# Comparison of displacement damage effects on the dark signal in CMOS image sensors induced by CSNS back-n and XAPR neutrons

Yuan-Yuan Xue<sup>1,2</sup> · Zu-Jun Wang<sup>1</sup> · Wu-Ying Ma<sup>1</sup> · Min-Bo Liu<sup>1</sup> · Bao-Ping He<sup>1</sup> · Shi-Long Gou<sup>1</sup>

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#### Abstract

This study investigates the effects of displacement damage on the dark signal of a pinned photodiode CMOS image sensor (CIS) following irradiation with back-streaming white neutrons from white neutron sources at the China spallation neutron source (CSNS) and Xi'an pulsed reactor (XAPR). The mean dark signal, dark signal non-uniformity (DSNU), dark signal distribution, and hot pixels of the CIS were compared between the CSNS back-n and XAPR neutron irradiations. The non-ionizing energy loss and energy distribution of primary knock-on atoms in silicon, induced by neutrons, were calculated using the open-source package Geant4. An analysis combining experimental and simulation results showed a noticeable proportionality between the increase in the mean dark signal and the displacement damage dose (DDD). Additionally, neutron energies influence DSNU, dark signal distribution, and hot pixels. High neutron energies at the same DDD level may lead to pronounced dark signal non-uniformity and elevated hot pixel values.

**Keywords** Displacement damage effects  $\cdot$  CMOS image sensor (CIS)  $\cdot$  CSNS back-n  $\cdot$  XAPR neutrons  $\cdot$  Geant4  $\cdot$  Dark signal non-uniformity (DSNU)

# 1 Introduction

Imaging detection systems using CMOS image sensors (CISs) have high application prospects in radiation environments owing to their advantages, such as low-power consumption, improved electro-optical performance, and high tolerance to total ionizing dose (TID) effects [1–5]. Several previous studies have investigated the radiation effects of CISs, showing that they are particularly susceptible to displacement damage dose (DDD) effects. However, effective methods for radiation hardening have not yet been

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☑ Yuan-Yuan Xue xueyuanyuan@stu.pku.edu.cn

<sup>1</sup> State Key Laboratory of Intense Pulsed Irradiation Simulation and Effect, Northwest Institute of Nuclear Technology, Xi'an 710024, China

<sup>2</sup> State Key Laboratory of Artificial Microstructure and Microscopic Physics School of Physics, Peking University, Beijing 100871, China proposed [6–9]. Consequently, evaluating and estimating the DDD effects on CISs have become essential.

For Si-based devices, the concept of equivalent DDD, introduced by the US Naval Research Laboratory [10], has been utilized to assess the degradation caused by displacement damage from various particles, such as neutrons, protons, and heavy ions. The DDD effect on the mean dark signal of CISs with different structures under neutron or proton irradiation is consistent with the theory of equivalent DDD, as demonstrated by Virmontois and Goiffon [11, 12]. In addition to the mean dark signal, dark signal nonuniformity (DSNU) and dark signal distribution are crucial parameters for evaluating CIS performance, considering that CISs operate as an array of photodiodes. Analyzing the mean dark signal alone is insufficient for a comprehensive assessment of the impact of displacement damage on CIS. Unfortunately, the DDD effect on DSNU and dark signal distribution has not yet been elucidated.

Neutron irradiation experiments are commonly employed to investigate equivalent DDD effects induced by protons, heavy ions, or mixed particles [13, 14]. Typically, the irradiation fluence is converted to an equivalent 1-MeV neutron fluence for standardization. In previous assessments of DDD



effects on CIS, DDD has been considered, but the influence of neutron energy is usually overlooked. The impact of neutron energy on the DDD effect in dark signals, especially on DSNU, dark signal distribution, and hot pixels, should be investigated to effectively assess the overall effect of DDD on CIS performance.

This study investigated the DDD effect on the mean dark signal, DSNU, dark signal distribution, and hot pixels induced by back-streaming white neutrons (Back-n) at the China spallation neutron source (CSNS) and Xi'an pulsed reactor (XAPR). Parameter degradation was evaluated via an analysis that employed the theory of equivalent DDD. To assess the energy distribution of the primary knock-on atoms (PKAs) and non-ionizing energy loss (NIEL) induced in Si by 1-MeV wide-spectrum neutrons at CSNS back-n and XPAR with an equivalent neutron energy of 1 MeV, the open-source package Geant4 was employed for calculations. Research findings were analyzed by combining the results from both experimental and simulation approaches.

## 2 Experimental details

## 2.1 Samples

Two types of CISs (CIS1 and CIS2) were used in our experiments. The cross-sections of the pixel structures of CIS1 and CIS2 are presented in Fig. 1. CIS1 is a frontside illuminated scientific CIS comprising 11  $\mu$  m-pitch 2048 × 2048-pixel arrays. The active image size is 22.5 mm × 22.5 mm, and it is packaged in a 115-pin micropin grid array ( $\mu$ PGA) package. The temporal noise is approximately 1.47 $e^-$ , and the dynamic range exceeds 96 dB in high dynamic range mode. The power consumption of the image sensor operating at full speed is less than 600 mW. CIS2 is a backside-illuminated scientific CIS comprising 6.5  $\mu$ m-pitch 2048 × 2048-pixel arrays. The active image

size is 13.3 mm  $\times$  13.3 mm, and it is packaged in a 153-pin  $\mu$ PGA package. The temporal noise is almost  $1.20e^{-}$  with two-correlated multiple sampling (CMS) operations, and the dynamic range exceeds 90 dB. Both CIS circuits were fabricated using a 0.18-µm commercial CIS process. The CISs employ a  $P^+/N/P$  sandwich structure, known as a pinned photodiode to accumulate charges during integration. When the transfer gate is open, charges collected in the depletion region (also referred to as the space charge region, SCR) of the CIS pixel are transferred to the floating diode and subsequently read. Shallow trench isolation surrounds the photodiode to minimize crosstalk. Compared with traditional photodiodes, such as PN diodes or PIN diodes, a CIS consists of millions of pixels that demonstrate unique statistical properties, rendering it suitable for analyzing the DDD effect.

## 2.2 Experimental setup

Neutron irradiation experiments were conducted at XAPR and CSNS back-n facilities. In our experiment, we used four CIS samples: CIS1 - #1, CIS1 - #2, CIS1 - #3, and CIS1 - #4. CIS1 - #1 was exposed to a 1-MeV neutron equivalent fluences of  $1 \times 10^{11}$  n/cm<sup>2</sup> and  $2 \times 10^{11}$  n/cm<sup>2</sup> at XAPR. CIS1 - #2 was exposed to CSNS back-n with fluences of  $5 \times 10^9 \,\text{n/cm}^2$ ,  $1 \times 10^{10} \,\text{n/cm}^2$ ,  $3 \times 10^{10} \,\text{n/cm}^2$ ,  $6.5 \times 10^{10}$  n/cm<sup>2</sup>, and  $1 \times 10^{11}$  n/cm<sup>2</sup>. CIS1 – #3 was exposed to a 1-MeV neutron equivalent fluence of  $1 \times 10^{11}$ at the XAPR. CIS1 - #4 was exposed to CSNS back-n with fluence of  $1 \times 10^{10} \text{ n/cm}^2$ ,  $3 \times 10^{10} \text{ n/cm}^2$ ,  $5 \times 10^{10} \text{ n/cm}^2$ ,  $1 \times 10^{11}$  n/cm<sup>2</sup>, and  $2 \times 10^{11}$  n/cm<sup>2</sup>. All CISs were unbiased during irradiation. The energy of XAPR neutron irradiation ranges from meV to 20 MeV, while that of the CSNS back-n neutron irradiation ranges from eV to 200 MeV [15-19]. The accuracy of the XAPR neutron irradiation fluence was within 10%, and that of the CSNS back-n irradiation fluence was within 5%. The mean dark signal, DSNU, and dark



Fig. 1 (Color online) Schematic of CIS1 (Left) and CIS2 (Right)

signal distribution were measured after neutron irradiation. The ambient laboratory temperature was controlled using an air conditioner and maintained at approximately 25 °C. Images were captured until the output of the test system was stable to ensure that the measured uncertainty was less than 1%. The parameters were then calculated using a program developed by our research team.

# **3** Simulation details

To investigate the disparity in radiation effects on the CIS induced by neutrons at CSNS back-n and XAPR, Monte Carlo simulations were conducted using the open-source package Geant4 version 11.0 [20–22]. The sensitive region of the CIS comprises Si with a thickness not exceeding 5  $\mu$ m. To enhance simulation efficiency, a simplified geometry was employed to simulate the DDD effect on the CIS. The geometry was simplified to a single Si box with dimensions of 1 cm × 1 cm × 2 mm, representing a 'quasi-infinite' homogeneous medium. Incident particles were directed toward the center of the Si box, as shown in Fig. 2a. The cross-section of the neutron interaction with Si used in our Geant4 simulations is shown in Fig. 2b. The energy spectrum of PKAs resulting from neutron interactions was computed.

The DDD is then calculated using the NIEL and irradiation fluence [23].

$$DDD = \Phi(E) \cdot NIEL \tag{1}$$

where NIEL, representing the energy deposited in a material resulting in displacement damage, is used in this study. The PKA and NIEL energy spectra were calculated for 1 MeV wide-spectrum neutrons at CSNS back-n and XPAR with an equivalent neutron energy of 1 MeV. The energy spectra of the CSNS back-n and XAPR neutron used in the simulation were generated using measured data. Figure 2c and d shows the energy spectra of the CSNS back-n and XAPR neutrons, demonstrating the similarity between the simulated and measured data. To examine the disparity in degradation induced by the CSNS back-n and XAPR neutrons, the DDD was calculated using Geant4, employing Eq. (1). Additionally, the NIEL was computed using the Lindhard energy-partition function Q(T) [24].

$$\text{NIEL}(E_0) = \frac{N_A}{A} \int_{T_{\text{min}}}^{T_{\text{max}}} \left(\frac{\mathrm{d}\sigma}{\mathrm{d}T}\right)_{E_0} Q(T) T \mathrm{d}T$$
(2)

$$Q(T) = \frac{1}{1 + k_{\rm L}g(\varepsilon)}$$
(3)

where  $E_0$  is the incident particle energy,  $N_A$  is Avogadro's number, A is the atomic weight, T is the kinetic energy of

the recoil,  $T_{\min}$  and  $T_{\max}$  are the minimal and maximum energies that can be transferred to the lattice atom of the target material, respectively,  $d\sigma/dT$  is the differential interaction cross-section, and  $k_L$ ,  $\varepsilon$ ,  $g(\varepsilon)$  are dimensionless parameters, which are expressed as follows [24, 25]:

$$\varepsilon = \frac{T}{30.724ZZ_{\rm L} (Z^{2/3} + Z_{\rm L}^{2/3})^{1/2} (1 + A/A_{\rm L})}$$
(4)

$$k_{\rm L} = \frac{0.0794Z^{2/3}Z_{\rm L}^{1/2} (1 + A/A_{\rm L})^{3/2}}{(Z^{2/3} + Z_{\rm L}^{2/3})^{3/4} A^{3/2} A_{\rm L}^{1/2}}$$
(5)

$$g(\varepsilon) = \begin{cases} \varepsilon + 0.40244\varepsilon^{3/4} + 3.4008\varepsilon^{1/6} (T > 200 \,\mathrm{eV}) \\ 0.742\varepsilon + 1.6812\varepsilon^{3/4} + 0.90565\varepsilon^{1/6} (T \le 200 \,\mathrm{eV}) \end{cases}$$
(6)

where Z is the atomic number of the PKA, A is the atomic mass number of the PKA,  $Z_L$  is the atomic number of the target material, and  $A_L$  is the atomic mass number of the target material. To minimize calculation errors, the simulation was repeated 80 times using the Monte Carlo method. A random seed was set based on the system time to ensure different simulation processes. Figure 2e shows the NIEL of 1-MeV neutron, wide-spectrum neutrons at CSNS back-n, and XPAR with an equivalent neutron energy of 1 MeV plotted against the run number. As shown in Fig. 2e, the average NIEL for a 1-MeV neutron is higher than those of the XAPR neutron and CSNS back-n. Moreover, the NIEL of a-1 MeV neutron aligns with the findings presented in reference [26]. Furthermore, the average NIEL of CSNS back-n is greater than that of the XAPR neutron.

## 4 Results and analysis

#### 4.1 Mean dark signal

The mean dark signal represents the average value of the dark signal for each pixel of the CIS array, without any charge injected by light, particles, or electrical means. This parameter is significant for evaluating CIS performance. The mean dark signal is expressed as follows [27]:

$$\overline{\mu_{y,\text{dark}}} = \frac{1}{MN} \sum_{m=0}^{M-1} \sum_{n=0}^{N-1} \mu_{y,\text{dark}}[m][n]$$
(7)

where *M* and *N* are the number of rows and columns of the image, respectively. *m* and *n* are the row and column indices of the array.  $\mu_{y,dark}[m][n]$  is the dark signal of pixel (m, n). Figure 3a shows the relationship between the mean dark signal and neutron irradiation fluence after CSNS back-n and XAPR neutron irradiation. Data uncertainties are mainly due



Fig. 2 (Color online) Simulation details and results: a schematic of target detector; b cross-section of neutron for Si; c energy spectrum of CSNS back-n; d energy spectrum of XAPR neutron; and e NIEL versus run number



**Fig. 3** (Color online) Mean dark signal versus neutron irradiation fluence and DDD. Neutron fluence for XAPR neutron is the 1 MeV neutron equivalent fluence: **a** mean dark signal versus neutron irradiation fluence and **b** mean dark signal versus DDD

to the accuracy of the irradiation fluence and data measurement system. The accuracy of the XAPR neutron irradiation fluence was within 10%, and that of the CSNS back-n irradiation fluence was within 5%. In addition, image data were captured until the output of the test system stabilized to ensure that the measurement system uncertainty was less than 1%, which was negligible on this scale. Figure 3a shows that the radiation damage induced by XAPR neutrons is close to that induced by the CSNS back-n at the same irradiation fluence (the neutron fluence for XAPR neutrons is the 1-MeV neutron equivalent fluence). The dark signal is produced from bulk defects generated by neutrons when they traverse the SCR of the CIS. Further information on the mechanism of dark signal generation can be found in our previous studies [28].

In our experimental setup, the fluence of the XAPR neutron was equivalent to that of a 1-MeV neutron. Therefore, the NIEL of a 1-MeV neutron was employed to represent the NIEL of the XAPR neutron. However, the NIEL of a 1-MeV neutron is not greater than 10% of that of the CSNS back-n, which is similar to the accuracy of the irradiation fluence. The radiation damage induced by the XAPR and CSNS back-n neutrons is almost similar. As shown in Fig. 3a, the XAPR neutron causes damage similar to that of the CSNS back-n at an equivalent irradiation fluence, confirming our observations. Figure 3b shows the relationship between the mean dark signal and DDD following XAPR neutron and CSNS back-n irradiation. Data uncertainties, including the accuracy of the irradiation fluence and simulation uncertainties, are presented. As shown in Fig. 3b, the increase in the mean dark signal is proportional to the DDD. This result is consistent with the findings of Goiffon and Srour [12, 24]. The goodness-of-fit of the linear regression model was calculated, yielding a value of approximately 0.991 for CIS1 and 0.986 for CIS2. Thus, the relationship between the mean dark signal and DDD can be expressed as

$$\overline{\mu_{y,\text{dark}_\text{CIS1}}} = 8.13 \times 10^{-8} (\text{DN/ms/g/MeV}) \cdot \text{DDD}$$
(8)

$$\overline{\mu_{v,\text{dark CIS2}}} = 4.44 \times 10^{-8} (\text{DN/ms/g/MeV}) \cdot \text{DDD}$$
(9)

where  $\overline{\mu_{v,dark CIS1}}$  is the mean dark signal of CIS1 and  $\overline{\mu_{y,\text{dark CIS2}}}$  is the mean dark signal of CIS2. In addition, Fig. 3b shows that the dark signal at  $2 \times 10^{11}$  n/cm<sup>2</sup> deviates from linearity. This deviation is mainly due to the increase in irradiation fluence, causing several pixels to reach saturation, subsequently decreasing the rate at which the mean dark signal increases [28]. The goodness-of-fit of the linear fitting yields a value of approximately 0.998 for CIS1 and 0.996 for CIS2 if the value of the dark signal at  $2 \times 10^{11}$  $n/cm^2$  is not considered. Moreover, Fig. 3b shows that the fitting slope of CIS1 is greater than that of CIS2. This difference is mainly induced by the volume of the space charge region (also termed sensitive volume). The pixel sizes of CIS1 and CIS2 are 11  $\mu$ m × 11  $\mu$ m and 6.5  $\mu$ m × 6.5  $\mu$ m, respectively. More details about the effect of the volume of the space charge region on the dark signal of CIS need to be analyzed in future studies combined with TCAD fabrication simulations.

## 4.2 Dark signal non-uniformity

The DSNU is a measure of the non-uniformity of the dark signal within CIS arrays. This is defined as follows [27]:



Fig. 4 (Color online) DSNU versus DDD after CSNS back-n and XAPR neutron irradiation: a DSNU versus neutron irradiation fluence for CIS1; b DSNU versus neutron irradiation fluence for CIS2; c DSNU versus DDD for CIS1; and d DSNU versus DDD for CIS2

$$DSNU = \frac{1}{MN - 1} \sum_{m=0}^{M-1} \sum_{n=0}^{N-1} (\mu_{y,\text{dark}}[m][n] - \overline{\mu_{y,\text{dark}}})^2.$$
(10)

Figure 4a and b shows the relationship between DSNU and neutron irradiation fluence following CSNS back-n and XAPR neutron irradiation. Here, DSNU increases as the irradiation fluence increases under the same irradiated neutron source. However, in certain cases, DSNU may decrease with increasing irradiation fluence when the integration time is sufficiently long, and many pixels reach saturation, as observed in our previous work [28]. Figure 4c and d shows the relationship between DSNU and DDD after CSNS backn and XAPR neutron irradiation. Figure 4c and d shows that the DSNU of the CIS irradiated by CSNS back-n is higher than that irradiated by the XAPR neutron, even under nearly the same DDD. Both CIS1 and CIS2 exhibit similar phenomena. This observation indicates that CSNS back-n has a higher tendency to induce non-uniformity in the dark signal of CIS arrays than the XAPR neutron when exposed to an equivalent DDD. The dark signal of each pixel is directly influenced by the displacement damage density, which, in turn, is affected by the PKA energy. The relationship between the dark signal and PKA energy was discussed in our previous studies [29]. Notably, the PKA energy induced by CSNS back-n is larger than that induced by the XAPR neutron. Consequently, the CSNS back-n may result in a high degree of non-uniformity in the dark signal. Detailed information regarding the PKA energy spectra of the CSNS back-n and XAPR neutrons is provided in the subsequent section.

### 4.3 Dark signal distribution

Dark signal distribution refers to the variation in the dark signal among individual pixels within CIS arrays in the absence of external light, particles, or electrical inputs. Figure 5a–d shows the dark signal distributions of the CIS after exposure to CSNS back-n and XAPR neutron irradiation. The irradiation fluence for both cases is approximately  $1 \times 10^{11} \,\mathrm{n/cm^2}$  ( for the XAPR neutron, the irradiation fluence represents a 1-MeV neutron equivalent fluence). As shown in Fig. 5a-d, noticeable differences can be observed in the dark signal distributions resulting from CSNS backn and XAPR neutron irradiation. The dark signal distribution can be analyzed in three distinct regions. In region I, the dark signal of the CIS exhibits minimal variation after irradiation by the CSNS back-n and XAPR neutrons. This region primarily comprises pixels that are largely unaffected by neutron irradiation, with minor differences likely attributable to variations in production technology. In region II, the number of pixels damaged by XAPR neutron irradiation exceeded those damaged by the CSNS back-n. In region III, the number of pixels damaged by CSNS back-n irradiation exceeded that damaged by XAPR neutron irradiation.

The dark signal is proportional to the dark current, which consists of surface, bulk, and diffusion currents in the CIS. After neutron irradiation, the increase in the dark current is mainly induced by the bulk current at room temperature. Bulk dark current is mainly induced by the bulk defects in SCR. The bulk defects in SCR induced by the PKA of neutrons operate as Shockley–Read–Hall recombination-generation (SRH R-G) centers and generate dark current, leading to a dark increase. The bulk current density due to bulk defects can be expressed as

$$\begin{aligned} J_{\text{generation}} &= \int_{0}^{W} q U(E_{\text{t}}) \text{d}x \approx q U W = \frac{q n_{\text{i}} W}{\tau_{\text{g}}} \\ &= \frac{q n_{\text{i}} W \sigma_{\text{e}} \sigma_{\text{h}} v_{\text{th}}}{\sigma_{\text{e}} + \sigma_{\text{h}}} N_{\text{t}}, \end{aligned}$$
(11)

where  $J_{\text{generation}}$  represents the generation current density, qdenotes the electronic charge,  $U(E_t)$  is the generation rate when the additional trap energy level is  $E_t$ , W is the width of the space charge region,  $n_i$  is the intrinsic carrier concentration,  $\tau_{g}$  is the generation lifetime,  $\sigma_{e}$  is the electron cross-section,  $\sigma_{\rm h}$  is the hole capture cross-section,  $v_{\rm th}$  is the thermal velocity, and  $N_t$  is the defect density per volume.  $N_t$ is related to the PKA energy; a higher PKA energy results in a higher value of  $N_t$ . Therefore, the PKA energy spectra of the CSNS back-n and XAPR neutrons were simulated using Geant4, as shown in Fig. 5e. To maintain consistency and facilitate comparison with the results presented in Fig. 5a-d, we used a neutron equivalent fluence of 1 MeV based on the calculated NIEL. Figure 5e shows distinct differences in the PKA energy distributions between the CSNS back-n and XAPR neutrons. Specifically, in the lower PKA energy region, the XAPR neutrons exhibited a higher frequency of PKA production than the CSNS back-n. Conversely, in the higher PKA energy region, the CSNS back-n demonstrated a higher frequency of PKA production than XAPR neutrons. These findings are consistent with the experimental results presented in Fig. 5a-e. Therefore, when comparing the dark signal distribution of the CIS induced by particles, the energy of the particles should be considered.

#### 4.4 Hot pixels

Hot pixels in the CIS represent pixels that generate significantly higher dark signals than normal pixels, resulting in noticeable bright spots or hot spots in the output images. The proportion of hot pixels is one of the most important parameters for evaluating the performance of CIS imaging and detection systems in radiation environments. Hot pixels may be caused by various factors such as manufacturing defects and radiation damage. After neutron irradiation, many pixels are damaged by neutrons and become hot pixels. The frequencies of hot pixels with dark signals higher than 1500 and 2000 DN after CSNS back-n and XAPR neutron irradiation are shown in Fig. 6a and b, respectively. Figure 6a and b shows that the CSNS back-n produces higher dark



**<**Fig. 5 (Color online) Dark signal distribution and PKA energy spectra for CSNS back-n and XAPR neutron (irradiation fluence:  $1 \times 10^{11} \text{ n/cm}^2$ ). **a** Dark signal distribution of CIS1 with integration time 10.25 ms; **b** dark signal distribution of CIS1 with integration time 20.51 ms; **c** dark signal distribution of CIS1 with integration time 5.13 ms; **d** dark signal distribution of CIS1 with integration time 10.25 ms; and **e** PKA energy spectra for CSNS back-n and XAPR neutron

signal value pixels than the XAPR neutrons. In addition, the number of pixels with high dark signal values produced in CIS2 was greater than that produced in CIS1, which may be affected by the pixel structure of these two types of CISs. The 3D dark signal spikes of CIS1 before and after neutron irradiation are shown in Fig. 6c. The neutron irradiation fluence is  $1 \times 10^{11}$  n/cm<sup>2</sup>. Figure 6 shows that more high dark signal spikes of CIS1 are observed after CSNS back-n irradiation than after XAPR neutron irradiation. This result also agrees with the results presented in Fig. 5a–d.

The atomic number and energy of the PKA would have a significant effect on the degree of damage to pixels. Generally, after CSNS Back-n and XAPR neutron (with an average energy of several mega electron volts) irradiation, the main types of PKAs are Si ions. For the CSNS Back-n with a wide energy range, the probability of generating a high-energy PKA is greater than that of reactor neutrons (as shown in Fig. 5e). A high-energy PKA produces a high density of defects and causes severe damage. Therefore, the output signal in the CSNS Back-n with a thermal pixel greater than 1500 or 2000 DN is significantly higher than that of the XAPR neutron.

The mapping of the output signal of CIS1 after CSNS back-n irradiation and schematic of radiation damage in pixel of CIS1 are shown in Fig. 7. A dark signal of  $51 \times$ 51 pixels is presented, with a neutron irradiation fluence of approximately  $1 \times 10^{11}$  n/cm<sup>2</sup>. Pixels of different colors represent different dark signals. Figure 7 shows that after neutron irradiation, different CIS pixels are subjected to different levels of radiation damage. In addition, some pixels remain undamaged by neutrons. The difference in dark signal from the damaged pixels of the CIS is primarily due to two aspects. First, the interaction between neutrons and the material results in different PKA energies that cause damage, and second, the same pixel is irradiated by multiple neutrons during the accumulation of a neutron irradiation fluence of  $1 \times 10^{11}$  n/cm<sup>2</sup>. In this irradiation experiment, the CIS is unbiased, and single-displacement damage is negligible. Fortunately, similar results were observed during an in situ radiation test of CCD [30].

Further, in situ CIS radiation tests will be conducted in our future studies.

# **5** Discussion

The CIS includes a programmable gain amplifier (PGA) array, a low-power analog-to-digital converter array, a serial periphery interface, and eight low-voltage differential signaling channels. In neutron radiation environments, TID effects are induced by accompanying gamma rays or PKAs. It is crucial to determine whether these devices are damaged by the TID after neutron radiation to analyze the degradation of the dark signal. Therefore, the conversion gain (CVG) of a CIS is measured after neutron irradiation. The CVGs of CIS1 and CIS2 remain almost unchanged before and after exposure to CSNS Back-n and XAPR neutrons [31, 32], indicating that the damage is mainly induced by the DDD effects in the pixel arrays of the CIS.

In addition, neutron irradiation in a CIS creates various defects, including point and clustered defects, in the SCR of pixels. These defects introduce energy levels within the Si bandgap and enhance thermal generation processes. There is a relationship that exists between the probabilities of generating both high-energy PKAs and neutron energy. In general, as neutron energy increases, the probability of generating high-energy PKAs also increases. This is because highenergy neutrons have high momentum and kinetic energy, which can interact with surrounding atomic nuclei, generating high-energy PKAs. As the energy of the PKAs increases, the probability of cascade collisions gradually increases, causing defects to transition from point defects to defect clusters by irradiation. This transition changes the energy levels of the defects, influencing different energy levels of device performance in various ways [33]. Generally, defects located in the middle energy level of the forbidden band have the greatest impact on the device. Therefore, the types of defects generated by neutrons of different energies may vary. In future studies, we will investigate the energy-level positions and activation energies of defects in pixel arrays produced by neutrons of varying energies.

The effects of neutron radiation on CISs have also been employed to evaluate displacement damage induced by protons in the space environment. The different results from CSNS back-n and XAPR neutrons show that similar results may be found in neutron and proton irradiation experiments with different energies. Similar results were observed in proton irradiation experiments with different energies. Therefore, further experiments should be conducted to investigate this phenomenon.



**Fig.6** (Color online) Frequency of higher dark signal value pixels in CIS1 and CIS2 after neutron irradiation (irradiation fluence:  $1 \times 10^{11}$  n/cm<sup>2</sup>). **a** Frequency of hot pixels with dark signal >1500;

**b** frequency of hot pixels with dark signal >2000; **c** 3D dark signal spikes of CIS1 before and after neutron irradiation (only 128×128 pixels are presented)



Fig. 7 (Color online) Mapping of output signals of CIS1 and the schematic of radiation damage in pixel of CIS1

# 6 Conclusion

This study focused on examining the impact of displacement damage on the dark signal of CIS when exposed to CSNS back-n and XAPR neutrons. Both experimental and simulation methods were employed to investigate the variations in the mean dark signal, DSNU, and dark signal distribution caused by the two neutron sources. The Geant4 simulation tool was used to calculate the NIEL and PKA spectra of Si. The results revealed that the NIEL values followed the trend NIEL<sub>1MeV</sub> > NIEL<sub>CSNS</sub> > NIEL<sub>XAPR</sub>.

The mean dark signal is directly correlated with the DDD. However, it is noteworthy that the DSNU of CIS following CSNS back-neutron irradiation exceeds that of CIS exposed to XAPR neutron irradiation. Higher neutron energies at the same DDD level may lead to a more pronounced DSNU and elevated hot pixel values. Therefore, relying solely on the equivalent DDD for DSNU evaluation is insufficient. Additionally, variations in the dark signal distribution were observed, revealing three distinct regions that aligned with the predicted PKA distributions obtained through Geant4 simulations. These findings are crucial for assessing the impact of displacement damage on CIS. Future studies will involve more experiments and simulations to provide an indepth analysis of the displacement damage effect on DSNU and the dark signal distribution of the CIS.

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**Data availability** The data that support the findings of this study are openly available in Science Data Bank at https://cstr.cn/31253.11. sciencedb.j00186.00071 and https://www.doi.org/10.57760/sciencedb.j00186.00071.

## Declarations

**Conflict of interest** The authors declare that they have no conflict of interest.

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