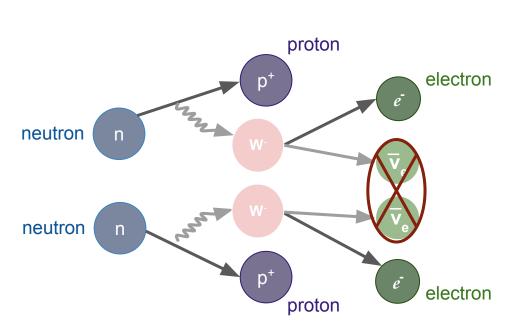


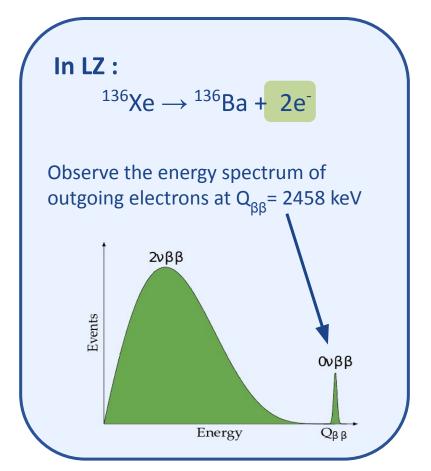


Towards a **0vββ** decay search in the LUX-ZEPLIN (LZ) experiment: mitigating gamma-ray backgrounds



Neutrinoless Double Beta Decay (ονββ)





Neutrinoless Double Beta Decay (ονββ)

A measurement of the $0V\beta\beta$ decay rate would:

- Demonstrate that neutrinos are their own antiparticle
- Evidence of lepton number violation, a possible explanation for the matter-antimatter asymmetry in the universe
- Improve our understanding of the neutrino mass generation mechanism
- Inform about the neutrino mass hierarchy problem

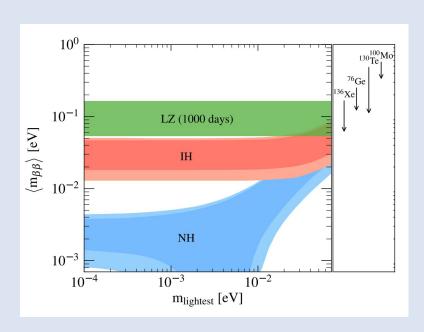


Figure taken from [1]

Dark Matter Detectors for 0vββ Decay

Current dark matter detectors are well suited to demonstrate the potential of next-generation experiments with natural xenon, such as XLZD.

The LUX-ZEPLIN (LZ) Experiment:

World-leading dark matter search with a projected sensitivity to $0v\beta\beta$ of $T_{1/2} = 1.06 \times 10^{26} \, \text{yrs}$ (90% CL), 1000 live days^[1]

- Main detector is a 7-tonne (active)
 liquid xenon time projection chamber
 → contains ¹³6Xe isotope at nat. ab. (8.86%, ~500kg)
- **2. Designed for rare-event searches** so excellent at minimizing and identifying backgrounds.
- 3. Has excellent energy resolution $(σ = 0.64\% \text{ at } Q_{BB} = 2458 \text{ keV})$



Located 1 mile underground at the Sanford Underground Research Facility in Lead, South Dakota.

Detection Principle

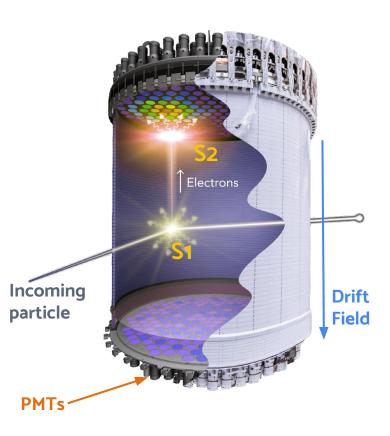
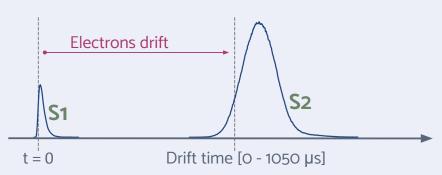
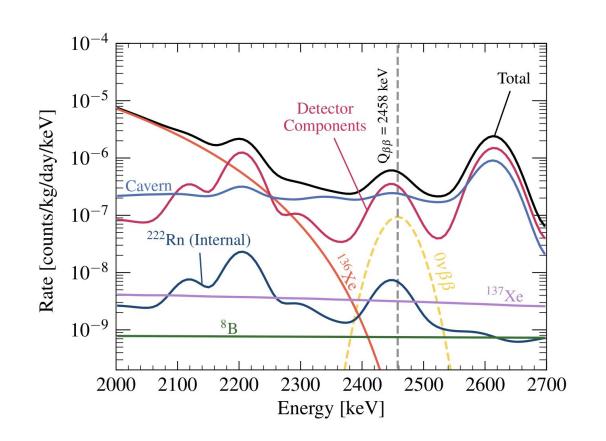


Illustration of TPC Signal



- → Energy of the interaction is proportional to the size of S1 and S2
- → Location reconstruction:
 - Drift time → depth
 - PMT pattern → horizontal position

Projected Background Spectrum in LZ



Signal:

 $Xe-136 OV\beta\beta Decay$

Assumed $T_{1/2} = 1.06 \times 10^{26} \text{ y}$

Backgrounds:

Detector Components: ⁶⁰Co, ²³⁸U-late, ²³²Th-late

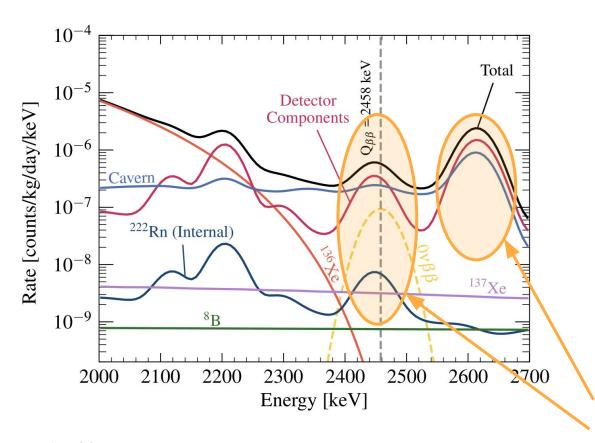
Cavern: ²³⁸U, ²³²Th

Internal ²²²Rn (in LXe)

¹³⁷Xe (in LXe)

⁸B (solar neutrinos)

Projected Background Spectrum in LZ



Signal:

Xe-136 Ovββ Decay

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Internal ²²²Rn (in LXe)

¹³⁷Xe (in LXe)

⁸B (solar neutrinos)

²⁰⁸ TI gamma-rays (BR 99.79%)

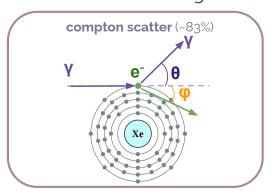
²¹⁴ Bi gamma-rays (BR 1.55%)

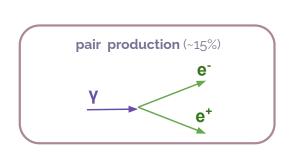
How Does a ~2 MeV Photon Interact in LXe?

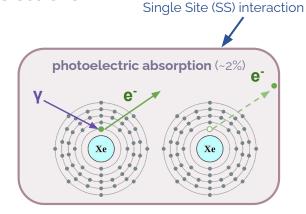
Photon interactions produce a fast electron which deposits its energy in LXe via:

1. Continuous energy loss ($dE/d\bar{x}$) due to collisions with atomic electrons

2. Bremsstrahlung radiation

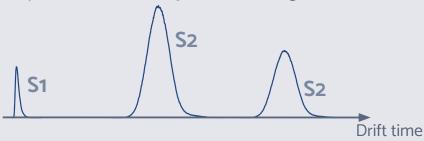






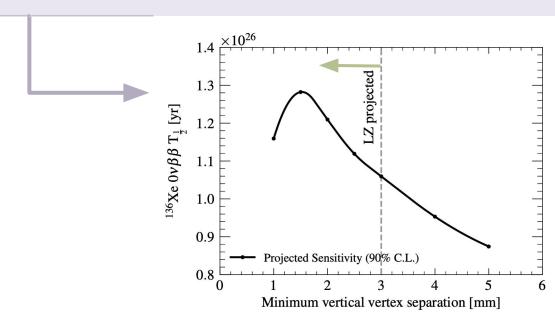
In general, a photon interacts multiple times in LXe before depositing all of its energy.

→ This leads to multiple scatter or multiple site (MS) signals in LZ that have one S1 and multiple S2s

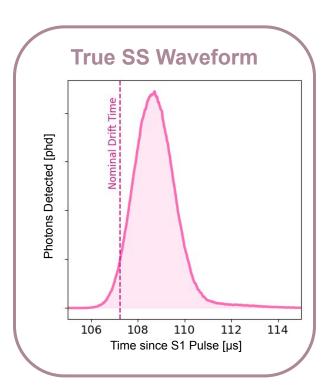


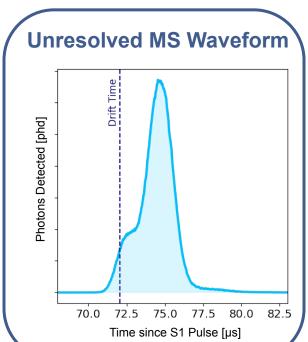
Background gamma-rays \rightarrow mostly **multi-site interaction (MS)** $0v\beta\beta$ decay \rightarrow mostly **single-site interaction (SS)**

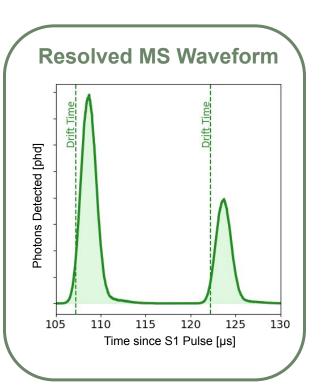
If we **efficiently remove MS** in the data, we can improve our sensitivity!



Unresolved MS S2s are an inefficiency in the categorisation of SS and MS



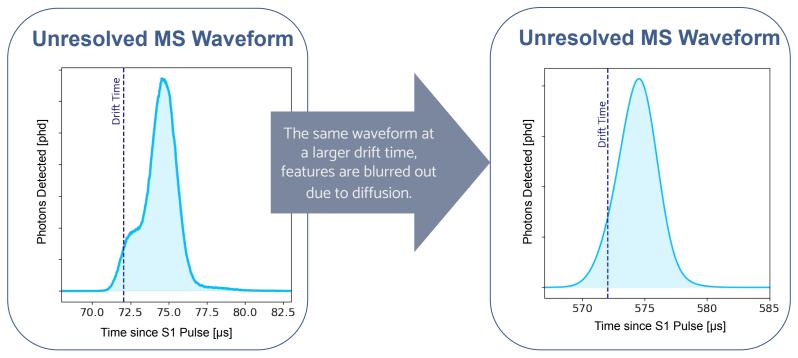




^{*}These are toy-waveforms, for illustrative purposes.

Unresolved MS S2s are an inefficiency in the categorisation of SS and MS

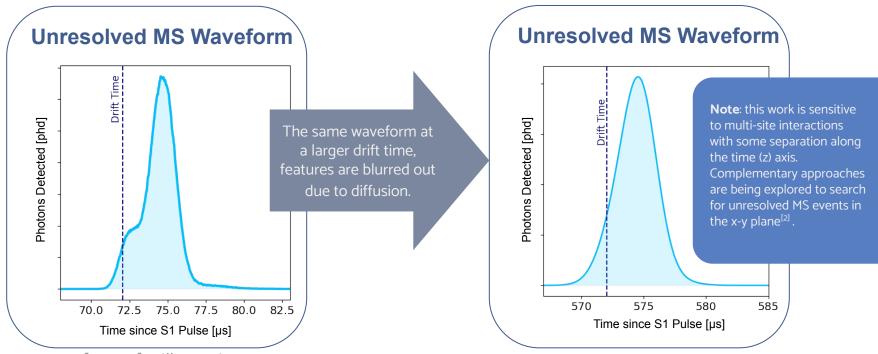
My goal: to develop a waveform-based analysis to identify the unresolved MS



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Unresolved MS S2s are an inefficiency in the categorisation of SS and MS

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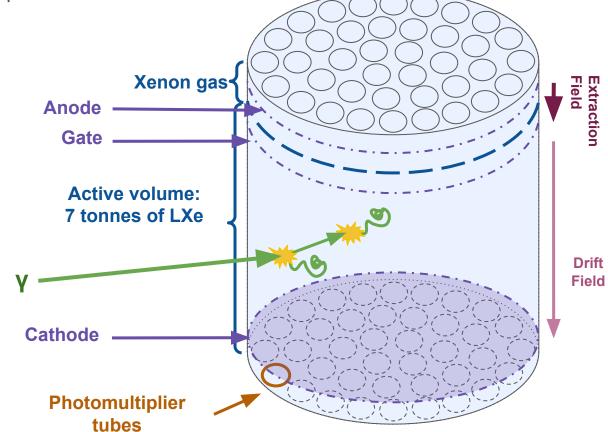
Overview of the analysis method

- 1. Build a forward model for S2 generation
- 2. Develop a deconvolution algorithm to remove detector effects from waveforms and recover underlying features
- 3. Preliminary results of the algorithm on simulated events

Decompose the waveform into 3 parts

An extended track:

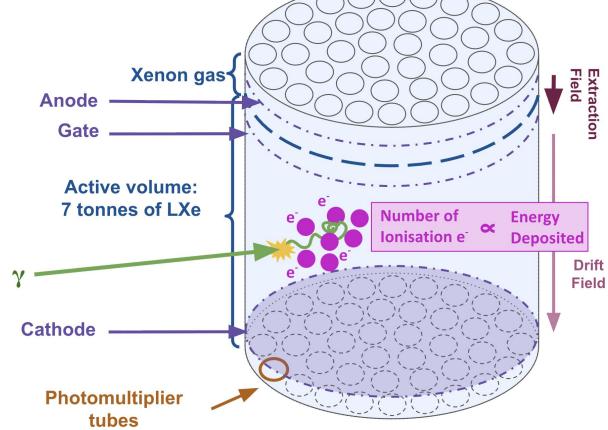
- γ-ray interaction in liquid xenon (LXe) produces a fast electron.
- → The electron deposits its energy continually along its track, producing a cloud of ionisation electrons



Decompose the waveform into 3 parts

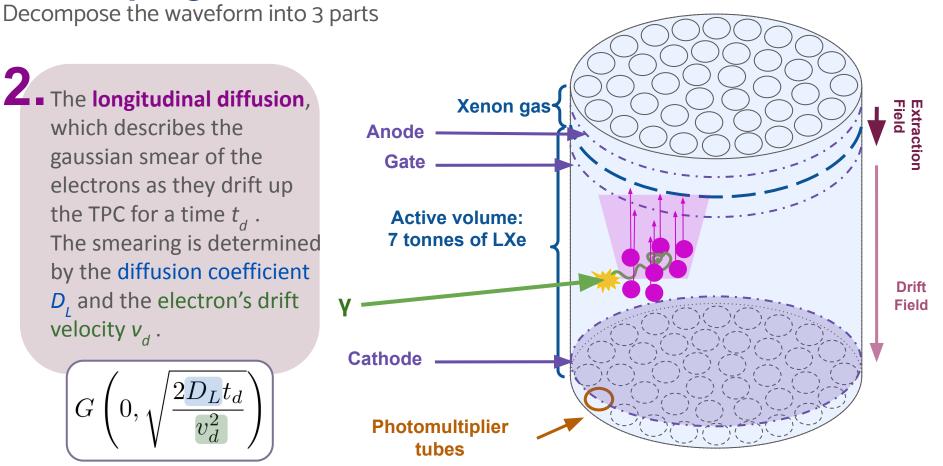
An extended track:

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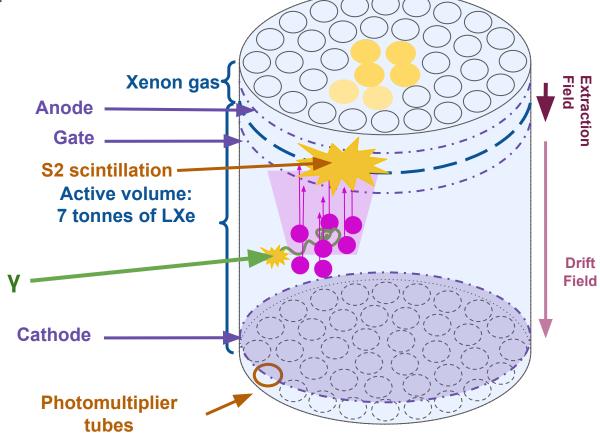
2 The longitudinal diffusion, which describes the gaussian smear of the electrons as they drift up the TPC for a time t_d . The smearing is determined by the diffusion coefficient D, and the electron's drift velocity v_d .

$$G\left(0,\sqrt{\frac{2D_Lt_d}{v_d^2}}\right)$$



Decompose the waveform into 3 parts

The Impulse Response Function (IRF) of the extraction region, which describes how the ionisation signal (electrons) is transduced to detected VUV light.



Measuring each element of the S2 model : v_d , D_I , IRF

Extended track (dE/dz)



Longitudinal diffusion gaussian



Impulse Response Function



S2

To make the measurements, select alpha decays from Rn-222 and Po-218:

- 1. Nearly "point-like" interactions: to ensure that the drift time is precise and that the widening of S2 pulses is only due to diffusion and not track length.
- 2. Reasonable-size S2 to have smooth pulses but no saturation.
- 3. Population on the gate and cathode grids: to obtain drift velocity
- 4. Evenly spread population within the bulk of the TPC

Measuring each element of the S2 model : v_d , D_L , IRF

Extended track (dE/dz)



Longitudinal diffusion gaussian



Impulse Response Function



S2

To make the measurements, select alpha decays from Rn-222 and Po-218:

1. Nearly "point-like" interactions: to ensure that the drift time is precise and that the widening of S2 pulses is only due to diffusion and not track length.

Approximated by a δ -function so it does not need to be modelled in this case.

DEVELOPING AN S2 MODEL

Measuring each element of the S2 model: v_d , D_l , IRF

Extended track (dE/dz)



Longitudinal diffusion gaussian



Impulse Response Function



S2

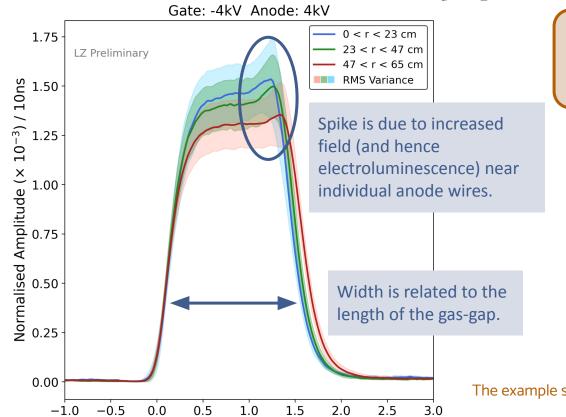
Data-driven template of S2s from alpha decays very close to the gate grid.

oint source

Point-source, S2 width is not due of the size of the continuous track

Minimal effect of diffusion on the S2 to obtain the true IRF of an non-diffused localised electron cloud.

Measuring each element of the S2 model : v_d , D_I , IRF



Time [μ s]

Impulse Response Function

= S2

The example shown is for WS-2022 field conditions.

Measuring each element of the S2 model: v_d, D_I, IRF

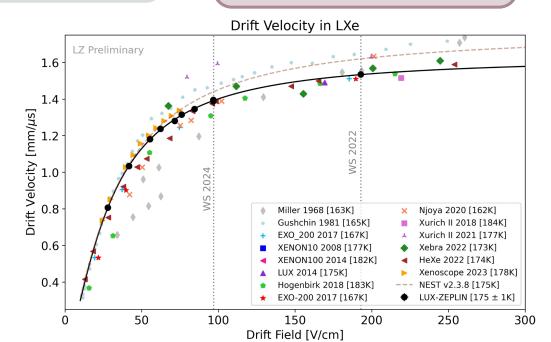
Extended track (dE/dz)

Longitudinal diffusion gaussian

$$G\left(0,\sqrt{\frac{2D_L t_d}{v_d^2}}\right)$$

Impulse Response Function





Measured using **alpha decays** on the **gate** and **cathode** grids to determine the amount of time it takes to drift electrons a known drift distance (d = 145.6 cm).

Measuring each element of the S2 model: v_d, D₁, IRF

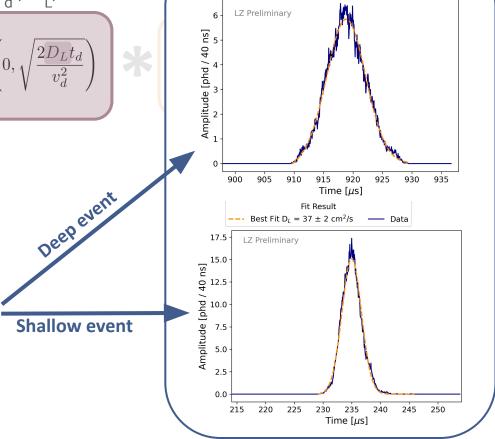
Longitudinal qaussian

diffusion
$$G\left(0,\sqrt{\frac{2D_Lt_d}{v_d^2}}\right)$$

Fit an S2 model for a point source:

$$S2 = G\left(0, \sqrt{\frac{2D_L t_d}{v_d^2}}\right) \star IRF$$

to S2 waveforms from alpha decays in the **bulk of the TPC** to find best-fit value of D for each waveform.



Fit Result

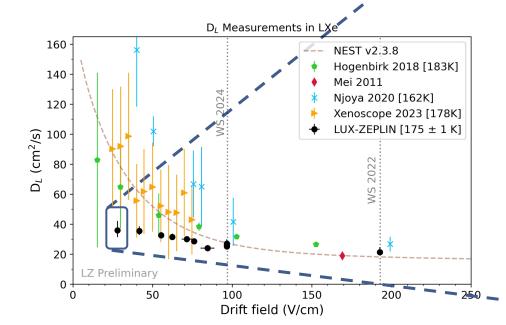
Best Fit D_I = $37 \pm 2 \text{ cm}^2/\text{s}$

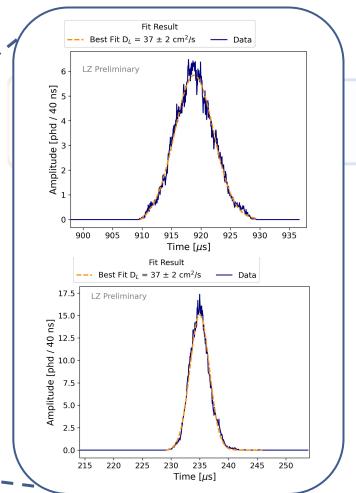
Measuring each element of the S2 model: v_d, D_L, IRF

Extended track (dE/dz)

Longitudinal diffusion gaussian

$$G\left(0,\sqrt{\frac{2D_L t_d}{v_d^2}}\right)$$





There is now a fully characterised forward model for any S2 in the LZ TPC

Extended track (dE/dz)



Longitudinal diffusion gaussian



Impulse Response Function

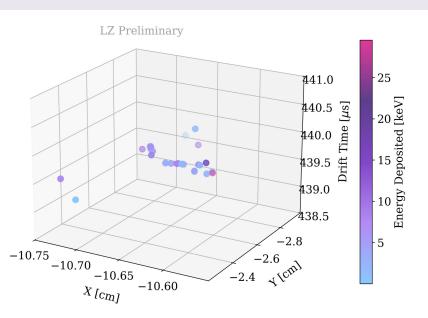


S2

Use the forward model to simulate ²⁰⁸TI S2 pulses and compare to data in LZ.

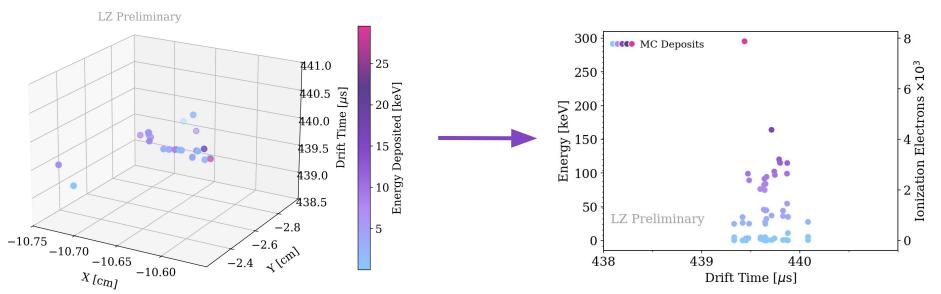
Simulation steps:

1. Electron tracks are obtained using GEANT4-based (*G4EmLivermore* physics list) simulations of ²⁰⁸Tl gammas in the LZ TPC, and projected along the drift-time axis.



Use the forward model to simulate ²⁰⁸TI S2 pulses and compare to data in LZ.

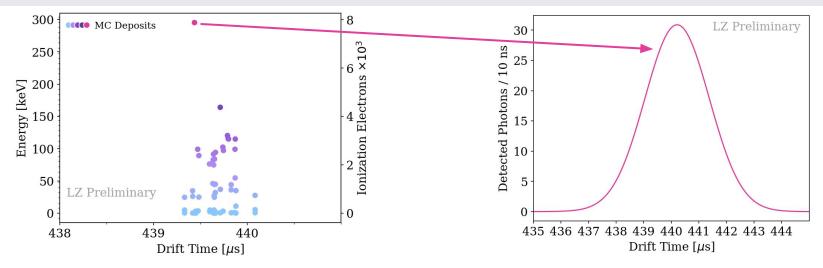
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[3] Mock, J. et al. Modeling pulse characteristics in Xenon with NEST. Journal of Instrumentation 9, T04002 (2014)

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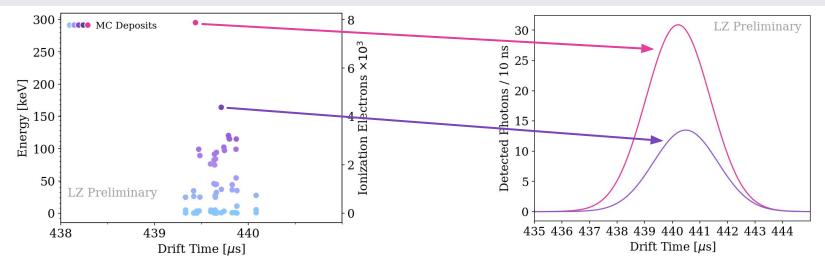
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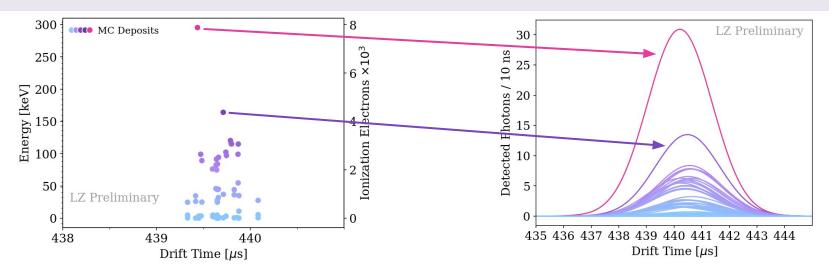
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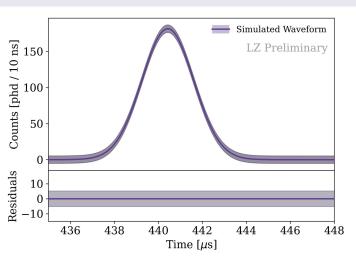
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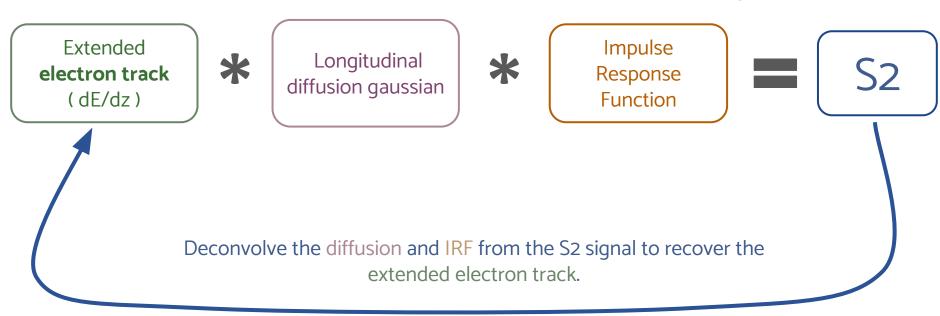
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- 2. NEST^[3] is used to calculate the charge-yield at each deposit, and thus scale the waveforms.
- 3. For each individual deposit, a point-waveform (IRF * G_{diffusion}) is generated. All these waveforms are then added to produce realistic S2 simulations of extended tracks.



There is now a general S2 model for any event in the TPC.

It can be used to recover more detailed information about S2 waveforms to classify events as **MS-like** or **SS-like**, to remove unresolved MS waveforms from the dataset.

To recover a proxy for the continuous extended **electron track** from a ~2 MeV gamma interaction

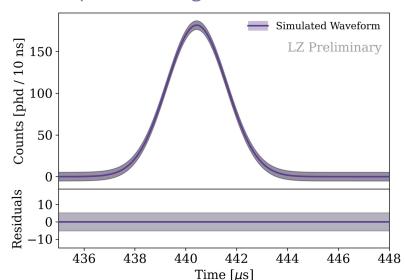


Use **Stochastic Variational Inference** to perform this deconvolution.

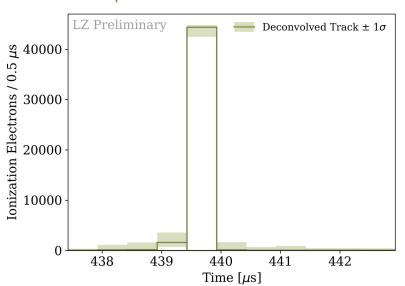
- 1. Reconstruct a <u>binned proxy</u> of the continuous extended track from the S2 waveform.
- 2. Model the number of electrons in each bin as a normal distribution.
 - \circ The algorithm optimises the μ and σ of these distributions.
- 3. At each step, compare the S2 waveform generated from the estimated binned track to the measured data using a χ^2 metric.

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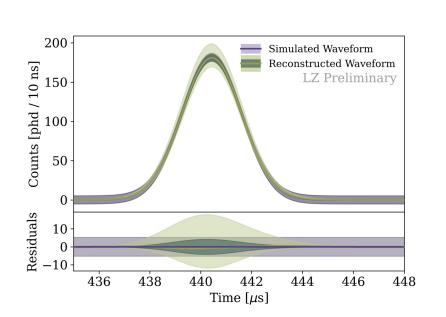
Input into algorithm



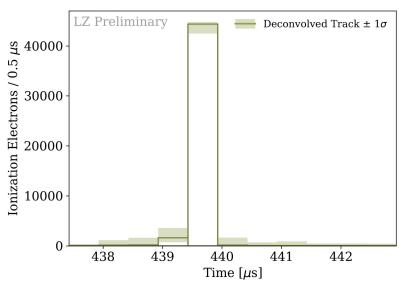
Output: reconstructed track



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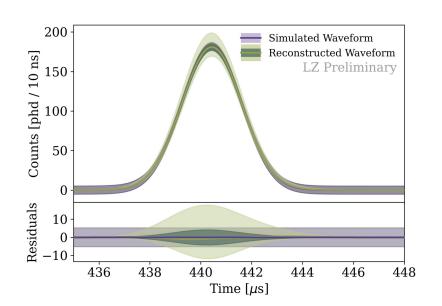


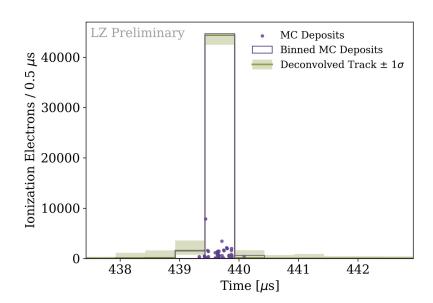
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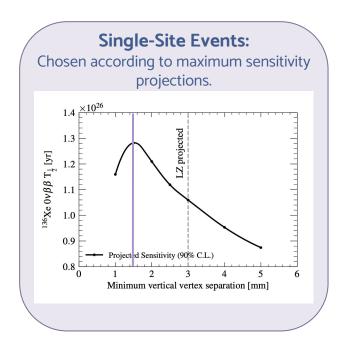


Deconvolving S2

- 1. Reconstruct a <u>binned proxy</u> of the continuous extended track from the S2 waveform.
- 2. **Model the number of electrons** in each bin as a Normal distribution.
 - \circ The algorithm optimises the μ and σ of these distributions.
- 3. At each step, compare the S2 waveform generated from the estimated binned track to the measured data using a χ^2 metric. This would be a <u>Single Site-like</u> interaction.

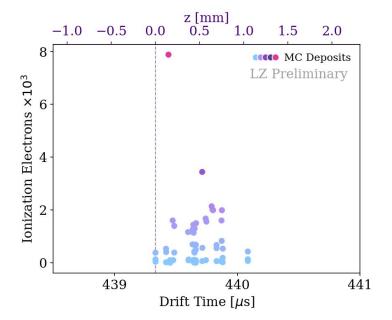






I classify simulated decays based on the MC deposits as:

→ **Single Site-like Interaction**: no consecutive energy deposits along the drift direction are separated by more than 1.5 mm.

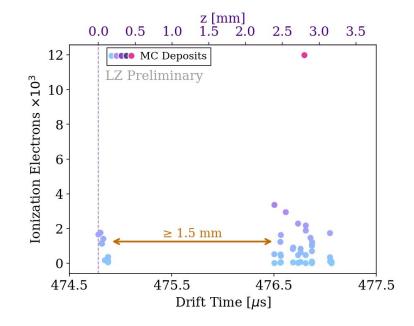


Single-Site Events: Chosen according to maximum sensitivity projections. 1.3 [136 Xe $0\nu\beta\beta$ T $_{\frac{1}{2}}$ [yr] 1.0 ⊢ 0.9 Project d Sensitivity (90% C.L.) Minimum vertical vertex separation [mm]

I classify simulated decays based on the MC deposits as:

→ Multi Site-like Interactions: has consecutive energy deposits along the drift direction separated by more than 1.5 mm.

These are the unresolved MS events



Generate ²⁰⁸Tl gammas simulations.

• Simulated events are selected to match the LZ nominal 3 mm vertex separation threshold (no events with gaps in the drift time distribution of deposits > 3 mm).



Get the truth:

Classify events as SS-like or MS-like based on the MC deposits directly.



Get the deconvolution output:

- 1. Generate S2 waveforms with the forward model.
- 2. Apply the deconvolution algorithm on the simulated waveforms.
- 3. Classify events as SS-like or MS-like based on the reconstructed tracks.

Comparing the result of the **deconvolution** to the **truth**

- Of the true SS-like events:
 - o 91.5 % are correctly classified
 - 8.5% are <u>incorrectly</u> classified

- Of the true MS-like events:
 - 77.4% are <u>correctly</u> classified
 - o 22.6% are incorrectly classified

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 - o 22.6% are <u>incorrectly</u> classified

background-like (unresolved MS) events can be identified and removed from final dataset by this method.

Conclusion

Goal: Reduce gamma-ray backgrounds in the $OV\beta\beta$ ROI by exploiting differences between a background-like and a signal-like S2

The main limitation in our discrimination power comes from **detector effects that smear S2s** leading to a loss of information in the waveform.

- Developed a detailed S2 model to better understand the shape of S2 waveforms in the LZ TPC.
- → The S2 model is then used to deconvolve detector effects from the S2 to obtain the underlying track, projected along the z-axis.
- → Preliminary studies demonstrate that the deconvolution algorithm can faithfully classify simulated events

Looking Forwards:

Investigate different methods of classifying signal/background events, in particular **machine** learning techniques.

LUX-ZEPLIN (LZ) Collaboration

@lzdarkmatter https://lz.lbl.gov/

38 Institutions, 250 scientists, engineers, and technical staff

















Thanks to our sponsors and participating institutions!

- **Black Hills State University**
- **Brookhaven National Laboratory**
- **Brown University**
- Center for Underground Physics
- **Edinburgh University**
- Fermi National Accelerator Lab.
- Imperial College London
- King's College London
- Lawrence Berkeley National Lab.
- Lawrence Livermore National Lab.
- LIP Coimbra
- **Northwestern University**
- **Pennsylvania State University**
- **Royal Holloway University of London**
- SLAC National Accelerator Lab.
- South Dakota School of Mines & Tech
- South Dakota Science & Technology Authority
- STFC Rutherford Appleton Lab.
- **Texas A&M University**
- University of Albany, SUNY
- University of Alabama
- **University of Bristol**
- **University College London**
- **University of California Berkeley**
- **University of California Davis**
- **University of California Los Angeles**
- **University of California Santa Barbara**
- **University of Liverpool**
- University of Maryland
- University of Massachusetts. Amherst
- **University of Michigan**
- University of Oxford
- **University of Rochester**
- **University of Sheffield**
- University of Sydney
- **University of Texas at Austin**
- University of Wisconsin, Madison
- University of Zürich

Europe

Asia

Oceania

Thank you for your attention!

Backup Slides

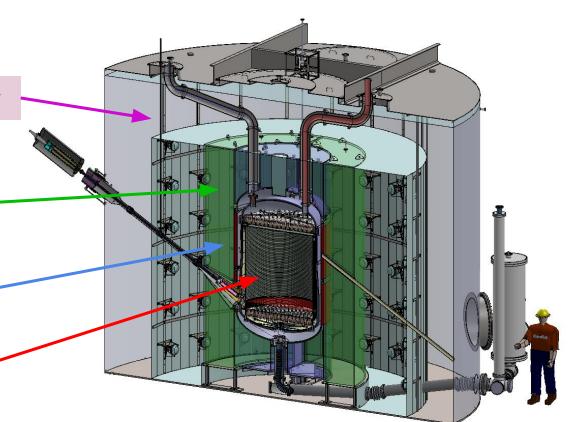
The LZ Detector

138 tonnes of ultra-pure water

Outer Detector: 17.5 tonnes of gadolinium-loaded scintillator

Skin: 2 tonnes LXe

TPC: 7 tonnes LXe in active volume.



The Background Spectrum In The $0v\beta\beta$ ROI \rightarrow MS vs SS

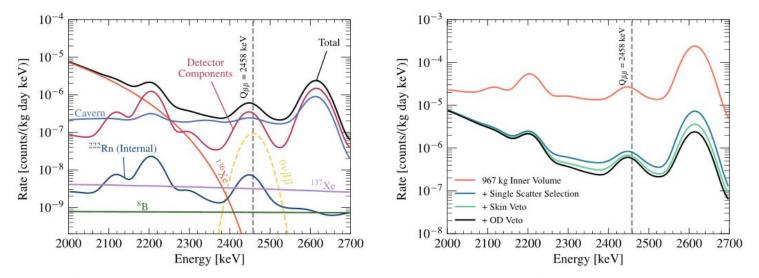


FIG. 3. Background energy spectrum in the inner 967 kg volume: contributions from the main background sources (left) and effect of successive selection cuts used in the analysis (right). More details regarding the analysis can be found in the text. The 60 Co, 238 U-late chain and 232 Th-late chain backgrounds from the detector components are combined into a single curve on the left plot but are treated independently in the sensitivity analysis. The dashed yellow line in the left plot represents the expected signal spectrum for 136 Xe $0\nu\beta\beta$ decay, considering a half-life of 1.06×10^{26} y (see Sec. IV), and it is not included in the total spectrum. The spectra are smeared using the energy resolution function of LUX [31], scaled to be 1.0% at Q_{BB} .

The Background Spectrum In The ονββ ROI

\rightarrow MS vs SS

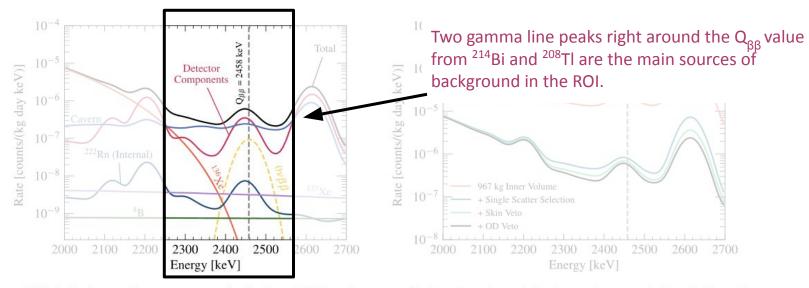


FIG. 3. Background energy spectrum in the inner 967 kg volume: contributions from the main background sources (left) and effect of successive selection cuts used in the analysis (right). More details regarding the analysis can be found in the text. The 60 Co, 238 U-late chain and 232 Th-late chain backgrounds from the detector components are combined into a single curve on the left plot but are treated independently in the sensitivity analysis. The dashed yellow line in the left plot represents the expected signal spectrum for 136 Xe $0\nu\beta\beta$ decay, considering a half-life of 1.06×10^{26} y (see Sec. IV), and it is not included in the total spectrum. The spectra are smeared using the energy resolution function of LUX [31], scaled to be 1.0% at $Q_{\beta\beta}$.

The Background Spectrum In The $0v\beta\beta$ ROI \rightarrow MS vs SS

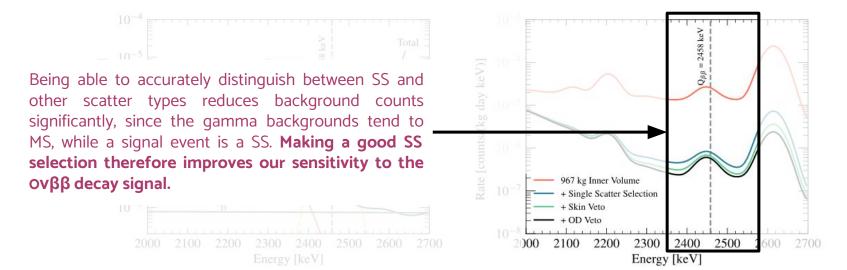
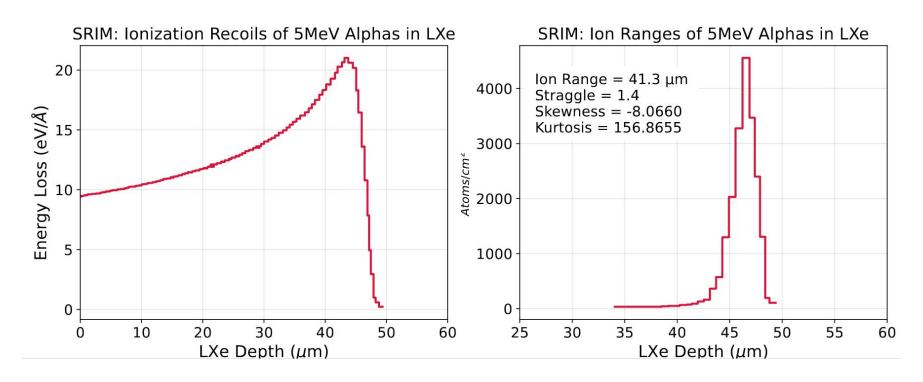


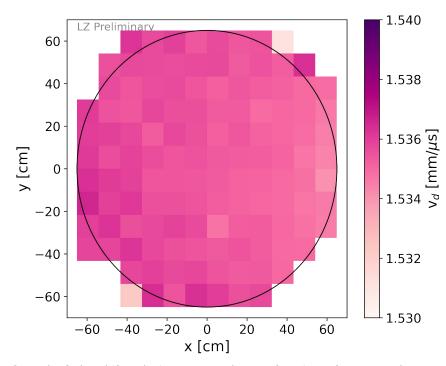
FIG. 3. Background energy spectrum in the inner 967 kg volume: contributions from the main background sources (left) and effect of successive selection cuts used in the analysis (right). More details regarding the analysis can be found in the text. The 60 Co, 238 U-late chain and 232 Th-late chain backgrounds from the detector components are combined into a single curve on the left plot but are treated independently in the sensitivity analysis. The dashed yellow line in the left plot represents the expected signal spectrum for 136 Xe $0\nu\beta\beta$ decay, considering a half-life of 1.06×10^{26} y (see Sec. IV), and it is not included in the total spectrum. The spectra are smeared using the energy resolution function of LUX [31], scaled to be 1.0% at $Q_{\beta\beta}$.

Alpha Decays as Point-Sources

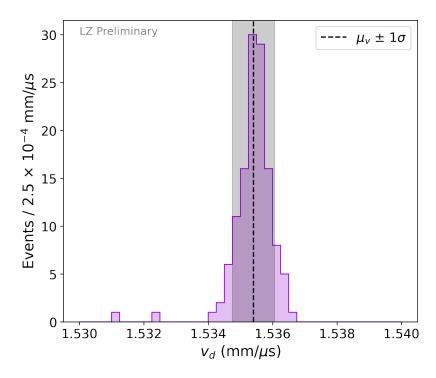
Alpha decays are **point-sources** to good approximation (combination of well-defined range and bragg peak.).



Drift Velocity Measurement



Spread of the drift velocity measured as a function of (x,y), used to determine the spatial dependence of the drift velocity.



1-D projection of the plot on the left.

Longitudinal Diffusion Measurement Fit Result Best Fit D_I = $20 \pm 1 \text{ cm}^2/\text{s}$ — Data LZ Preliminary / pyd] Amplitude [D₁ Measurements in LXe 160 NEST v2.3.8 Hogenbirk 2018 [183K] 364 368 370 372 374 140 Mei 2011 Time [µs] Njoya 2020 [162K] Fit Result 120 Xenoscope 2023 [178K] Best Fit D_i = 20 ± 1 cm²/s LUX-ZEPLIN [175 ± 1 K] $D_L (cm^2/s)$ LZ Preliminary ns] 40 Amplitude [phd / 4 60 40 20 -LZ Preliminary

834

832

836

838 840

Time [µs]

842 844

Some more examples S2-model fits on WS-2022 S2s from waveforms at the top of the detector and bottom of the detector.

200

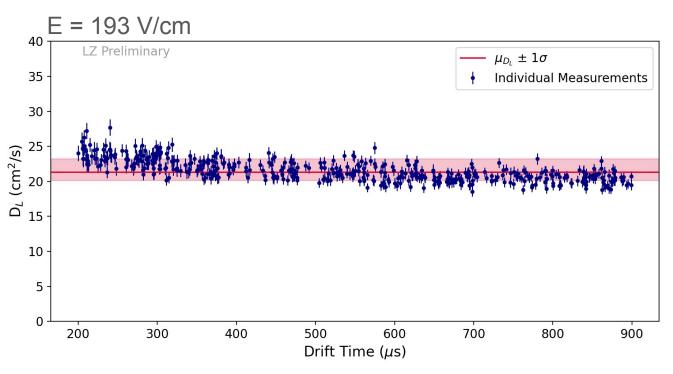
100

Drift field (V/cm)

150

50

Longitudinal Diffusion Measurement



Shows the spread of the individual D_L measurements made based on waveforms from the WS-2022 data set. The drift-time dependence of the measurement is hypothesised to be due to the temperature gradient of 2K between the bottom of the TPC and the LXe Surface. Both the statistical spread of the data & tilt are accounted for in total uncertainty on the D_L measurement.