Precision measurement of Compton scattering in silicon with a skipper CCD for dark matter detection

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Experiments aiming to directly detect dark matter through particle recoils can achieve energy thresholds of $\mathcal{O}(10 \text{ eV})$. In this regime, ionization signals from small-angle Compton scatters of environmental γ rays constitute a significant background. Monte Carlo simulations used to build background models have not been experimentally validated at these low energies. We report a precision measurement of Compton scattering on silicon atomic shell electrons down to 23 eV. A skipper charge-coupled device with singleelectron resolution, developed for the DAMIC-M experiment, was exposed to a ²⁴¹Am γ -ray source over several months. Features associated with the silicon K-, L₁-, and L_{2,3}-shells are clearly identified, and scattering on valence electrons is detected for the first time below 100 eV. We find that the relativistic impulse approximation for Compton scattering, which is implemented in Monte Carlo simulations commonly used by direct detection experiments, does not reproduce the measured spectrum below 0.5 keV. The data are in better agreement with *ab initio* calculations originally developed for x-ray absorption spectroscopy.

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I. INTRODUCTION

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The existence of dark matter, a preponderant, nonluminous material that interacts gravitationally, has been unequivocally established by astrophysical and cosmological observations [1]. The hypothesis that dark matter is made of unknown particles has compelled experimental searches to directly detect them through interactions with

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target materials [1]. Many of these experiments are located in underground laboratories to shield from cosmic rays and need further sophisticated techniques to suppress radiogenic and cosmogenic backgrounds [2-4]. Still, energy deposits from Compton scattered γ rays constitute a significant background in detectors searching for dark matter particles. Compton scattering may occur deep in the active detection volume mimicking a dark matter interaction. While in some experiments nuclear recoils induced by weakly interacting massive particles [5] have a signature distinct from that of Compton ionization signals, the rejection power drastically decreases at low energy [6-8]. Dark matter-electron interactions expected in the so-called dark sector models [9,10] are indistinguishable from Compton scattering. A precise knowledge of the Compton background spectrum in the detector material is thus of paramount importance in finding evidence of the interactions of dark matter particles.

The Dark Matter in CCDs at Modane (DAMIC-M) experiment employs skipper charge-coupled devices (CCDs) to directly search for the interactions of dark matter particles [11]. Compared to scientific CCDs with conventional readout, e.g., those used by the precursor DAMIC experiment [12–16], skipper CCDs allow for a significant reduction in readout noise, enabling the detection of single electrons and energy thresholds of a few eV [17–19]. With skipper readout, DAMIC-M has unprecedented sensitivity to nuclear and electronic recoils from interactions of low-mass (1–10⁴ MeV/c²) dark matter candidates in the bulk silicon of the CCDs. Understanding backgrounds down to the DAMIC-M energy threshold is essential for exploiting this sensitivity.

Small-angle Compton scatters produce low-energy electron recoils, including from freed atomic shell electrons which have a well-defined binding energy. Ionization signals from shell electrons should produce a spectrum with predicted features according to their binding energy in the region below 200 eV, which corresponds to L-shell transition energies in silicon. Compton scattering produces pointlike energy deposits uniformly distributed in the silicon bulk, as is the case for dark matter particles interactions. A precise measurement of the Compton spectrum will allow the detector response to be calibrated down to a few electrons, improving sensitivity for low-mass dark matter searches.

In this paper, we report a precision measurement of Compton scattering on silicon shell electrons in a skipper CCD. Measurements were performed by exposing a DAMIC-M prototype CCD to a ²⁴¹Am γ -ray source. Our result improves upon previous work using scientific CCDs with conventional readout [20] and an energy threshold of 60 eV, where an unexpected softening of the spectrum in the L-shell region was observed. Results from another group also using a skipper CCD observed a similar effect [21]. Here we present measurements with

subelectron charge resolution down to 23 eV, allowing for a robust mapping of the spectrum in a region that has not been previously measured.

II. COMPTON SCATTERING

Compton scattering describes the interaction between an incident photon and a free electron [22]. Such interactions result in the deflection of the photon and recoil of the electron, whose energy and direction can be obtained by conservation laws. Assuming a free electron at rest, the interaction cross section is described by the well-known Klein-Nishina formula [23]. For the scattering of unpolarized photons with an atomic electron in a target, the doubledifferential cross section may be more generally expressed as [24]

$$\frac{d^2\sigma}{dE \cdot d\Omega}\Big|_{nl} = \frac{r_0^2}{2} \left(1 - \frac{E}{E_{\gamma}}\right) S_{nl}(q, E) (1 + \cos^2\theta), \quad (1)$$

where r_0 is the classical electron radius, θ is the scattering angle of the deflected photon, E_{γ} is the initial photon energy, *E* is the difference between the initial and final photon energies (i.e., the energy deposited in the target), and *q* is the magnitude of the photon scattering vector. The dynamic structure factor $S_{nl}(q, E)$ encapsulates the targetdependent component of the cross section and depends on the atomic quantum numbers *n* and *l* of the target electron.

The simplest extension of the Klein-Nishina formula is to treat each atomic shell electron as free but with a constrained momentum distribution. This is achieved in the so-called relativistic impulse approximation (RIA) [25], where the dynamic structure factor is expressed as

$$S_{nl}(q,E)(1+\cos^2\theta) = \frac{m}{q}\chi(p_z)J_{nl}(p_z),\qquad(2)$$

where *m* is the mass of the electron. The Compton profile J_{nl} and the relativistic correction factor $\chi(p_z)$ depend only on p_z , the projection of the initial electron momentum on the photon scattering vector. Tables of computed J_{nl} for different atomic electrons can be found in the literature [26]. The RIA succeeds in describing several features of the deposited-energy spectrum, including the broadening of the Compton edge.

A low-energy prediction from the RIA is constructed by considering the atomic binding energies E_{nl} in relation to the transfer energy. When $E < E_{nl}$, i.e., the energy transfer is less than the binding energy of the atomic shell, $d\sigma/dEd\Omega|_{nl} = 0$ and the energy spectrum forms steps proportional to the number of electrons in the shell. At $E = E_{nl}$, the scattered electron has negligible kinetic energy and the photon is likely to escape after a single scatter, especially in a thin detector such as the CCD used in this measurement. Deposited energy is thus a result of refilling the atomic vacancy by emission of secondary



FIG. 1. Electron-recoil spectrum calculated using the RIA for Compton scattering of a 59.54 keV photon in silicon. The inset table details the quantum numbers (n, l), binding energy (E_{nl}) , and number of electrons in each atomic shell. The binding energies are from experimental x-ray measurements at National Institute of Standards and Technology [30]. Each shell level is labeled on the spectrum. The relative height of each step is approximately the ratio of the electrons in each shell to the total available electrons.

Auger/Coster-Kronig [27] electrons or fluorescence x rays. For $E > E_{nl}$, freed electron energies fall on an approximately constant slope between steps obtained from the integration of Eq. (1) over all scattering angles (momentum transfers). The resulting spectrum is shown in Fig. 1 for incident ²⁴¹Am γ rays ($E_{\gamma} = 59.5$ keV) on silicon. A similar procedure [28] is implemented in the particletracking Monte Carlo code GEANT4 [29], widely used for the estimate of backgrounds in experiments directly searching for dark matter interactions.

The approximation of a free electron may not be adequate in the regime where the energy transfer is comparable to the electron binding and kinetic energies [31]. In this case, it is more appropriate to compute $S_{nl}(q, E)$ with *ab initio* calculations. We use the FEFF [32,33] code, which performs a full quantum mechanical treatment to sum over all transition probabilities from the initial state to all possible atomic final states in the target material. FEFF was primarily developed (and has been extensively validated) for x-ray absorption spectroscopy [34] but includes the option to calculate $S_{nl}(q, E)$ for nonresonant inelastic x-ray scattering (NRIXS) [35].¹

The previous measurement performed with a silicon CCD [20] found the RIA model to reasonably describe the data in the K-shell region. However, the measured spectrum in the L-shells region was notably softer than the model prediction, with deviations that could not be accounted for by the resolution of the experiment. Separate L_1 and $L_{2,3}$



FIG. 2. Experimental setup used for the Compton scattering measurement. The 1024×6176 skipper CCD is mounted in a copper frame, as shown in the inset (lids not pictured), inside of the vacuum chamber. Components required for operation (e.g., the turbo pump, cryocooler, and electronics) interface with the chamber via flanges. The ²⁴¹Am source is positioned behind the chamber, centered with the CCD plane.

step features were not observed. In this paper, we refine the measurement of the deposited-energy spectrum from 59.5 keV γ rays scattering in silicon and compare to the predictions from RIA and FEFF.

III. EXPERIMENTAL SETUP AND DATASETS

The experimental setup for this measurement is located in an on-surface clean room at the University of Chicago, as shown in Fig. 2. A skipper CCD with 1024×6176 pixels is used as the silicon target and detector. It features a threephase polysilicon gate structure with a buried p-channel, pixel size $15 \times 15 \ \mu m^2$, and a thickness of $675 \ \mu m$. The bulk of the device is high-resistivity (10–20 k Ω cm) n-type silicon which allows for fully depleted operation at substrate biases ≥ 40 V. The CCD was developed at Lawrence Berkeley National Laboratory Microsystems Lab [36–38] and fabricated by Teledyne DALSA Semiconductor as a prototype for the DAMIC-M experiment. Wire bonding and packaging was completed at the University of Washington.

The CCD is mounted in a copper frame within a stainless-steel vacuum chamber held at a pressure of 10^{-7} mbar and cooled to 126 K. Thin 1.6 mm aluminum lids are placed on both the front and backside of the copper frame to shield the CCD from IR photons generated by the warm chamber walls. A ²⁴¹Am source (59.54 keV γ ray) is mounted on the chamber illuminating the backside of the CCD, shielded by a 1.3 cm aluminum block to suppress weak lines between ~10 and 35 keV. This source was chosen because it has an intense γ -line at an energy where Compton scattering is the dominant interaction with resulting electron recoils fully depositing their energy in the bulk. The voltage biases, clocks, and video signals required for the CCD operation are provided by a Kapton flex cable wire bonded to the device. The silicon bulk is

¹The process referred to as "Compton scattering" in this paper is more commonly known as NRIXS in the x-ray community.

kept fully depleted by the application of a 95 V external bias. The CCD is controlled and read out by a custom data acquisition (DAQ) system based on commercial CCD electronics from Astronomical Research Cameras, Inc. A slow control system is used to operate the various instruments and monitor their status [39,40].

Within the CCD, Compton scattering generates charge carriers in the bulk silicon that are proportional to the energy deposited by the interaction. The voltage bias applied between the bottom and top surface of the device drifts the charge along the z direction toward the pixel array. Charge also diffuses in the lateral directions due to thermal motion, with a spatial spread σ_{xy} proportional to the drift length. Thus, clusters of pixels with charge found in the CCD images identify the location of interactions both in the xy plane and the z direction [12].

The voltage clocks move the charge held in a pixel row by row toward the serial register of the CCD. The charge is then clocked to the end of the serial register where a chargeto-voltage amplifier is located for readout. Unlike conventional CCDs, skipper CCDs [17-19] can be configured to make multiple nondestructive charge measurements (NDCMs). Skipper readout essentially moves the charge contained in each pixel back and forth into the readout node allowing for many measurements of the same pixel, so that they can be averaged. Since the measurements are uncorrelated, the readout noise is then reduced to $\sigma_{N_{\rm skip}} =$ $\sigma_1/\sqrt{N_{\rm skip}}$, where σ_1 is the single-sample readout noise (the standard deviation of a single charge measurement) and $N_{\rm skip}$ is the number of NDCMs. By taking a large enough number of NDCMs, the readout noise can reach the subelectron level and the detection threshold is reduced accordingly. Figure 3 demonstrates the achieved noise of the skipper readout allowing single-electron² charges to be resolved. The single-electron resolution also provides a straightforward way of calibrating the energy response of the detector (see Sec. IV).

Data collection is automated and taken on a run-by-run basis. Each run consists of multiple image types where the image size, number of NDCMs, and pixel binning³ are varied. Full CCD images with no binning and $N_{skip} = 1$ are taken to monitor the overall quality of the device, including stability of defects (faulty pixels) over the active area. Images with $N_{skip} = 2000$ are taken to calibrate the energy response and dark current of the CCD with maximum resolution. For the analysis presented here, the CCD operating parameters are optimized to ensure good



FIG. 3. (a) Pixel charge distribution, where the pixel charge is obtained from the average of $N_{\rm skip} = 2000$ NDCMs. Individual peaks correspond to 0, 1, and 2 electrons. From the distance between fitted peaks (red) a calibration constant of 5.1 ADU/e⁻ is derived (in ADUs). The pixel readout noise, obtained from the standard deviation of the zero-electron distribution, is $\sigma_{\rm e} = 0.13 \,{\rm e}^-$. (b) Pixel readout noise as a function of $N_{\rm skip}$. The data scale with the $1/\sqrt{N_{\rm skip}}$ expectation (red) for independent, uncorrelated measurements.

resolution while reducing occupancy to avoid overlapping clusters that can bias the measured energy spectrum. Each image corresponds to 10% of the CCD active area. A 4 × 4 binning is used to collect all charge from a single interaction into fewer pixels, thus reducing the contribution of the readout noise to the charge measurement. Every binned pixel is read out with $N_{\rm skip} = 64$, further reducing the noise. Remaining charge on the CCD is cleared before each image to guarantee that all images have the same exposure. A background dataset without the ²⁴¹Am source is taken with the same parameters as the Compton analysis data. Another dataset with the ²⁴¹Am source and parallel clocks moving charge away from the serial register allowed the study of backgrounds within the register pixels (see Sec. VI for details).

Table I summarizes the main datasets and details the relevant CCD operating parameters. Image sizes in the serial direction that exceed the active area of the CCD are

²For the sake of simplicity, we use the term electrons to indicate charge carriers detected in the CCD. However, holes are held in the pixels of the p-channel CCD used for this measurement.

³Pixel binning is an operating mode of the CCD where the charge of several pixels is summed before being read out. An $n \times m$ binning corresponds to summing the charge of n pixels in the serial direction and m pixels in the parallel direction.

TABLE I. Summary of the datasets used in the analysis. Overscan columns that exceed the active area of the CCD. The charge direction parameter represents the direction that charge is moved, either toward the readout serial register or away into the active area of the CCD. The cluster density was estimated in the 1–5 keV range and includes only events that pass selection cuts, as described in Sec. IV. All data were taken with a substrate voltage of 95 V to limit the lateral diffusion allowing charge from a single interaction to be collected in 4×4 binned pixels.

Source	$\begin{array}{c} \text{Binning} \\ (\text{col} \times \text{row}) \end{array}$	Image size $(col \times row)$	NDCMs	Charge direction	Images	Exposure (days)	Cluster density (evt/keV/image)	Туре
²⁴¹ Am	1×1	1100×6200	1	Serial register	909	1.3		Diagnostic
	4×16	275×60	2000	Serial register	909	5.9		Calibration
	4×4	275×150	64	Serial register	223 517	105.5	3.32	Source
	4×4	275×150	64	Active area	26 948	11.8	0.07	Serial register
None	4×4	275×150	64	Serial register	103 106	48.1	0.02	Background

known as the "overscan." These additional overscan pixels do not contain charge and are used to determine the baseline for each row. Note that in the subsequent sections, a "pixel" refers to a 4×4 binned pixel for $N_{skip} = 64$ data and to a 4×16 binned pixel for $N_{skip} = 2000$ data.

Data collection lasted several months requiring continuous monitoring of the data quality. Automatic data analysis reports for each run provide information on the pedestal baselines, dark current level, calibration constants, readout noise, and single-electron resolution, allowing for an accurate tracking of the CCD performance and stability. All monitored parameters show excellent stability to a few per mil. Less than 1% of the data were rejected from the sample due to spurious noise sources that induce dc offset fluctuations in the measured signals.

IV. IMAGE PROCESSING, CALIBRATION, AND EVENT RECONSTRUCTION

A raw image contains an array of signals (in analog-todigital converter units, ADUs) corresponding to every charge measurement performed by the readout chain. Image processing begins by calculating the average signal using the $N_{\rm skip}$ values for each pixel. To eliminate the dc offset of the electronics chain, a pedestal value is obtained from a Gaussian fit of the pixel value distribution in the overscan region, which has mostly zero charge. The pedestal is determined independently for each row and then subtracted from all pixels in the row. At the end of this procedure, the resulting pixel value in ADUs is proportional to the charge contained in the pixel. We then exploit the single-electron resolution provided by the skipper readout to determine the calibration between ADUs and electrons, using $N_{\rm skip} = 2000$ images with a resolution of $\sigma_{\rm e} = 0.13 \, {\rm e^-}$ (where the single-sample noise is $\sigma_1 = 6 \, {\rm e^-}$). The pixel charge distribution obtained from these images shows over 550 consecutive peaks individually resolved with sufficient statistical precision [see Fig. 4(a)], where the number of k-1 electrons corresponds to peak k (zero electrons are associated with the first peak). Since the



FIG. 4. (a) Pixel charge distribution with single-electron resolution ($N_{\rm skip} = 2000$) showing individual peaks up to 550 electrons (~2.1 keV). To calibrate the energy scale, the mean value of each peak in ADUs is compared with the corresponding number of electrons. (b) Pixel charge distribution with $N_{\rm skip} = 2000$ (purple) and $N_{\rm skip} = 64$ (red) corresponding to a charge of 100 electrons. The pixels entering the two distributions are the same, with their charge calculated using only the first 64 out of the 2000 NDCMs for $N_{\rm skip} = 64$.



FIG. 5. Charge resolution for $N_{\rm skip} = 64$ as a function of charge up to $550 \, {\rm e^-}$ (~2.1 keV). Each data point represents the resolution measured at each individual electron peak. The resolution changes by < 1% over the entire energy range (red). The error increases with increasing electron number due to statistics.

Compton measurement is performed with $N_{\rm skip} = 64$, a further step is required, as illustrated in Fig. 4(b): for each peak, the value of the associated pixels is recalculated using only the first 64 out of the 2000 NDCMs. The mean value and standard deviation in ADUs of this pixel distribution with $N_{\rm skip} = 64$ is obtained from a Gaussian fit. The calibration is then performed by comparing the mean value in ADUs to the number of electrons corresponding to the peak. With this procedure the charge linearity is measured up to $550 e^{-}$ (~2.1 keV), covering the entire region of interest, and found to be stable within 3% throughout. For a precise conversion of ADUs to electrons, which takes into account residual nonlinearity, we use a two-degree polynomial. This procedure also provides a measurement of the charge resolution for $N_{\rm skip} = 64$ through the fitted standard deviation of the pixel value distributions. A charge resolution $\sigma_{\rm e} = 0.73 \, {\rm e^-}$ is found, notably constant up to charges of 550 e⁻, as shown in Fig. 5.

The image processing then proceeds to group individual pixels in order to reconstruct the full energy of events within the CCD using a few selection criteria. A clustering algorithm associates contiguous pixels with charge > $3.6\sigma_{\rm e}$ and a seed pixel with charge > $4.6\sigma_{\rm e}$ to identify singlescatter events. These thresholds limit the number of zero-electron clusters that pass because of the upward fluctuations in noise to < 5%. Defects in the CCD array result in a few pixels with defects that have charge present in a large fraction of images. A higher than average rate of clusters is then found to correspond with these regions. To avoid a bias in the energy spectrum, clusters overlapping these regions are rejected. Lastly, the cluster energy is calculated by multiplying the cluster charge in electrons by $\epsilon_{eh} = 3.74$ eV, the average energy required to produce an electron-hole pair in silicon at the CCD operating temperature [41].

V. SIMULATIONS

A full simulation of the experiment is essential to validate the data analysis methods, determine the reconstruction efficiency, and interpret the results. We use the GEANT4 simulation toolkit [29] to develop an accurate description of the geometry and materials of the experiment, including the chamber, the detector, and the ²⁴¹Am source. GEANT4 provides the energy E_{dep} deposited by particle interactions⁴ in the silicon bulk of the CCD as well as its location (x-y-z). To convert the energy into the number of electrons, the model developed in Ref. [41] is implemented in a dedicated Monte Carlo simulation. First, for $E_{dep} > 50$ eV, the number of electrons is calculated by dividing E_{dep} by ϵ_{eh} and smearing according to the Fano energy resolution,

$$\sigma_{E_{\rm dep}}^2 = \epsilon_{eh} F E_{\rm dep}, \tag{3}$$

where F = 0.128 is the Fano factor measured in Ref. [20]. We note that other measurements at similar temperatures observe a value near F = 0.118 [45,46], however this has a negligible impact on the smeared spectrum. For $E_{\rm dep} < 50 \text{ eV}$, the number of electrons is obtained by sampling electron-hole pair creation probabilities [41]. Then, all resulting electrons are laterally diffused according to the parameters measured with tracks from cosmic rays in the same CCD (for details of the method see [16]) and distributed on the x-y pixel array. Lastly, simulated ²⁴¹Am clusters are pasted onto images from the background dataset to properly include the pixel readout noise, the dark current, and the presence of cosmic rays and other tracks. The number of simulated clusters overlayed per image and their spatial distribution is chosen to reproduce the ²⁴¹Am source data resulting in a set of images which closely resembles the source data and can be processed through the same analysis chain described in Sec. IV. The reconstructed energy spectrum from these simulated images is shown in Fig. 6 between 20 and 300 eV. It matches the expected features of the RIA model implemented in GEANT4, indicating that clusters are reconstructed with high efficiency and accuracy.

The reconstruction efficiency was confirmed by a dedicated Monte Carlo simulation following the steps described above. Pointlike energy deposits from a uniform energy and spatial distribution were generated, diffused and pasted onto images from the background dataset. The reconstructed clusters were then compared to the original

⁴The Livermore [42] low-energy electromagnetic models implemented in GEANT4 were used for the simulation. The Penelope [43] and Monash [44] models were also used to cross-check the Compton spectrum. The RIA serves as the basis for both Livermore and Penelope models, while Monash was developed from first principles to describe the energy and direction of the scattered photon and ejected electron. Our simulations show all three physics lists are in good agreement in terms of the step locations and amplitudes.



FIG. 6. Reconstructed low-energy spectrum from the Monte Carlo (MC) simulation of the Compton scattering experiment (purple). The spectrum reproduces the expected features of the relativistic impulse approximation model implemented in GEANT4 (black, generator level spectrum). We note that the Lawrence Livermore National Laboratory physics list uses the theoretical binding energies from Ref. [47], which are slightly shifted from the values quoted in Fig. 1. The smearing in the reconstructed spectrum comes from the Fano resolution and pixel readout noise.

energy deposits. From this study, we determine the reconstruction efficiency to be near 100% for energy deposits as low as 15 eV.

VI. COMPTON SPECTRUM MEASUREMENT

The energy spectrum derived by applying the analysis procedure (see Sec. IV) to the ²⁴¹Am source data is shown in Fig. 7 for energies up to around 18 keV.⁵ Also shown are the spectra corresponding to background data and Monte Carlo simulation normalized to exposure time of the ²⁴¹Am source data. Characteristic features of Compton scattering of the 59.54 keV γ ray in silicon, the Compton edge at 11.2 keV, and the K-shell step at 1.8 keV are evident in the measured spectrum and accurately reproduced by the Monte Carlo simulation. The slight mismatch above the edge is due to limitations in extrapolating the calibration curve, which was measured only up to 2.1 keV, as electronics were optimized for the L-shell region (Sec. IV), to higher energies. Also note that γ -ray lines between 10 and 24 keV usually observed with ²⁴¹Am are blocked by the aluminium shield in front of the source (as described in Sec. III). A detailed analysis of the K-shell feature is given in Sec. VII. Spectra in all remaining figures are shown in 1 electron (1 e⁻) bins to highlight the singleelectron energy resolution of the measurement.

While the backgrounds are very small above 1 keV, their contribution to the spectrum in the L-shell region cannot be neglected. The dominant source are so-called "horizontal



FIG. 7. Measured 241 Am source spectrum (black) in 16 e⁻ bins. Also shown are the normalized spectra from the Monte Carlo simulation (purple) and background data (red).

clusters" from the serial register. These events are common when operating on the surface, as cosmic rays and natural radiation can hit the serial register and generate charge. As the rows are read out, the clusters are reconstructed as horizontal tracks in the CCD's active area. Since the full energy of the particle is not deposited, the horizontal clusters contain only a few pixels and cannot be distinguished from low-energy events occurring in the CCD active region. Thus, a background subtraction procedure is required to reach the lowest threshold. Since the rate of horizontal clusters is proportional to the flux of radiation incident on the CCD, their number should increase significantly in presence of the ²⁴¹Am source. This was verified with a dedicated dataset. With the source in place, images were taken by moving charge away from the readout serial register. This operating mode results in images containing only clusters originating in the serial register. We confirmed that the rate of horizontal clusters with the ²⁴¹Am source is a factor of 10 higher than the rate of clusters measured in the standard background runs. Therefore, both the serial register and standard background data must be considered. Given the relevance of this effect below 400 eV, two independent methods were developed for an accurate measurement of the ²⁴¹Am Compton spectrum.

In the first method, we perform a bin-by-bin subtraction of the serial register background and standard background spectra from the ²⁴¹Am source spectrum. The subtracted spectra were normalized to the exposure time of the source data. This approach accounts for both the increased rate of horizontal clusters due to the source (serial register background) and background clusters in the CCD active area from cosmic rays and radiogenic sources in the apparatus (standard background). The spectral subtraction method is illustrated in Fig. 8, where all components and the derived Compton spectrum are shown.

In the second method, a data-driven approach uses only the ²⁴¹Am source data to estimate the background, as

⁵Higher energies are affected by saturation effects in the electronics, which was optimized for single-electron resolution.



FIG. 8. The subtracted ²⁴¹Am Compton spectrum (black) in the L-shell region. To illustrate the measurement components, the normalized spectra used in the subtraction are shown: ²⁴¹Am source (green), ²⁴¹Am serial register (blue), and background (red).

illustrated in Fig. 9. Due to the sequential readout of the CCD, the effective exposure time of a row increases linearly with its readout order. The number of clusters produced by Compton scattering in the active area increases as a function of row position in the image. However, the number of horizontal clusters should remain constant since the exposure time in the serial register is the same for all rows. We thus perform a linear fit of the number of clusters as a function of row to estimate the signal, which is represented in the area of the triangle illustrated in Fig. 9(a). A small correction ($\approx 10\%$) is applied to take into account that the CCD is exposed for 3 s (during which clusters accumulate uniformly over the rows) and then read out for 37 s. The procedure was performed on each energy bin, with size 3.74 eV (1 e⁻), to produce the final low-energy spectrum shown in Fig. 9(b). The derived spectrum is compared to the one obtained with the spectral subtraction method. The two spectra are in excellent agreement showing similar features. It should be noted that the spectra are not normalized to each other; their agreement in the absolute rate indicates that the same amount of signal is recovered by both methods.

Several checks were performed to validate the analysis procedure. The data-driven method was applied to the serial register background dataset, verifying that the rate of horizontal clusters indeed does not depend on the row number. The serial register background spectrum was found to closely match that obtained from the overscan portion of the ²⁴¹Am source images, which also contains only clusters originating in the serial register. Monte Carlo simulated clusters were pasted onto images of the serial register background and standard background datasets, as explained in Sec. V. Furthermore, ²⁴¹Am source data were divided into two chronological, independent sets, and the corresponding spectra were found to be compatible within statistical uncertainty. The analysis was also repeated with lower thresholds in the clustering algorithm (seed pixel



FIG. 9. (a) Number of reconstructed clusters below 0.15 keV as a function of row in the CCD. The area of the triangle (purple) is taken as an estimate of the signal, together with the small rectangle right below (purple crosses) which accounts for 3 s exposure before readout. The larger rectangle (gray) represents the subtracted background. (b) Comparison of the spectral subtraction (black) and the data-driven (purple) spectrum in the L-shell energy region.

threshold > $4\sigma_e$ and contiguous pixel threshold > $3\sigma_e$), resulting in a very consistent spectrum. All these checks give confidence that the measured spectrum is accurate down to threshold with uncertainties dominated by statistics.

VII. COMPARISON WITH THEORETICAL MODELS

An accurate estimate of low-energy backgrounds from Compton scattering of radiogenic γ rays is important for DAMIC-M and other future direct detection experiments with energy thresholds of ~10 eV [7,48–50]. The Monte Carlo packages used by these experiments, e.g., GEANT4 [29] and MCNP [51], employ the RIA model to simulate Compton scattering (see Sec. II). We use the measured spectrum obtained from the spectral subtraction method (first method) to test the validity of the RIA model in an unexplored energy range, and thus the appropriateness of these Monte Carlo simulations, down to 23 eV. Note that the assumptions of the RIA model are not valid for energy transfers close to the electron binding energy and



FIG. 10. The measured ²⁴¹Am Compton spectrum (black) from the 23 eV detection threshold to 2.1 keV. The K-step is observed at 1.8 keV. The GEANT4 simulated spectrum (purple) that is based on the relativistic impulse approximation is also shown. In red is the *ab initio* calculation from the FEFF code, with detector response taken into account. The inset shows the data comparison to the FEFF prediction in the L-shell energy range.

we may expect its predictions to be inaccurate near the silicon steps. Having already shown the agreement with the GEANT4 simulation at the Compton edge in Fig. 7, here we compare the model to data near the atomic shell binding energies.

Previous measurements of the K-shell region have been in good agreement with RIA model [20]. Our skipper CCD measurement is in alignment with these results, as shown in Fig. 10. The simulated GEANT4 Compton spectrum, which incorporates both the RIA model and silicon detector response, provides a close match to the data down to about 0.5 keV. In particular, the K-shell transition step and slopes of the spectrum before and after the K-shell energy are reproduced.

However, there are notable differences at lower energies, as shown in Fig. 10 and its inset. A softening of the spectrum below 0.5 keV is observed in the data, confirming the previous measurement [20]. Data between the $L_{2,3}$ and L_1 energies are compatible with a step, a feature predicted by the RIA model, but has a softer shape. We detect for the first time a plateau below the $L_{2,3}$ energy (99.2 eV) corresponding to Compton scattering only on valence electrons. Its measured amplitude is consistent with the expectation of scaling by the number of electrons available in the shell.⁶ Overall the GEANT4 Monte Carlo overestimates the measured spectrum by up to 20% below 0.5 keV and in the L-shell region.

We then compared the data with ab initio calculations from the FEFF code (see Sec. II). The FEFF predictions were obtained by computing the corresponding $S_{nl}(q, E)$ [see Eq. (1)] in discrete $q(\cos\theta)$ and E steps and summing over all scattering angles. The code used was FEFF10 with configuration and silicon crystal structure from the Materials Project [52] (Materials ID mp-149). The computation was performed in real space (vs momentum space) on a cluster of 35 atoms centered on the target atom. For the L- and K-steps, for each $q(\cos \theta)$ and E step, the code was executed twice, once with the XANES card to obtain the fine structure near the atomic edge, and once with the EXAFS card to obtain the extended energy region. To compute the underlying spectrum from valence electrons, the code was executed with the COMPTON card, whose accuracy in silicon has been previously validated with data [53]. Note that the plasmon and particle-hole pair excitations,

⁶In a recently reported measurement also with a skipper CCD [21] this expectation was not verified, due to the presence of unsubtracted backgrounds as explicitly stated in the reference.

which contribute to $S_{nl}(q, E)$ at very low-momentum transfers [54], are not included. We checked for convergence and numerical consistency of the FEFF output. The original configuration option for the interaction with the vacated core hole was COREHOLE RPA, an approximation similar to that in the Bethe-Salpeter equation [55], and resulted in an L-step that was too sharp. Thus, it was consequently modified to COREHOLE NONE for the L-shell, which provides a much better match to the data. This is consistent with previous NRIXS measurements in silicon, where the omission in the calculation of the core-hole interaction with the photoelectron was observed to better match the spectrum in the extended energy region [56,57]. For a realistic comparison of the FEFF model, the spectrum was convoluted with the detector response of the silicon CCD, including the experimental charge resolution and Fano resolution. The resulting FEFF prediction for the Compton spectrum is shown in Fig. 10 and its inset. There is an excellent agreement with the data over the entire energy range. In particular, FEFF reproduces L-shell features to better than 10%, where a softening of the spectrum and step is observed. The RIA model fails in this region.

Using the FEFF model as a reference, we can gain useful insight on the detector response to ionization in silicon. The FEFF model reproduces the location and relative height of the K-shell step as well as the slope of the spectrum before and after the step. Note that the energy scale of the measured spectrum is determined by the value of ϵ_{eh} used to convert the charge into energy (3.74 eV per electron, see Sec. IV). We performed a fit of the data with the FEFF model keeping the K-step location as a free parameter, deriving

$$\epsilon_{eh}(1839 \text{ eV}) = 3.755 \pm 0.008_{\text{stat}} \pm 0.010_{\text{syst}} \text{ eV}, \quad (4)$$

where the systematic uncertainty takes into account the fitting range, the energy scale calibration, the CCD temperature, and the choice of the model. The result is in excellent agreement with the nominal value of ϵ_{eh} and confirms the accuracy of the calibration detailed in Sec. IV. A similar procedure could be applied at the L-shell energies but there are theoretical uncertainties in the *ab initio* calculations [58] and more statistics are required to validate the predicted structures. This makes it difficult to derive a meaningful value of the Fano factor since it strongly depends on the detailed shape of the predicted spectrum. Nevertheless, the excellent match of the model to data is consistent within few percent with a constant value of ϵ_{eh} down to 100 eV, in agreement with previous measurements [59]. Moreover, it has been proposed that energy loss mechanisms may vary in this energy range, resulting in an energy-dependent Fano factor and ϵ_{eh} [60,61]. We tested this hypothesis by convolving the FEFF prediction with the energy-dependent silicon detector response model parameters from Ref. [61] and the resulting spectrum provided a significantly worse fit of the data, confirming that an energy-independent detector response model is adequate down to low energy.

VIII. DISCUSSION

Future dark matter experiments require a robust knowledge of backgrounds from Compton scattered environmental γ rays down to the eV scale. To estimate these backgrounds, the community relies heavily on Monte Carlo packages such as GEANT4, which incorporates the relativistic impulse approximation model to describe the scattering physics. However, it is known that this model does not to apply to small scattering angles, and previous CCD measurements in silicon have observed a softer L-shell step than predicted. Thus, precision measurements of the Compton spectrum at low energies are needed to determine if the discrepancies are due to unknown detector effects or our knowledge of the cross sections themselves.

Our measurement explores the Compton spectrum in silicon down to a threshold of 23 eV, made possible with subelectron resolution of a DAMIC-M prototype CCD. We detect for the first time Compton scattering on valence electrons below 100 eV and clearly identify features associated with the silicon K-, L₁-, and L_{2 3}-shell. The RIA model expectations are in very good agreement with data above 0.5 keV, but fail to reproduce the spectrum in the L-shell region and overestimate rates by up to 20%. Since RIA-based simulations are used to build background models for direct detection experiments, care should be taken to evaluate their impact on the sensitivity to a potential dark matter signal. It may also be necessary to improve the Compton scattering model at low energy in Monte Carlo codes, such as GEANT4. In this respect, we have found our measured spectrum to be in much better agreement with predictions from *ab initio* calculations of Compton scattering with bound electrons using the FEFF code. To our knowledge, this is the first time such calculations, usually employed to evaluate x-ray scattering data at fixed momentum transfers, are compared to a Compton spectrum. The FEFF model predicts features in the spectrum that will require additional statistics to be confirmed. Data reported here are consistent with an energy-independent value of ϵ_{eh} , the average energy to produce an electron-hole pair in silicon. For a meaningful test of the energy dependence of the Fano factor, which describes the fluctuations in the energy deposited through scattering, a more precise measurement is required as well as a solid theoretical prediction of the spectrum shape. For this purpose we plan to take additional measurements to validate the model at different γ -ray energies using a ⁵⁷Co source ($E_{\gamma} = 122$ and 136 keV). We will also perform estimation studies to quantify the impact the FEFF model has on the DAMIC-M low-mass sensitivity.

Lastly, we note that for this measurement a skipper CCD was operated continuously for several months with excellent stability. Calibration and event reconstruction procedures optimized for subelectron resolution were developed. Our precise determination of the Compton spectrum demonstrates that skipper CCDs developed for DAMIC-M detect with high efficiency and accuracy energy deposits of just a few ionization charges in the silicon bulk. These results give us confidence in the forthcoming search for dark matter particles with the DAMIC-M experiment.

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