

# KATRIN neutrino mass analysis

*Arbeitstreffen Kernphysik – Schleching 2023*

Leonard Köllenberger *for the KATRIN collaboration* | Monday 27<sup>th</sup> February 2023



# Outline

1. Neutrino mass determination

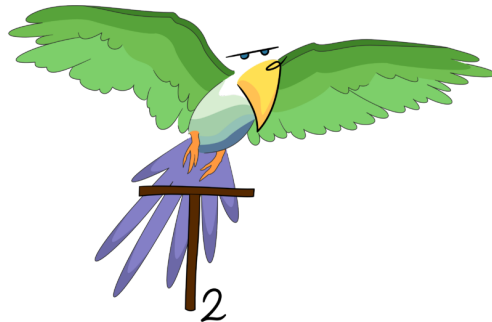
2. The KATRIN experiment

3. Campaigns

4. Spectra fitting

5. Results

6. Outlook

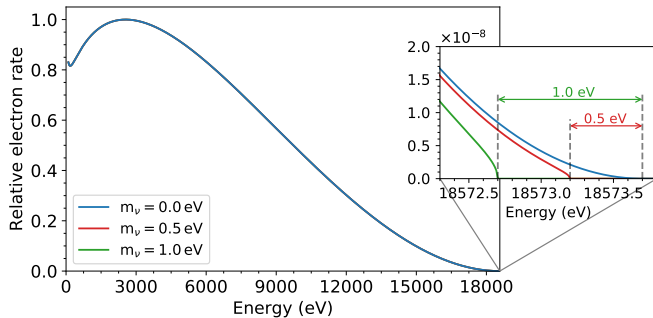
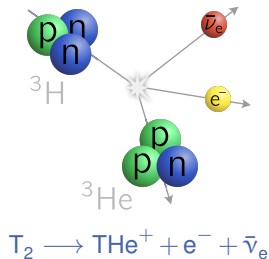


# Tritium $\beta$ -decay

Decay of molecular tritium produces a  $\beta$ -electron spectrum

$$\left(\frac{d\Gamma}{dE}\right)_{\text{nucl.}} = C \cdot F(Z', E) \cdot p(E + m_e) \cdot \sqrt{(E + m_e)^2 - m_e^2} \cdot (E_0 - E) \cdot \sqrt{(E_0 - E)^2 - m_\nu^2}$$

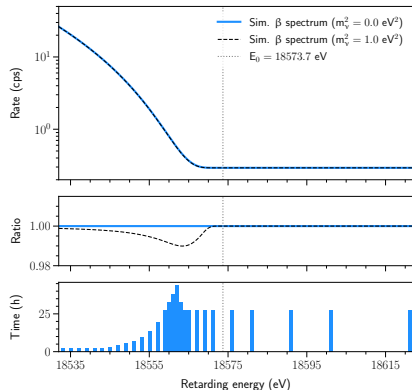
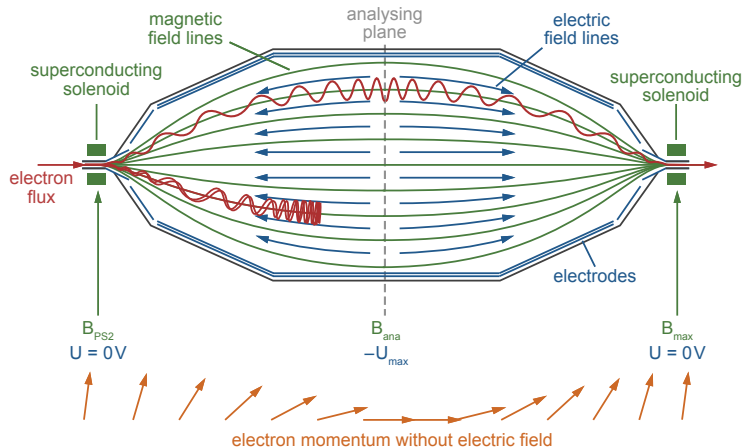
$\Rightarrow m_\nu^2 = \sum_i |U_i|^2 \cdot m_i^2$  can be determined with a precise measurement of the spectral shape near the endpoint



# Integrated spectrum measurement

## Magnetic Adiabatic Collimation combined with an Electrostatic filter (MAC-E filter)

Beamson et al. (1980), Lobashev, Spivak (1985), Picard et al. (1992)



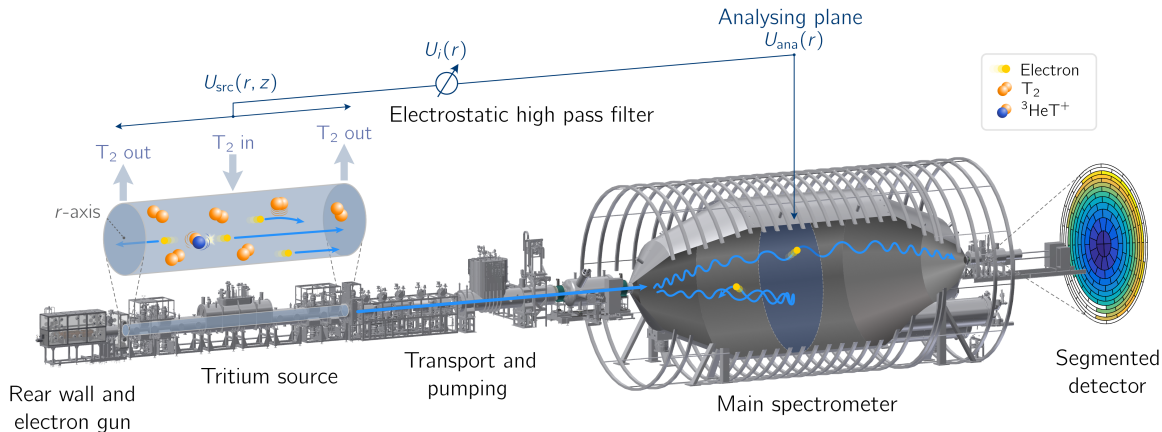
The Measurement Time Distribution (MTD) optimised for best sensitivity

Voltage set points are scanned through to obtain an *integrated spectrum*



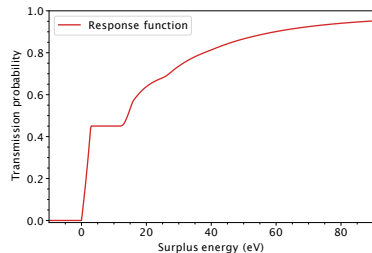
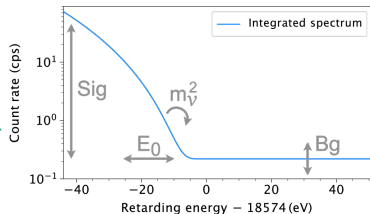
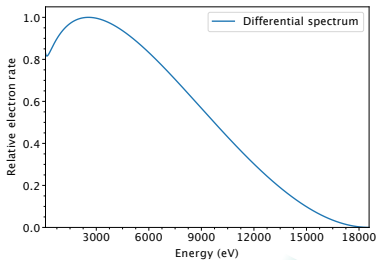
# The KATRIN beamline

**Goal:** Measurement of the effective electron anti-neutrino mass with 0.2 eV sensitivity at 90 % C.L.



# The integrated $\beta$ -spectrum

$$\dot{N}(qU) = \text{Sig} \cdot N_T \cdot \frac{\Omega}{4\pi} \cdot \int_{qU}^{E_0} \frac{d\Gamma}{dE} (E, m_\nu^2, E_0) \cdot R(E, qU) dE + N_{bg}$$



# The integrated $\beta$ -spectrum

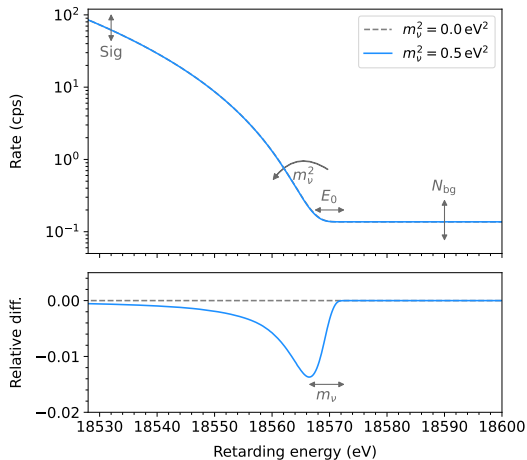
- Integrated  $\beta$ -spectrum

$$\dot{N}(qU) = \text{Sig} \cdot \int_{qU}^{E_0} \frac{d\Gamma}{dE} (E, m_\nu^2, E_0) \cdot R(qU, E) dE + N_{\text{bg}}$$

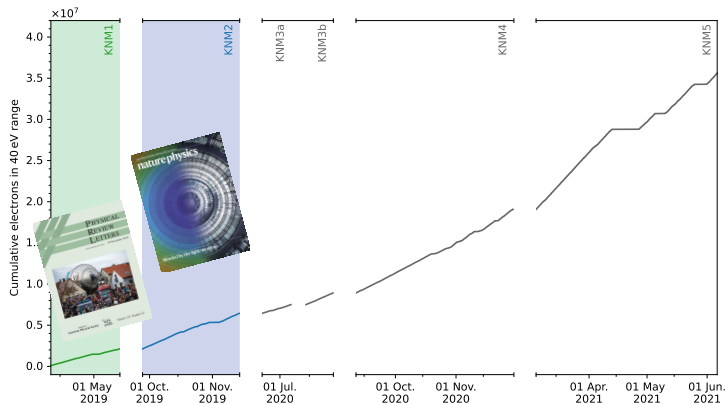
- In the most basic form, the spectrum can be characterised by:

- Spectral amplituder: Sig
- Endpoint:  $E_0$
- Squared neutrino mass:  $m_\nu^2$
- Background:  $N_{\text{bg}}$

⇒ In reality this gets a bit more complicated 😊



# Measurement campaigns

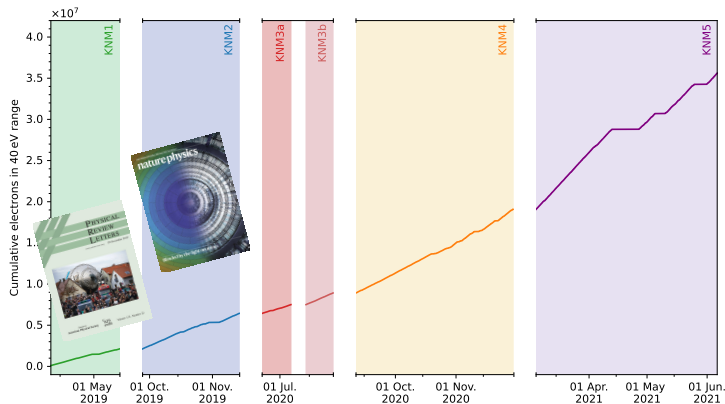


## KATRIN Neutrino mass Measurements

	Time (hrs)	$\rho d\sigma$ ( $\text{m}^{-2}$ )	Bg (mcps)
KNM1	522	$1.09 \times 10^{21}$	370
KNM2	294	$4.23 \times 10^{21}$	278
KNM3a	220	$2.07 \times 10^{21}$	136
KNM3b	224	$3.73 \times 10^{21}$	259
KNM4	1267	$3.79 \times 10^{21}$	150
KNM5	1232	$3.79 \times 10^{21}$	162

- Published results: KNM1 and KNM2  
Phys. Rev. Lett. 123, 221802  
Nat. Phys. 18, 160–166 (2022)
- Current analysis: KNM1 – KNM5
- Data-taking: KNM6, KNM7, KNM8

# Measurement campaigns



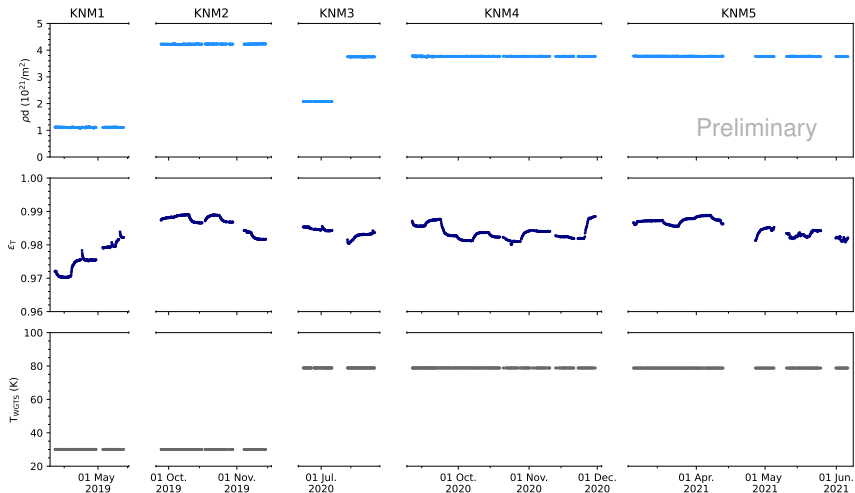
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# Experimental input parameters

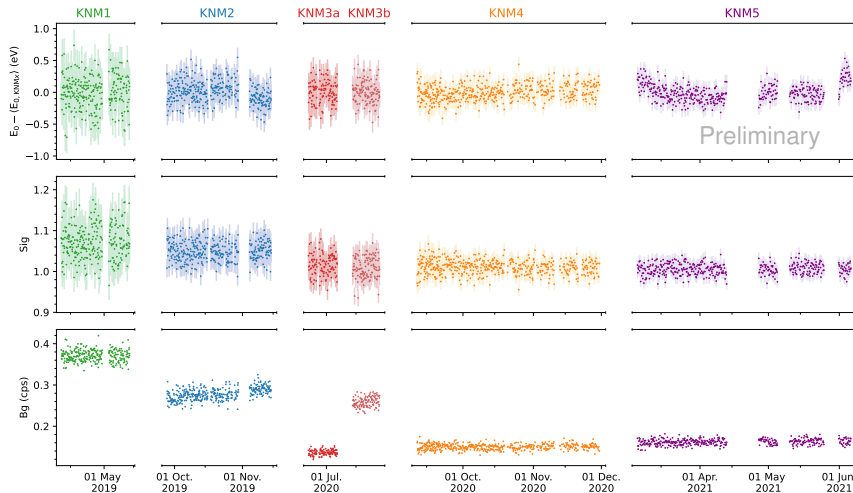
- Column density
  - ⇒ Ramped up to stable value of  $\sim 3.77 \times 10^{21} \text{ m}^{-2}$
- Tritium purity
  - ⇒ Very stable operation at  $>97\%$
- Source temperature
  - ⇒  $\sim 30 \text{ K} \rightarrow \sim 80 \text{ K}$  with improved gas circulation mode



# Run-wise fit parameters

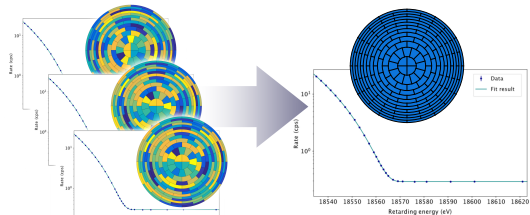
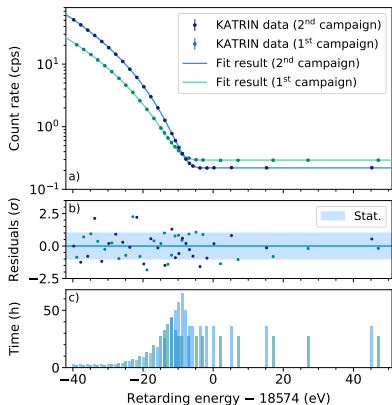
- Experimental settings have been optimised
  - ⇒ Background significantly reduced
- Between KNM1 – KNM5 1987 individual runs were recorded for each pixel
  - ⇒ 244 647 individual spectra taken into account in the analysis

⇒ How do we combine the data?



# Run combination

- Runs taken under similar conditions can be stacked into one spectrum
- Counts are summed, input parameters are averaged



Fit is performed with  $i$  contributing spectra of each campaign

⇒ One minimisation

⇒ One combined likelihood,  $\mathcal{L}$

$$-\log \mathcal{L} = \sum_i -\log \mathcal{L}_i \left( m_\nu^2, E_{0i}, \text{Sig}_i, \text{Bg}_i \right)$$

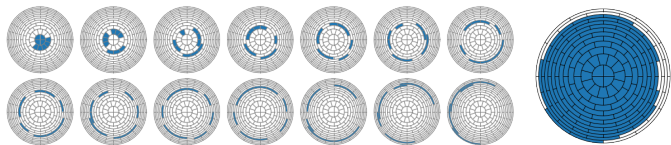
– One common neutrino mass,  $m_\nu^2$

– Multiple campaignwise  $E_0$ ,  $\text{Sig}$ , and  $\text{Bg}$

⇒ Principle was used in combined KNM1 – KNM2 analysis (multi-period analysis)



# Pixel combination



Fit is performed with  $i$  contributing spectra of each segment

⇒ One minimisation

⇒ One combined likelihood,  $\mathcal{L}$

$$-\log \mathcal{L} = \sum_i -\log \mathcal{L}_i \left( m_{\nu}^2, E_{0i}, \text{Sig}_i, Bg_i \right)$$

– One common neutrino mass,  $m_{\nu}^2$

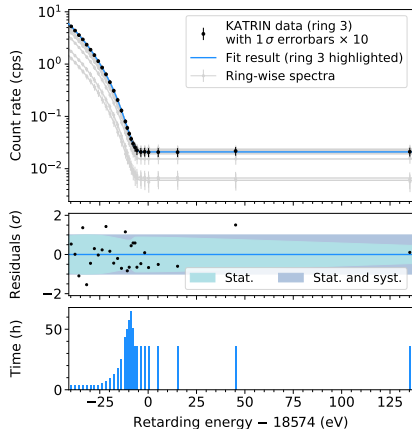
– Multiple detector segmentwise  $E_0$ ,  $\text{Sig}$ , and  $Bg$

⇒ Principle was used in KNM2 analysis (multi-ring analysis)

Detector segments with similar transmission conditions are grouped

⇒ Uniform (NAP setting)

⇒ Multi-patch (SAP setting)



# Unbiased analysis

Analysis is performed in parallel by different fitting teams, using independent code

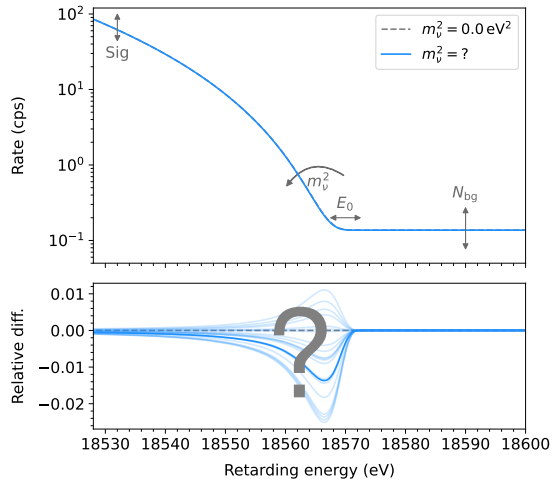
Model blinding:

- Additional broadening is applied to the model (FSD)  
 $\rightarrow \Delta m_\nu^2 = -2\sigma^2$
- Neutrino mass is shifted into an unknown direction
- Other fit parameters are unaffected

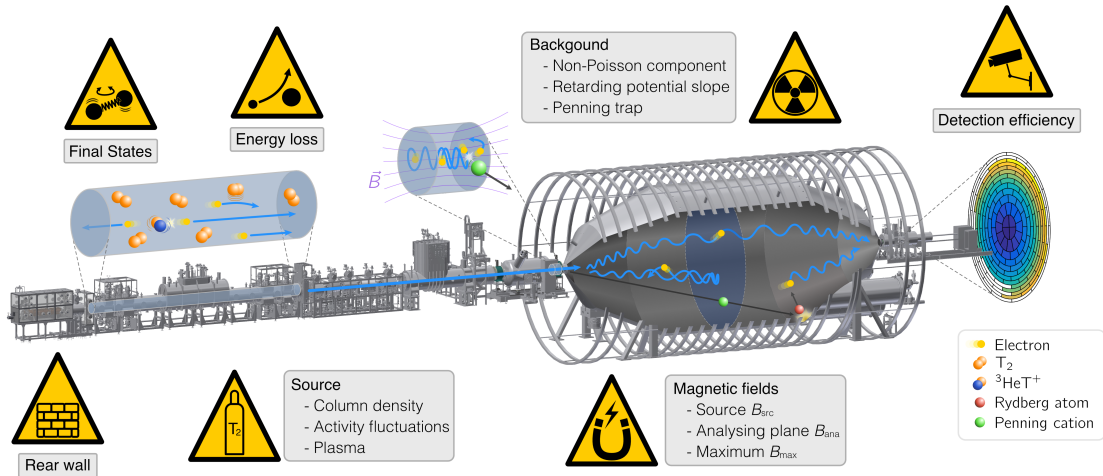
Three stage unblinding procedure

- 1.) Code validation on Asimov spectra
- 2.) Blinded analysis of data
- 3.) Final unblinded analysis of data

⇒ Unbiased neutrino mass result



# Sources of systematic uncertainties



# Treatment of systematics

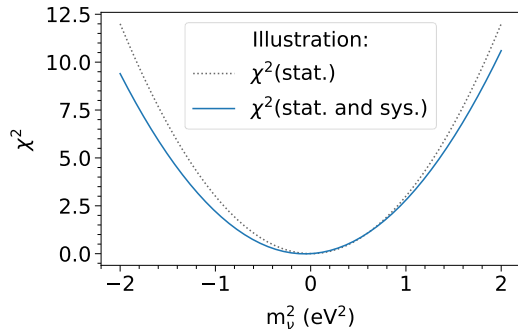
In the KNM1 and KNM2 analyses, systematics have been propagated via:

- ⇒ Pull term
- ⇒ Covariance matrix
- ⇒ Monte Carlo propagation
- ⇒ Markov Chain Monte Carlo (MCMC)

Future approach – pull term:

- Adding additional free parameters ( $\theta_i$ )
- Constraining parameters with a penalty term
- ⇒ Adding pull terms widenes the  $\chi^2$  distribution:

$$\chi^2 \left( m_\nu^2, E_0, \text{Sig}, \text{Bg}, \theta_1, \dots \right) + \frac{(\theta_1 - \hat{\theta}_1)^2}{\sigma_{\theta_1}^2} + \dots$$



In the combined KNM1-5 analysis:

- Pull term as multivariate normal distribution
- Treatment of correlations between campaigns and segments
- ⇒  $\sim 280$  fit parameter and  $\sim 100$  correlations

# Latest KATRIN neutrino mass results – KNM1

## First measurement campaign

Fit strategy: Stacked uniform fit

⇒ One spectrum with 27 data points

⇒ Four free fit parameters ( $m_\nu^2$ ,  $E_0$ , Sig, Bg)

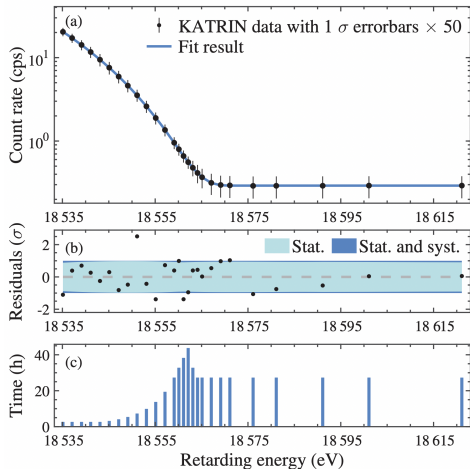
Statistics dominated fit result

$$m_\nu^2 = -1.0 \pm 1.0 \text{ eV}^2$$

Factor of  $\sim 2$  improvement on previous  $m_\nu$  limit

$$m_\nu < 1.1 \text{ eV (90\% CL)}$$

Phys. Rev. Lett. **123** (2019) 221802



# Latest KATRIN neutrino mass results – KNM2

## Second measurement campaign

Fit strategy: Stacked multi-ring fit

⇒ 12 spectra with  $12 \times 28 = 336$  data points

⇒ 37 free fit parameters ( $m_\nu^2$ ,  $12 \cdot E_0$ ,  $12 \cdot \text{Sig}$ ,  $12 \cdot \text{Bg}$ )

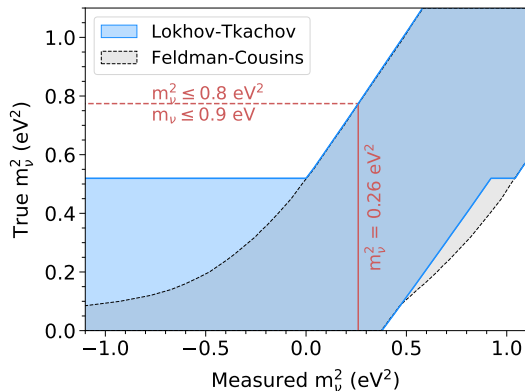
Statistics dominated fit result

$$m_\nu^2 = 0.26 \pm 0.34 \text{ eV}^2$$

New sub-eV neutrino mass limit

$$m_\nu < 0.9 \text{ eV (90 \% CL)}$$

Nat. Phys. **18**, 160–166 (2022)



# Latest KATRIN neutrino mass results – combined results

Fit strategy: Multi-period uniform fit

- ⇒ Data is stacked *within* the measurement phases
- ⇒ Two spectra with 27+28 = 55 data points
- ⇒ 7 free fit parameters ( $m_\nu^2$ ,  $2 \cdot E_0$ ,  $2 \cdot \text{Sig}$ ,  $2 \cdot \text{Bg}$ )

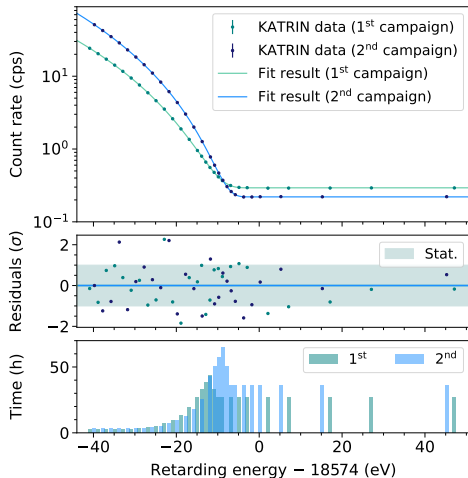
Statistics dominated fit result

$$m_\nu^2 = 0.08 \pm 0.32 \text{ eV}^2$$

Sub-eV upper limit on the neutrino mass

$$m_\nu < 0.8 \text{ eV (90 \% CL)}$$

Nat. Phys. **18**, 160–166 (2022)



# Summary

Leading upper limit on the neutrino mass from direct single  $\beta$ -decay measurements

⇒ KATRIN combined analysis of KNM1 and KNM2 measurement campaigns

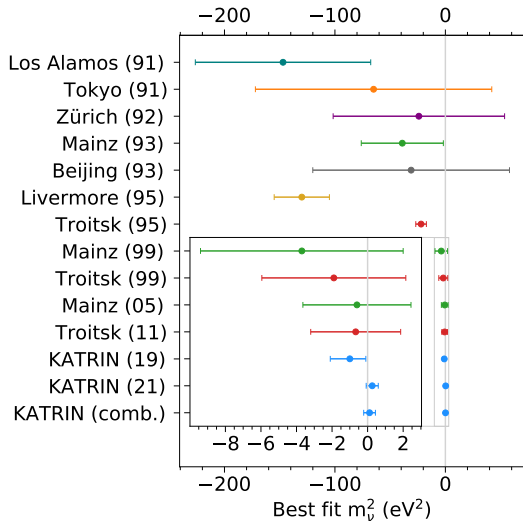
$$m_\nu < 0.8 \text{ eV (90 \% CL)}$$

Nat. Phys. **18**, 160–166 (2022)

Towards improved sensitivity

⇒ KATRIN combined analysis of KNM1 to KNM5 measurement campaigns is ongoing

⇒ Expected sensitivity  $< 0.5 \text{ eV}$





# Future challenges and outlook

- KATRIN combined analysis of KNM1 – KNM5 in progress
- Mixed multi-period, multi-patch analysis
  - ⇒ Combined fit of 45 spectra with one shared  $m_\nu^2$
- Treatment of systematics via pull terms
  - ⇒ Fit with  $\sim 280$  fit parameters
- Combined fit is computationally challenging
- Currently two complementing approaches are pursued to improve computation time:
  - Model calculation through neural nets  
(arXiv:2201.04523)
  - Improved computation performance

