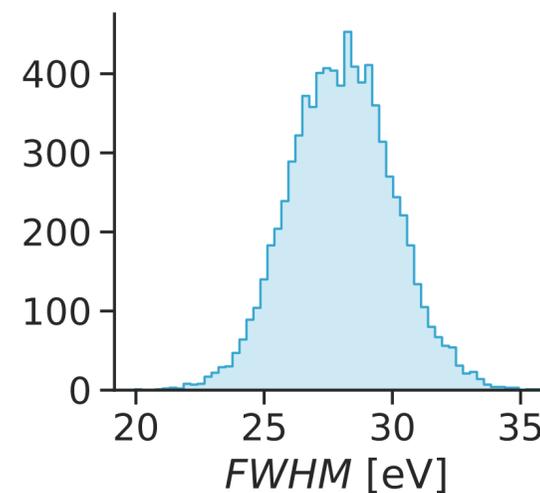


PRIORS - RESPONSE

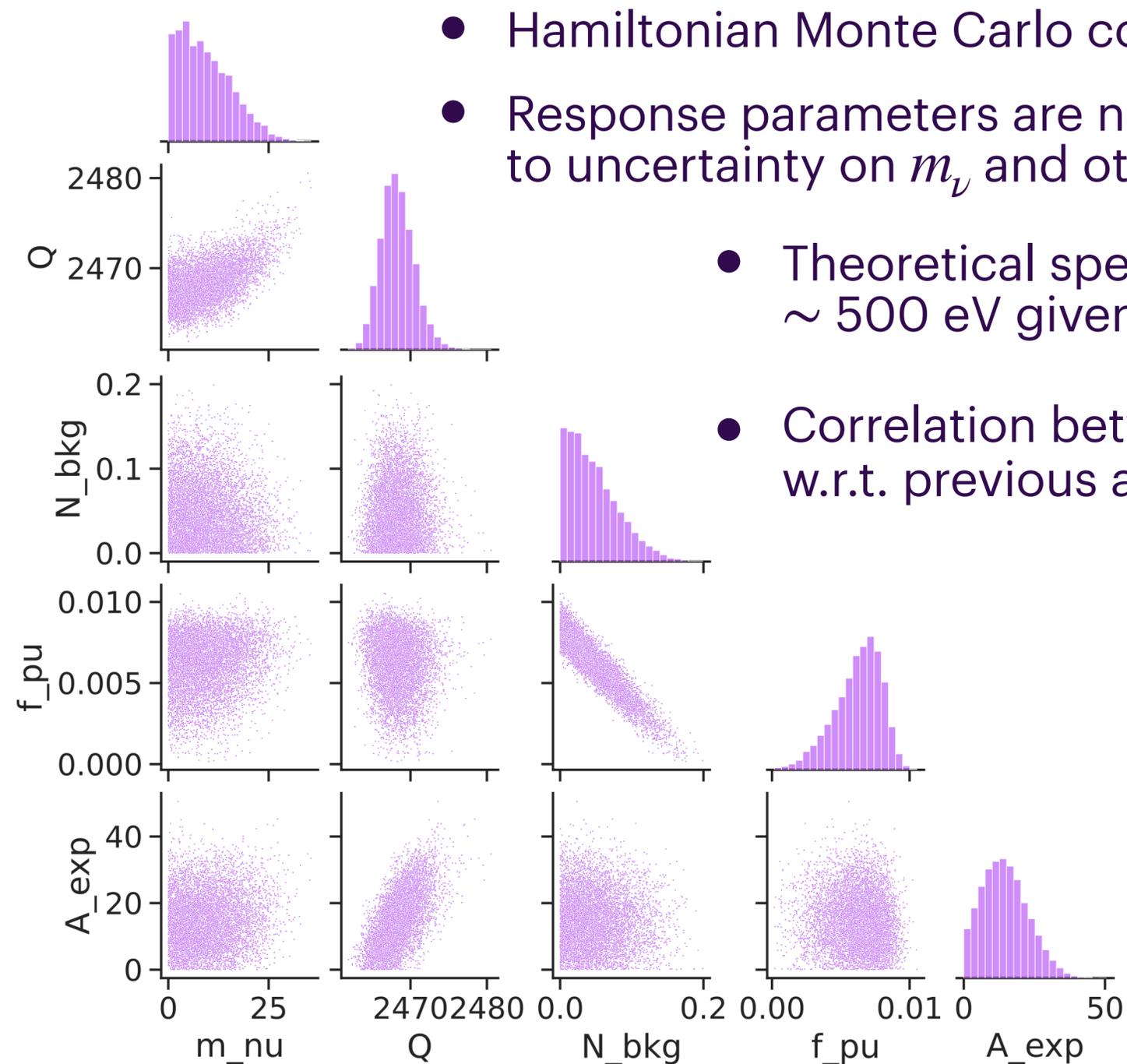


- Range of predicted experimental response functions can be visualized with **prior predictive check**.

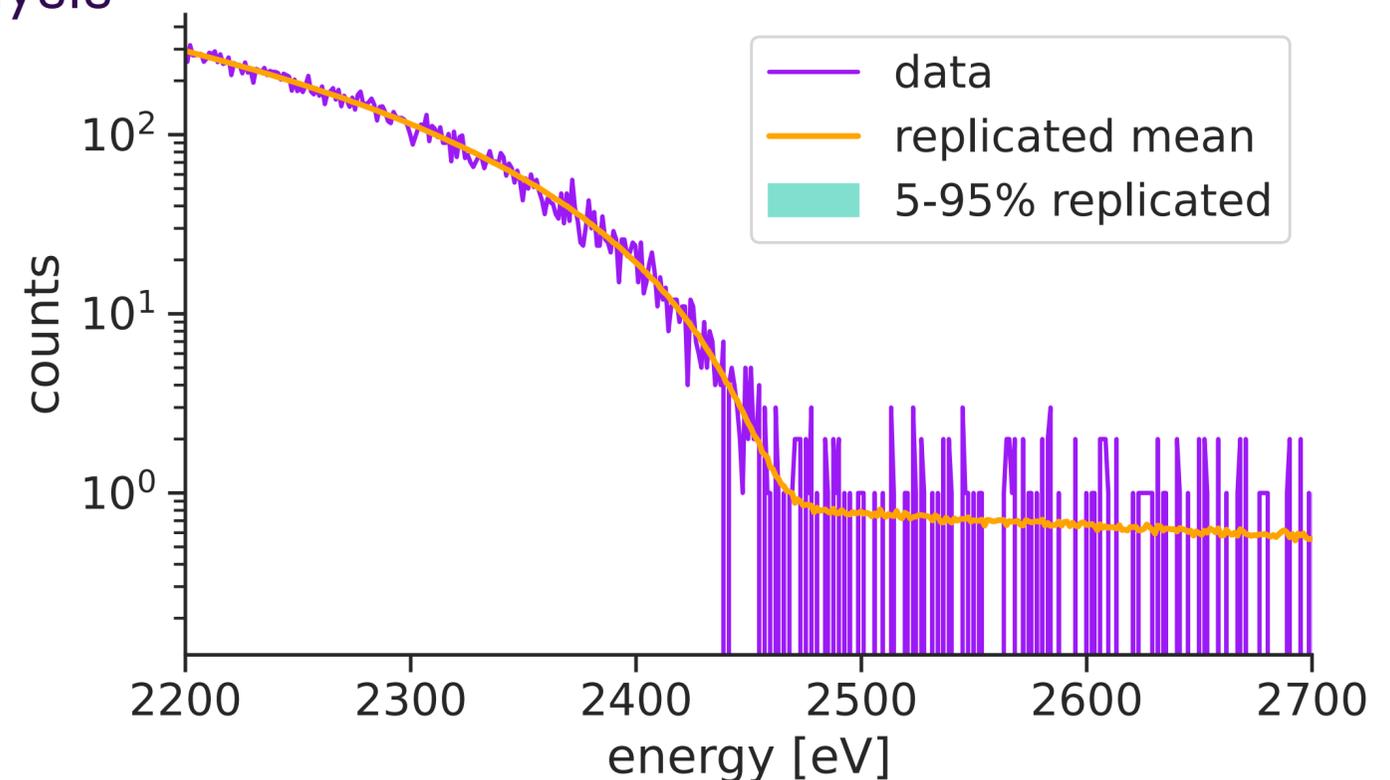
- Response priors obtained from **fit of calibration peaks**.
- $FWHM \sim \text{normal}(28.1 \text{ eV}, 2.5 \text{ eV})$ considers extrapolation of resolution at endpoint (2470 .9 eV)
- $\lambda \sim \text{normal}(27 \text{ keV}^{-1}, 10 \text{ keV}^{-1}), \lambda \geq 0 \text{ keV}$
- $A_{exp} \sim \text{normal}(0.05, 0.1), A_{exp} \geq 0$



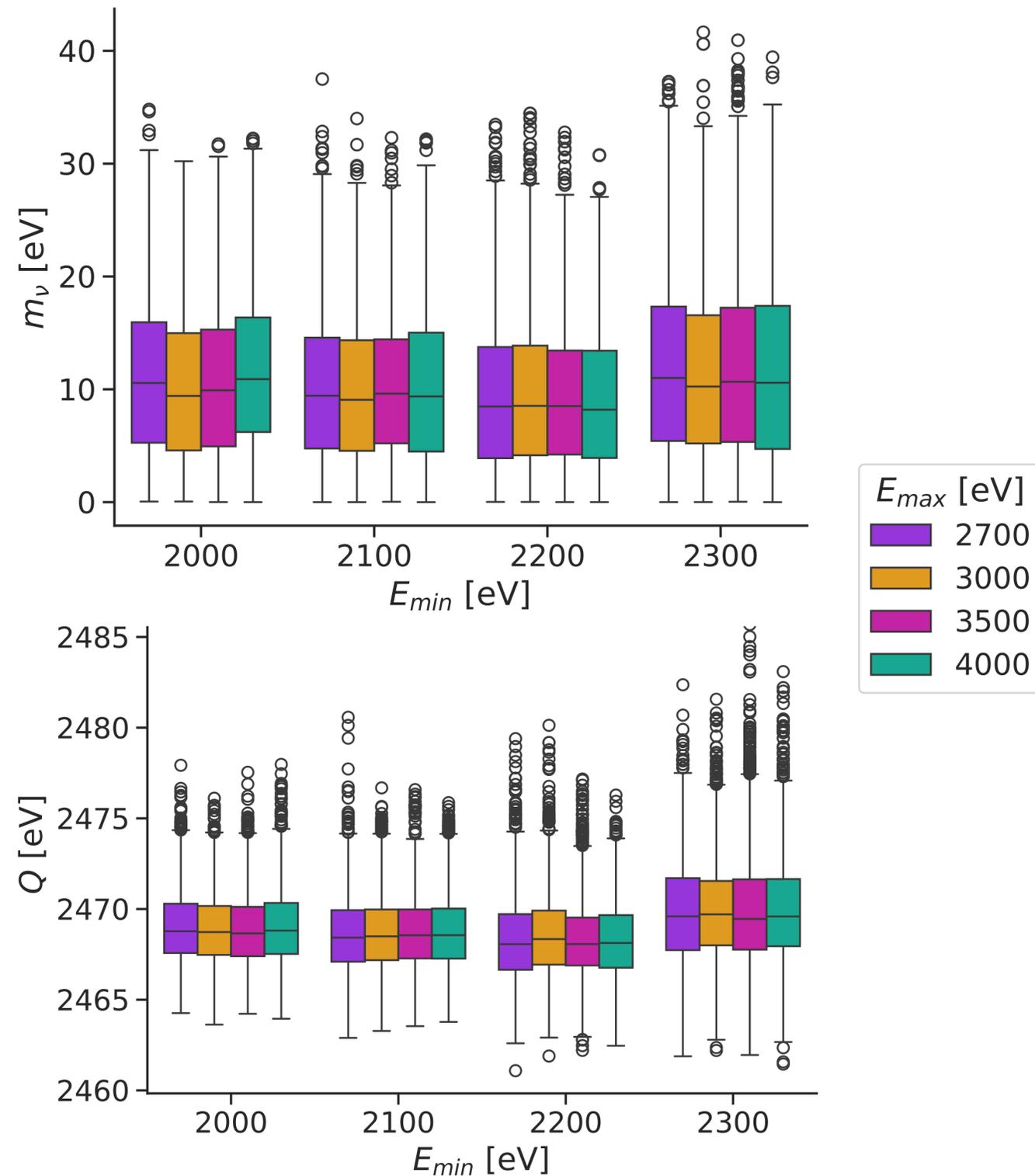
POSTERIOR AND RELEVANT CORRELATIONS



- Hamiltonian Monte Carlo converges without warnings.
- Response parameters are not influenced by the fit, however **they still contribute** to uncertainty on m_ν and other parameters.
- Theoretical spectrum **correctly describes** endpoint shape in the last ~ 500 eV given available statistics.
- Correlation between Q and A_{exp} **shifts Q towards higher energies** w.r.t. previous analysis



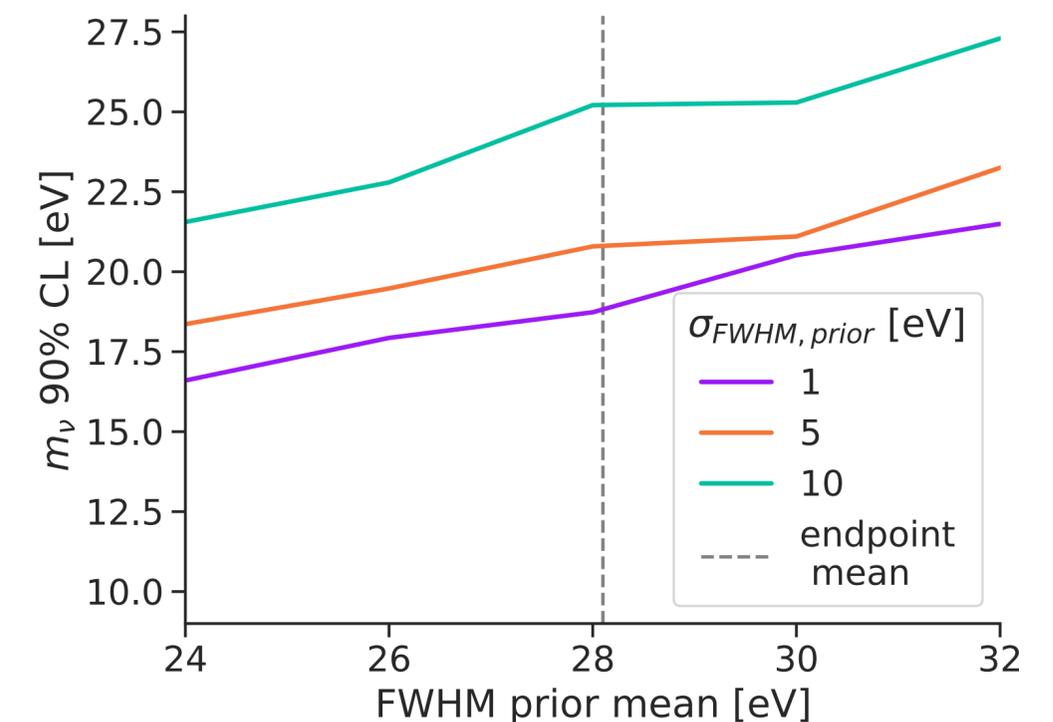
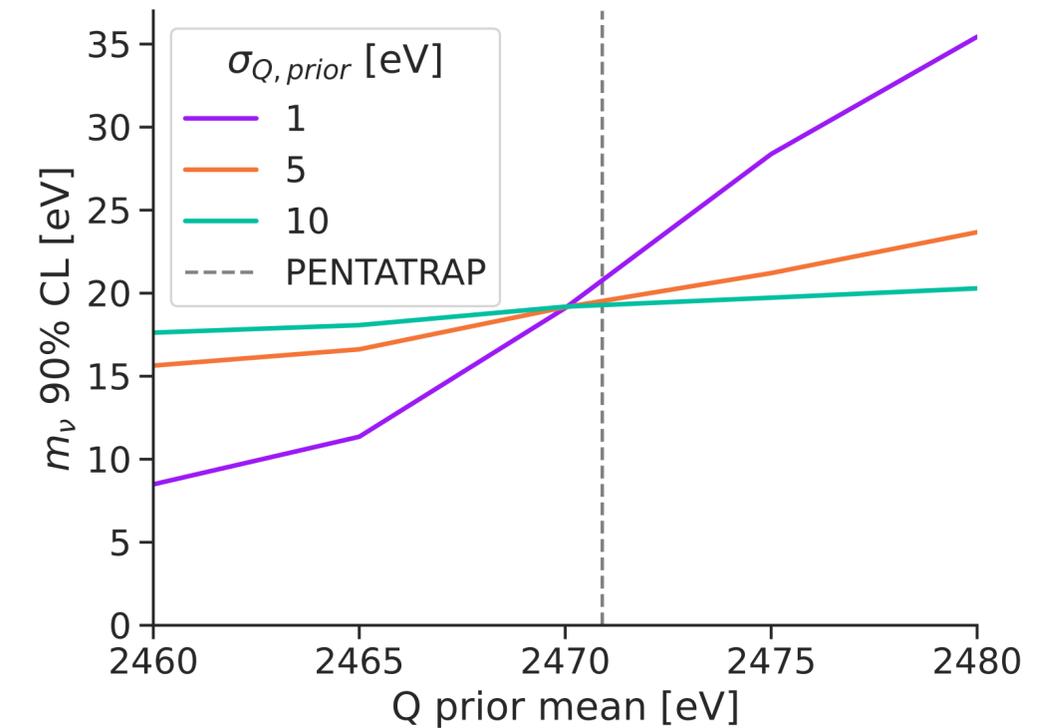
SENSITIVITY TO FIT INTERVAL



- Fit repeated for different lower and upper values of the ROI = $[E_{min}, E_{max}]$
- $E_{min} < 2300$ eV is required to correctly fit all the parameters of the model.
- Starting from $E_{min} = 2200$ eV, the 90% CL on m_ν worsens by 0.7 eV each time E_{min} is lowered by 100 eV.
- “Best fit” result $m_\nu \leq 17.8$ eV at 90% CL for ROI = [2200 eV, 4000 eV].

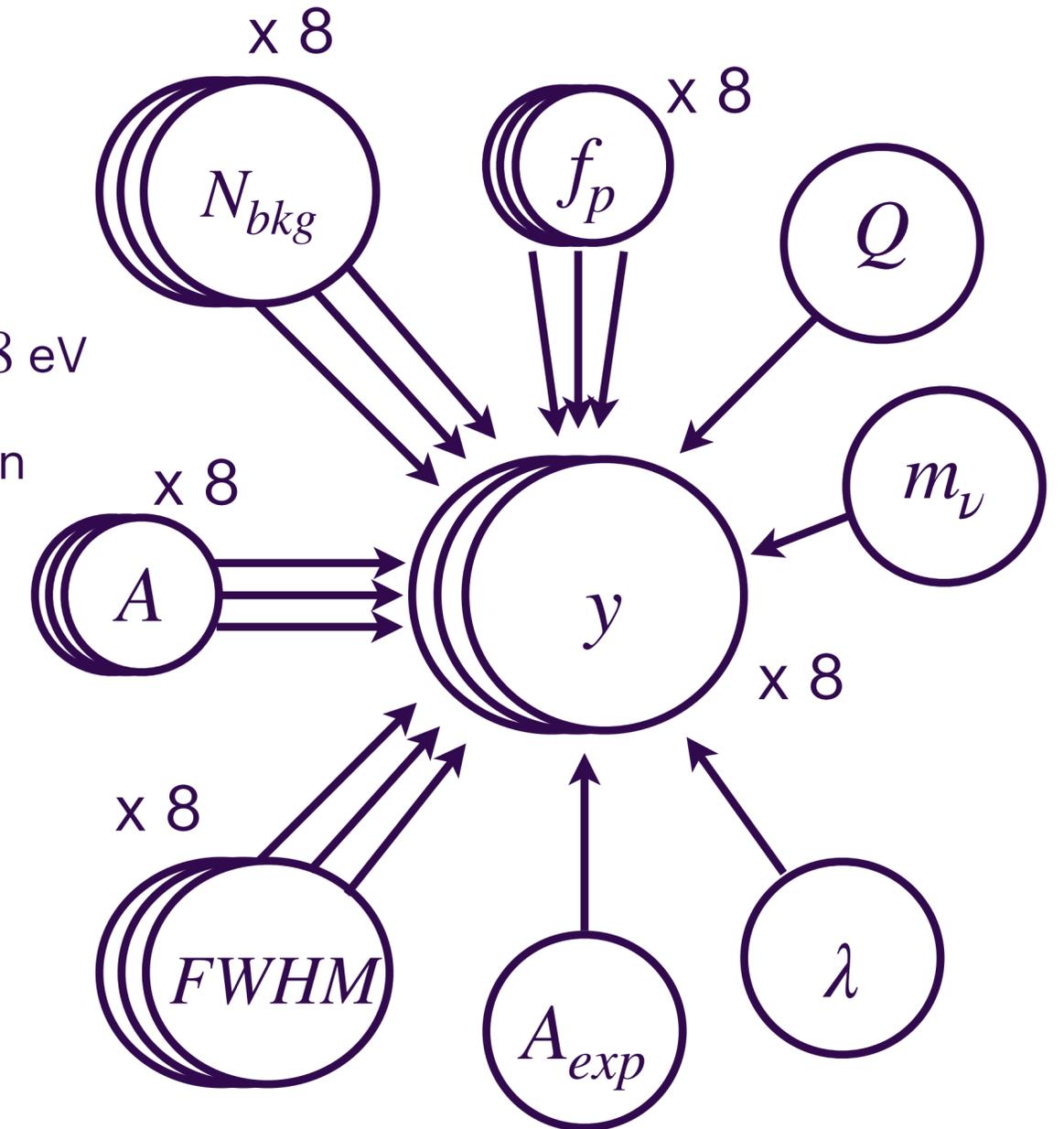
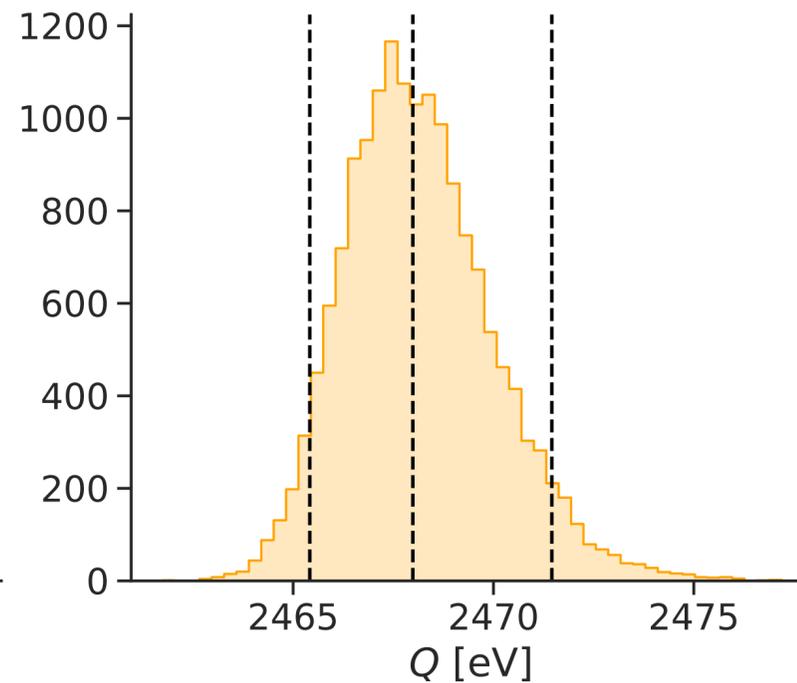
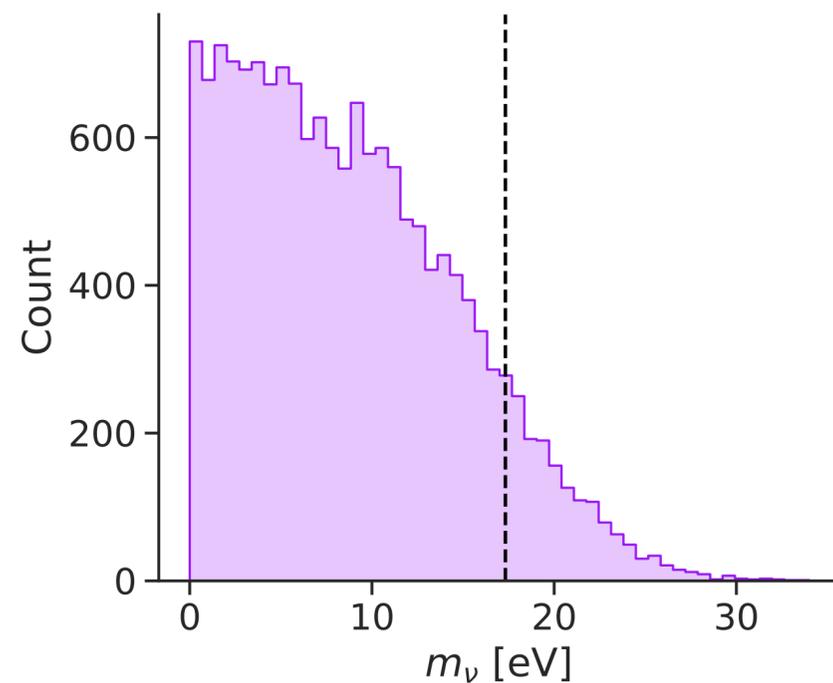
SENSITIVITY TO PRIORS

- The posterior of m_ν is not completely independent from the priors.
- Selecting a very strict prior, for example $Q \sim \text{normal}(2470.9 \text{ eV}, 1.3 \text{ eV})$ might **introduce a strong correlation**.
- In some cases, this dependence can be mitigated by **relaxing the prior**, possibly at the cost of an higher m_ν 90% CL upper limit.
- When not possible, analysis must consider reasonable range of variation in the priors and constrain systematics as much as possible.
- Overall, varying prior values in the expected range induces a $\sim 0.5 \text{ eV}$ variation in the posterior of m_ν .



MULTI-DETECTOR MODEL

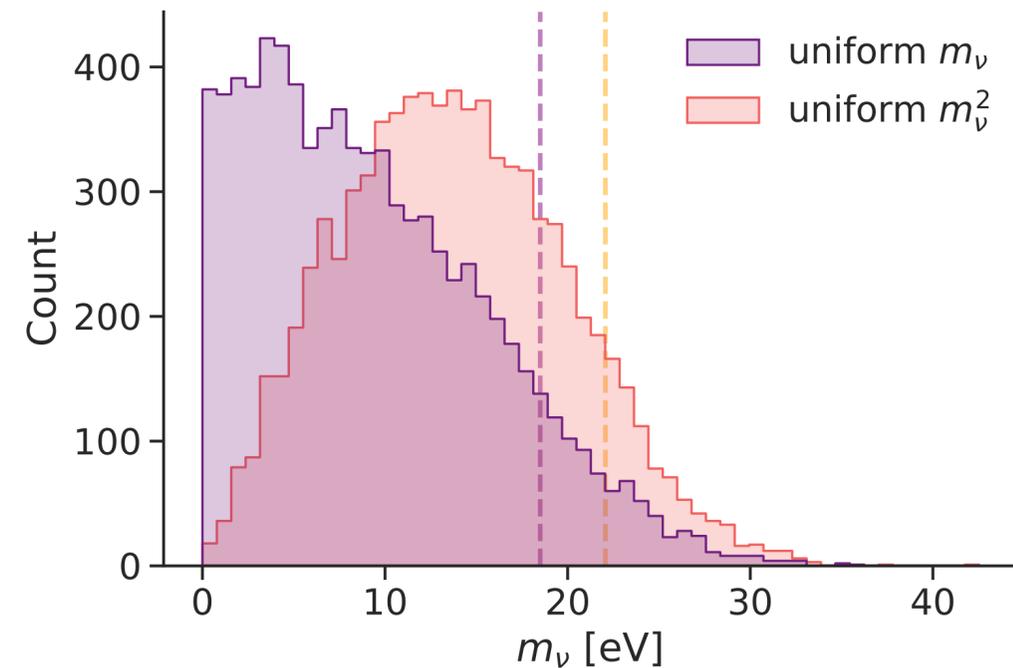
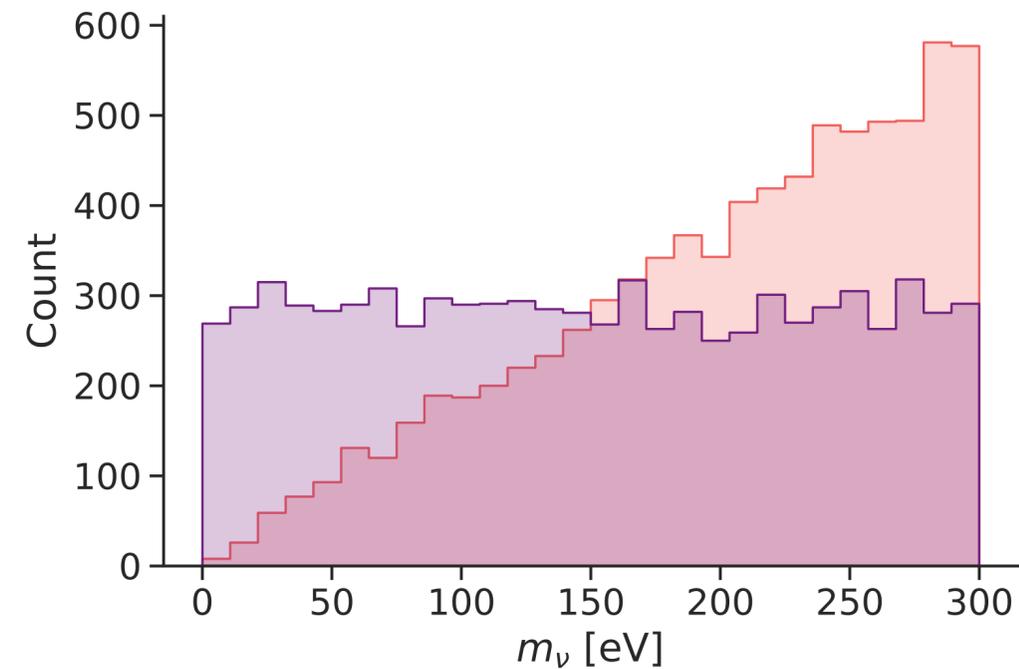
- Fit **separate** spectra of 8 detectors at the same time.
- **Four common parameters**, four detector-specific ones (36 total).
- **More stringent priors on FWHMs**, similar construction for all others.
- Multi detector model finds $m_\nu < 17.3$ eV at 90% CL, $Q = 2468.2 \pm 1.8$ eV
- **Better result w.r.t compound data is not guaranteed**, trade-off between improved description and additional uncertainty introduced by more parameters.



CONCLUSIONS

- Analyzed data from the MIBETA experiment with a Bayesian approach, considering **additional systematics and new theoretical spectrum**.
- In some cases, **relaxing priors improves the robustness** of the model.
- Fitting the detector's data separately provides the more stringent limit $m_\nu < 17.3$ eV at 90% CL. Result is **slightly more conservative** than frequentist approach.
- Updated value of $Q = 2468.2 \pm 1.8$ eV is closer to other independent measurements than previous result.
- Establishing and understanding interaction between parameters of endpoint model is crucial for **future HOLMES analysis**.

NEUTRINO MASS PRIOR



- The theoretical spectrum depends explicitly from m_ν^2 only \rightarrow use it as a parameter.
- Assigning a flat prior to m_ν^2 corresponds to favoring higher values of m_ν .
- 90% posterior CL with flat m_ν^2 prior is consistently 2 eV higher than with flat m_ν .
- In both cases results are independent from cutoff value of prior and interaction with other parameters is similar.

BAYES' THEOREM

- Goal: infer value of parameter θ from data y
- Bayesian statistics: **probability** describes **degree of knowledge**
- **Prior**: initial knowlegde about θ
- **Likelihood**: relation between parameters and data (physical theory)
- **Posterior**: knowledge about θ having observed y
- A **model** is the combination of prior and likelihood

$$p(\theta | y) \propto p(y | \theta) p(\theta)$$

