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# Wavelength-selective synaptic devices based on Graphdiyne/WSe<sub>2</sub> for multi-color image recognition and neuromorphic computing

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## ABSTRACT

Graphdiyne (GDY)/two-dimensional materials (2DMs) heterostructures present unique opportunities for advanced optoelectronic and neuromorphic devices because of their exceptional electrical, optical, and structural properties. However, the traditional methods for construction of GDY/2DMs heterostructures usually lead to inferior interfaces, which seriously affects the charge separation and transport. Herein, an *in situ* approach for growing GDY nanowalls (NWs) on WSe<sub>2</sub> is employed in this work. The as-prepared GDY NWs/WSe<sub>2</sub> heterostructure exhibits self-powered broadband photodetection across 405–980 nm with a high responsivity of 2176 A/W and detectivity of  $3.6 \times 10^{12}$  Jones at 532 nm under 0.02 mW/cm<sup>2</sup> illumination, significantly outperforming previously reported GDY-based devices. The efficient charge separation and strong photocarrier trapping in the GDY NWs/WSe<sub>2</sub> heterostructure result in pronounced short-term and long-term synaptic plasticity. The nonlinear, wavelength-dependent reservoir state separation enables clear distinction of multiple pulse sequences, which shows great potential for logic processing. The successfully resolved red, green, and violet patterns, and one-shot color image recognition of a 5-letter image highlight transformative potential of GDY NWs/WSe<sub>2</sub> device for future adaptive imaging and neuromorphic computing technologies.

## 1. Introduction

Vast amounts of data generated in Artificial Intelligence drive demand for high-performance memory and processor devices [1]. Traditional Von Neumann computers are limited by restricted computational speed and increased energy consumption due to the physical separation between processing and memory units [2,3]. Neuromorphic computing, inspired by the human brain, provides notable benefits in tasks involving complex learning, recognition, perception, and memory. These include superior fault tolerance, rapid computation, and extremely low power consumption [4–7]. Optical synaptic devices that merge optical signal sensing with synaptic capabilities in one unit are particularly attractive for neuromorphic systems [8,9].

Two-dimensional materials (2DMs) with ultrathin structures and highly tunable optoelectronic properties have shown great potential in

optoelectronic neuromorphic devices [10–14]. To further amplify the synaptic response, 2DMs-based heterostructures have been widely constructed to improve light absorption and enhance carrier trapping capability at the heterogeneous interface [15–17]. Owing to the highly  $\pi$ -conjugated structure [18–20], uniformly distributed pores [21], abundant charge trapping sites [22], high carrier mobility [23], tunable direct bandgap [24], and remarkable mechanical flexibility [25], graphdiyne (GDY) has enabled the development of novel synaptic and memory devices based on GDY/ZnO [26], GDY/TiO<sub>2</sub> [27], MoS<sub>2</sub>/GDY [28], graphene/GDY [29], Pyr-GDY/graphene/PbS quantum dots (QDs) [30], GDY/GDY QDs [31] heterostructures, etc. GDY serves as light absorber layers, charge trapping layers, or ion storage layers in these devices [1]. However, the preparation of 2DMs/GDY is still limited to the orderly and quantitative deposition of GDY on the surface of metal foils via chemical vapor deposition, followed by wet transfer onto 2D

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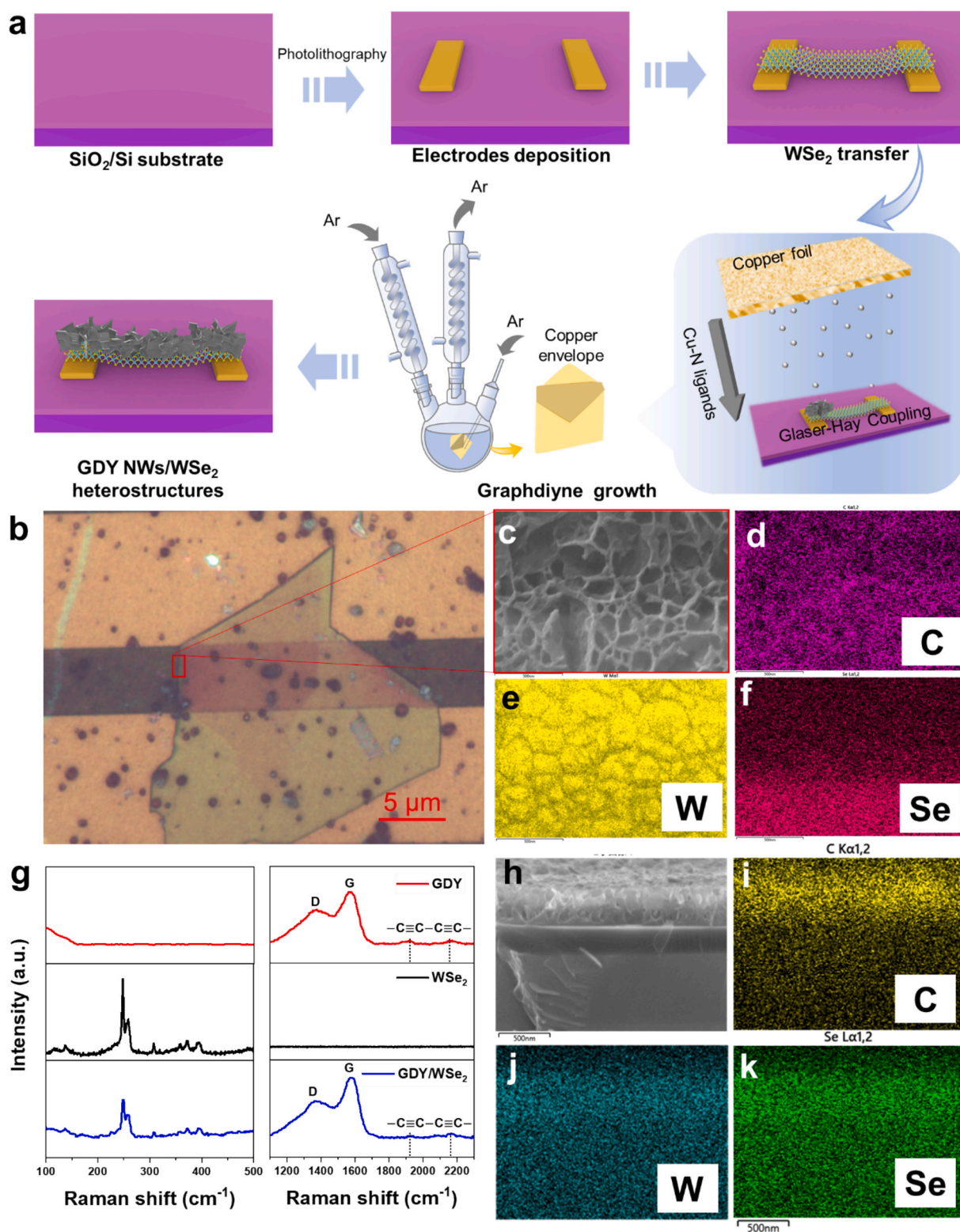
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material surfaces [32]. The processes inevitably introduce defects and folds, adversely impacting the charge transport of the heterostructures. Compared to the planar type of GDY, GDY nanowalls (NWs) with a high surface area can significantly enhance charge transfer, light absorption, and photogenerated carrier capture. Tungsten diselenide (WSe<sub>2</sub>) with an

indirect bandgap of  $\sim 1.2$  eV has bipolar transport behaviours [33]. The high carrier mobility and superior optical properties endow the WSe<sub>2</sub> based photodetector with a photoresponsivity of  $10^{-1}$  to  $10^5$  A/W in the visible range [34–36]. However, the study on 2DMs/GDY NWs hetero-junctions is elusive [37,38].



**Fig. 1.** Characterization of as-fabricated GDY/WSe<sub>2</sub> heterostructures. (a) Synthesis of GDY NWs on WSe<sub>2</sub> above SiO<sub>2</sub>/Si substrates via copper envelope catalysis. (b) Optical image of GDY/WSe<sub>2</sub> heterostructures. (c) SEM images of GDY/WSe<sub>2</sub>. (d-f) Elemental mapping of carbon (C), tungsten (W) and selenium (Se) by EDS. (g) Raman of intrinsic GDY, WSe<sub>2</sub>, and GDY/WSe<sub>2</sub> heterostructure; (h) Cross-sectional SEM images of GDY/WSe<sub>2</sub>. (i-k) Elemental mapping of C, W and Se by EDS.

With this in mind, GDY NWs were *in situ* grown on WSe<sub>2</sub> surface to form GDY NWs/WSe<sub>2</sub> heterostructure. The device exhibits exceptional self-powered photodetection performance across a wide wavelength range from 405 nm to 980 nm, achieving a high photodetection responsivity of 2176 A/W and detectivity of  $3.6 \times 10^{12}$  Jones under green light. The retinomorphic device exhibits stable photo-responsivities across the red, green, and violet spectra, positioning it as a promising candidate for in-sensor 4-bit encoding and the processing of images via convolutional neural networks (CNNs). A configurable CNN with diverse convolution kernels is successfully implemented for multi-color image processing tasks with 100 % classification accuracy for colored letters. This accomplishment highlights the potential of *in-situ* construction of GDY heterostructures for in-sensor computing, offering new perspectives for developing neuromorphic vision sensors tailored for diverse applications.

## 2. Results and discussion

### 2.1. GDY/WSe<sub>2</sub> Characterization

Fig. 1a illustrates the preparation process of the GDY NWs/WSe<sub>2</sub> heterostructure devices using a copper-encapsulation catalytic strategy. In brief, mechanically exfoliated WSe<sub>2</sub> on pre-patterned electrodes was wrapped in copper foil and immersed in a solution containing pyridine, acetone, hexaethynylbenzene (HEB), and N,N,N',N'-tetramethylethylenediamine (TMEDA) [37]. After heating at 50 °C for 12 h, the GDY NWs/WSe<sub>2</sub> heterostructure was prepared on the target substrate. The morphology of GDY NWs/WSe<sub>2</sub> was characterized using optical microscopy (Fig. 1b) and scanning electron microscopy (SEM) (Fig. 1c). SEM images from the red-box inset in Fig. 1b are shown in Fig. 1c-f and Fig. S1. 3D honeycomb-shaped GDY is clearly observed on the WSe<sub>2</sub> surface. The corresponding energy dispersive spectroscopy (EDS) elemental mapping confirms the uniform distribution of carbon (C)

across tungsten (W) and selenium (Se) region. Cross-sectional SEM images (Fig. 1h-k) reveal the solid interface between GDY NWs (~300 nm thickness) and WSe<sub>2</sub>. Atomic force microscopy (AFM) determines that the thickness of WSe<sub>2</sub> is 60 nm (Fig. S2). The details of device fabrication methods and characterizations are provided in the Note 1 and Note 2 of supporting information. Raman spectroscopy was employed to explore interlayer coupling in the GDY/WSe<sub>2</sub> heterostructure (Fig. 1g). Two Raman peaks at 248 cm<sup>-1</sup> and 258.3 cm<sup>-1</sup> are observed for WSe<sub>2</sub>. Four significant peaks at 1378.2, 1573.8, 1930.6, and 2180.7 cm<sup>-1</sup> in GDY are aligned with previously reported values [39]. For the GDY/WSe<sub>2</sub> heterostructure, the D, G, and diacetylene peaks located at 1377.8, 1580.8, 1932.6, and 2171.5 cm<sup>-1</sup> reveal the characteristics of GDY. Two peaks at 248.2 cm<sup>-1</sup> and 257.1 cm<sup>-1</sup> with lower intensity, indicate that the WSe<sub>2</sub> is underneath GDY. The slight shift in the WSe<sub>2</sub> peak confirmed the formation of high-quality heterointerfaces.

### 2.2. Optoelectronic characterizations

The current–voltage ( $I_{ds}$ - $V_{ds}$ ) characteristics of GDY, WSe<sub>2</sub> and GDY/WSe<sub>2</sub> were measured under dark and illuminated conditions (Fig. 2b, c). Unlike pristine NWs with no significant response, the increased current in WSe<sub>2</sub> and GDY/WSe<sub>2</sub> heterostructures exhibit a photovoltaic (PV) effect and a high light-to-dark current ratio of  $10^3$  at  $V_{ds} = 0$  V. To further measure the detection range, the device was tested under 1 mW/cm<sup>2</sup> laser power density ( $P_{in}$ ) at 405, 532, 635, 780, 880, and 980 nm. The upshift under illumination illustrates the self-powered broadband photodetection capability of GDY/WSe<sub>2</sub> (Fig. 2d). Notably, the heterostructure achieves an outstanding responsivity of 2176 A/W at  $V_{ds} = 1$  V and  $P_{in} \approx 0.02$  mW/cm<sup>2</sup>, significantly surpassing previously reported GDY-based photodetectors [40]. Because of the decreased scattering and recombination, the photoresponsivity ( $R$ ) linearly declines with increasing  $P_{in}$  (Fig. 2e) [28]. The corresponding external quantum efficiency (EQE) and detectivity ( $D^*$ ) are calculated to be  $5.1 \times 10^6\%$  and

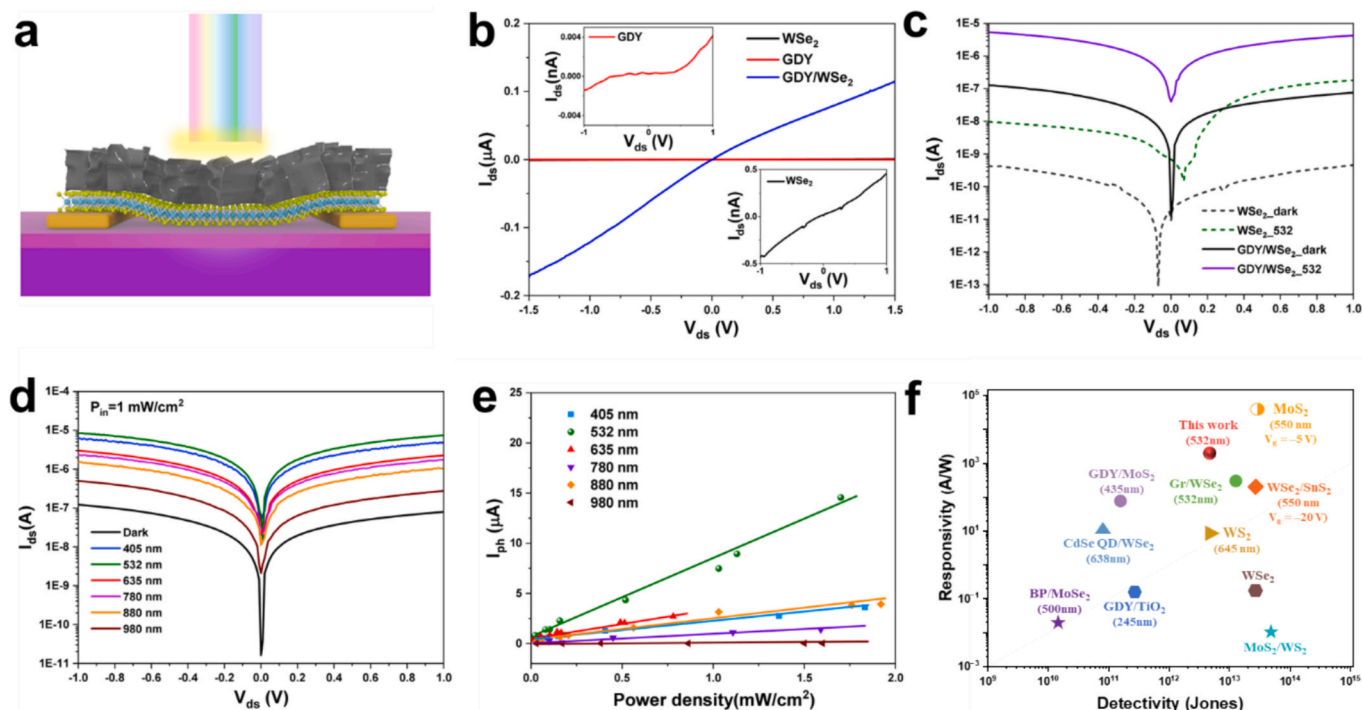
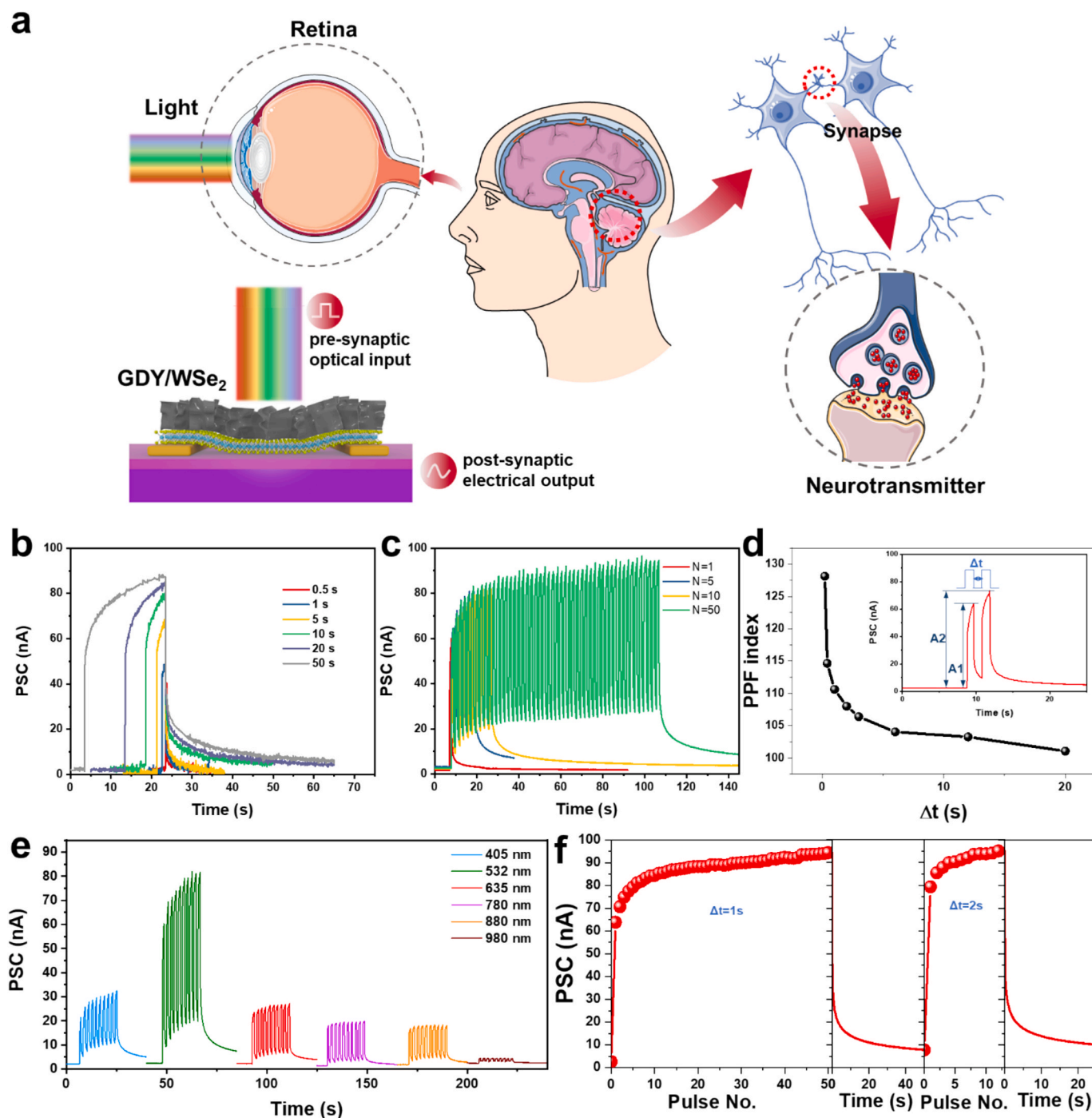


Fig. 2. Optoelectronic characteristics of the optical synapse based on the GDY/WSe<sub>2</sub> heterostructure. (a) Schematic diagram of GDY/WSe<sub>2</sub> device under illumination; (b)  $I_{ds}$ - $V_{ds}$  curves of GDY, WSe<sub>2</sub> and GDY/WSe<sub>2</sub> under dark. (c)  $I_{ds}$ - $V_{ds}$  curves of WSe<sub>2</sub> and GDY/WSe<sub>2</sub> under dark and 532 nm with laser power density ( $P_{in}$ ) of 1 mW/cm<sup>2</sup>. (d)  $I_{ds}$ - $V_{ds}$  curves of GDY/WSe<sub>2</sub> in dark, and illuminated at 405, 532, 635, 780, 880, and 980 nm. (e) Wavelength-dependent photocurrent ranging from 405 to 980 nm at  $V_{ds} = 1$  V at various laser power densities. (f) Comparison with previous reports based on GDY and TMDs photodetector in terms of responsivity and detectivity. Note: The detectivity and responsivity of MoS<sub>2</sub> and WSe<sub>2</sub>/SnS<sub>2</sub> devices are tested with gate bias ( $V_g$ ).

$3.6 \times 10^{12}$  Jones, at  $0.02 \text{ mW/cm}^2$  (532 nm), the best values among the GDY-based heterojunctions (Table S1, Note 3, Supporting information). Compared to GDY-based and 2DMs-based devices, the GDY/WSe<sub>2</sub> heterostructure exhibits simultaneous high responsivity, detectivity, and EQE at low  $V_{ds}$  without gate bias modulations (Fig. 2f).

We further explore the device's potential in simulating optical synaptic activities. As shown in Fig. 3a, applying a presynaptic optical signal generates a postsynaptic current (PSC,  $I_{ds}$ ), mimicking both long-

term and short-term synaptic plasticity. After the light pulse ceases, the current gradually stabilizes (Fig. 3b). Under a 50 ms optical pulse, the device shows a sharp current rise due to photogenerated carrier accumulation, followed by slow decay and prolonged relaxation time, indicating the short-term potentiation (STP) behavior [41]. The PSC increases significantly and stabilizes at an elevated level over time, marking the transition from STP to long-term potentiation (LTP). With continuous light input (i.e. 1, 5, 20 and 50 pulses), the PSC continues to



**Fig. 3.** Optical synaptic characteristics achieved by GDY/WSe<sub>2</sub> heterostructure devices. (a) Configuration illustration GDY/WSe<sub>2</sub> optoelectronic synapse, and brain-like visual perception and information transmission. (b) The current response to light pulses of varying durations ( $532 \text{ nm}$ ,  $1 \text{ mW/cm}^2$ ). (c) Current response induced by 1, 5, 10, and 50 light pulses ( $532 \text{ nm}$ ,  $1 \text{ mW/cm}^2$ ,  $1 \text{ s}$ ). (d) The PPF index versus the pulse interval ( $\Delta t$ ) for PSC. The inset indicates the PSC induced by two consecutive light pulses. (e) PSC response of GDY/WSe<sub>2</sub> heterostructure devices to light pulses at  $405$ ,  $532$ ,  $635$ ,  $780$ ,  $880$  and  $980 \text{ nm}$  wavelengths ( $1 \text{ mW/cm}^2$ ,  $1 \text{ s}$ ). (f) PSC changes in the memory process. Parts of the figure were drawn using Servier Medical Art licensed under a Creative Commons Attribution 3.0 Unported License (<https://creativecommons.org/licenses/by/3.0/>).

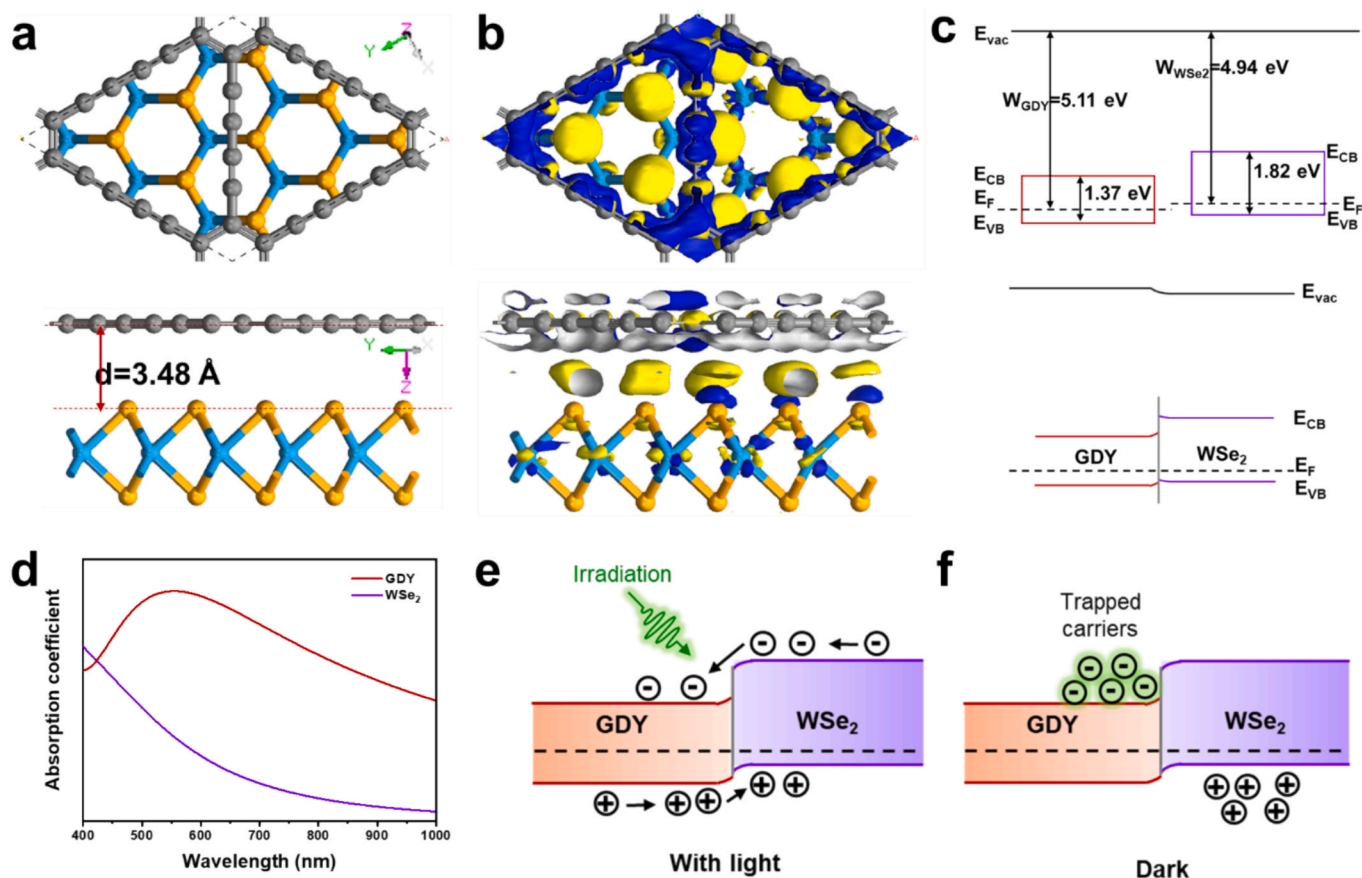
rise, facilitating the transition (Fig. 3c). The transition is driven by carrier migration from shallow to deep traps [42,43]. This mechanism resembles biological synapses where sustained stimulation releases more neurotransmitters [44]. The paired-pulse facilitation (PPF) index decreases exponentially with increasing time intervals ( $\Delta t$ ) (Fig. 3d), reflecting the dynamic filtering properties of biological synapses during information transmission. The highest synaptic response occurs at 532 nm, consistent with the previous photocurrent-wavelength trends (Fig. 3e). It is noted that our device enters a deep trap state under all three laser types, with synaptic responses influenced by trap center density. Therefore, the device shows decent synaptic response at 405 nm laser despite low absorption.

To evaluate the memory properties, a “learning-forgetting-relearning” test was conducted to simulate human memory processes (Fig. 3f). After 50 pulses, synaptic weight gradually increases but decays upon stimulation removal, indicating spontaneous forgetting of the post-synaptic current. Upon a second stimulation (2 s interval), only 10 pulses restore the original current level, exhibiting slower post-stimulus decay. This phenomenon parallels the cognitive process wherein humans require less time to relearn forgotten information, and such relearning significantly enhances memory stability. Furthermore, we irradiated under 532 nm laser at  $1.17 \mu\text{W}/\text{cm}^2$  for 40 h to investigate the operation stability of the device (Fig. S3). As demonstrated in Note 4 of Supporting information, the device takes around 8 h to recover to the initial state. The post-storage analysis after several months reveals no significant degradation in device response, and the structure of the device is not found to be delaminated after dissecting the device, thereby validating robust long-term storage reliability. Consequently, the GDY/WSe<sub>2</sub> heterostructure integrates light-sensing, memory functionalities, and

practical applicability, thereby demonstrating suitability for neuro-morphic vision systems.

### 2.3. Mechanisms analysis

To gain deeper insight into the charge separation in the GDY/WSe<sub>2</sub> heterostructure, first-principles analysis was conducted (Fig. 4a). Detailed calculations are provided in Note 5 and Fig. S4 of the supporting information. As shown in Fig. 4b and Fig. S4, the significant charge transfer from WSe<sub>2</sub> to GDY establishes a built-in potential, aligning with the type-II band diagram of GDY/WSe<sub>2</sub> (Fig. 4c) as confirmed by Kelvin probe force microscopy (KPFM) (Fig. S5 and Note 6 in Supporting information). The higher Fermi level ( $E_F$ ) of WSe<sub>2</sub> drives electron diffusion into GDY, where defects trap carriers. The GDY NWs exhibit a high absorption coefficient at 532 nm, which is the main factor contributing to their peak photoresponsivity observed at this wavelength (Fig. 4d) [45,46]. The type-II band alignment in Fig. 4c promotes photogenerated carrier separation upon light pulse illumination. Thus, numerous excited electrons transferred from the conduction band of WSe<sub>2</sub> into GDY, while the built-in electric field at the GDY/WSe<sub>2</sub> interface simultaneously drives holes from GDY's valence band into WSe<sub>2</sub> (Fig. 4e). The conjugated  $\pi$  structures and C-O and C=O bonds on the edges of GDY (Fig. S6) enable mutual charge trapping [26,40,47]. Electrons accumulate in GDY while holes reside in WSe<sub>2</sub>, effectively slowing electron-hole recombination (Fig. 4f). Consequently, the GDY/WSe<sub>2</sub> heterojunction exhibits optoelectronic synaptic plasticity.



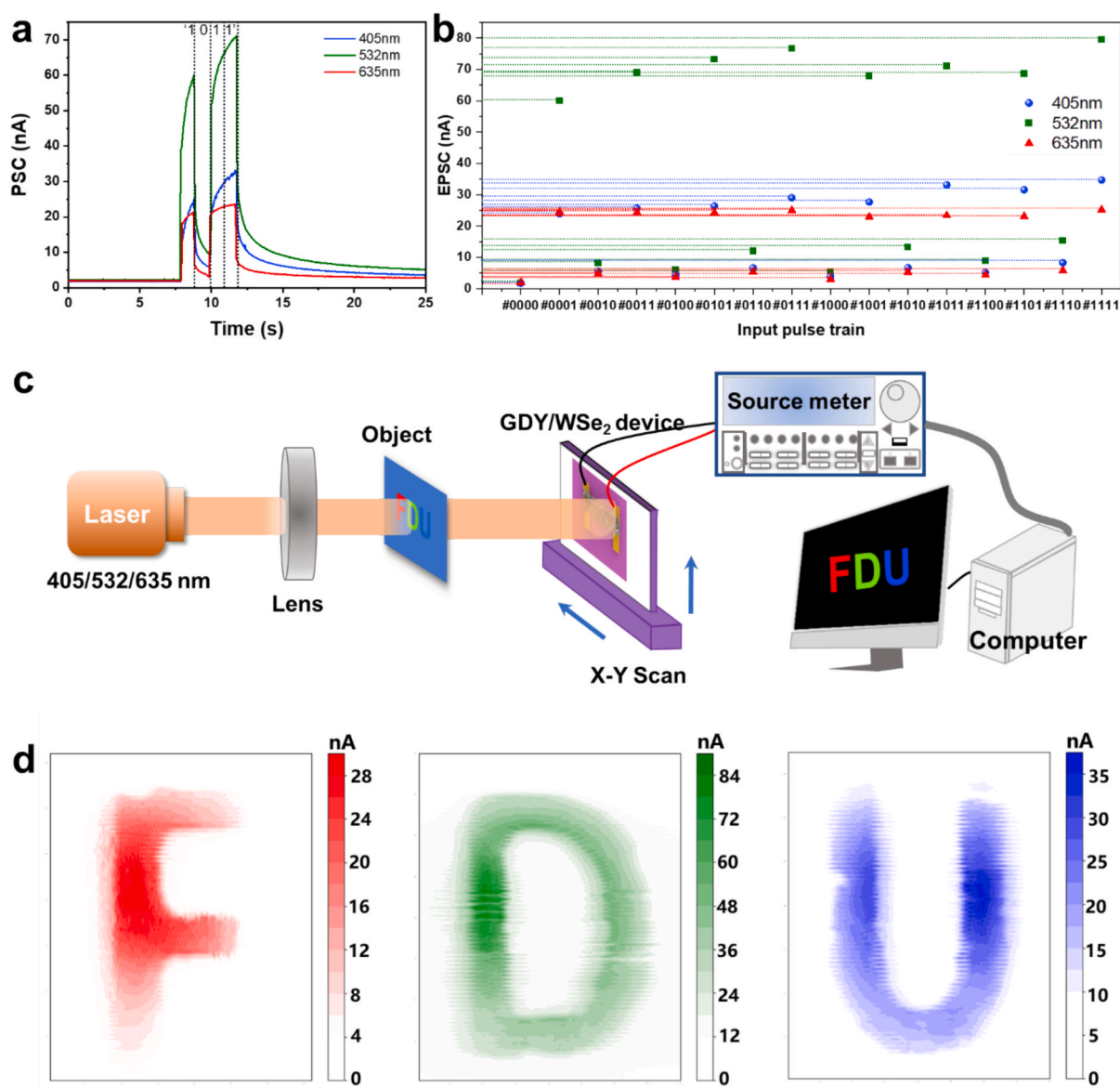
**Fig. 4.** Mechanism of the optoelectronic synaptic behavior in GDY/WSe<sub>2</sub> heterojunction. (a) Top and side view of GDY/WSe<sub>2</sub>. The W, Se, and C atoms are depicted in blue, yellow, and gray, respectively. (b) The charge density difference at GDY/WSe<sub>2</sub> interface, where the blue and yellow isosurfaces represent negative and positive charge densities, respectively. (c) Band diagram of GDY and WSe<sub>2</sub> before and after the contacts. (d) The adsorption coefficient of the GDY and WSe<sub>2</sub>. Band alignment of the GDY/WSe<sub>2</sub> heterojunction (e) with light irradiation, and (f) with light off.

## 2.4. Adaptive temporal specificity and image sensing

Time-input responses were further examined using 4-bit pulse sequences to investigate the GDY NWs/WSe<sub>2</sub>-based device's adaptive temporal specificity. Four consecutive pulses with varying trigger voltages were applied within each pulse period, with trigger-off (dark) and trigger-on (532 nm) states denoted as "0" and "1", respectively, generating 16 distinct pulse sequences. The distinct reservoir states indicate that laser wavelength modulation enables a broader and adjustable state range (Fig. 5a). The 16 distinct current outputs at varying wavelengths exhibit minimal overlap, demonstrating wavelength-dependent reservoir state generation (Fig. 5b). The transient photocurrent analysis in Fig. S7 reveals that the decay time at 635 nm, 780 nm, and 980 nm is within 1 s, suggesting the carriers occupy shallow trap states. In contrast, LTP under 405 and 532 nm irradiation is attributed to enhanced photogenerated carrier migration from shallow to deep traps. [48] The clear separation of inputs suggests that temporal signals are nonlinearly mapped to reservoir states, which enhances the potential for

further time-pulse sequence training and recognition (Fig. S8). This phenomenon stems from wavelength-dependent photogenerated carrier dynamics, including absorption coefficient, absorption depth, carrier generation, and recombination mechanisms, accumulating at trap centers and driving different reservoir dynamics. Such adaptive temporal characteristics enable the device to generate more output signals, effectively separating and expanding storage states for each time input.

A prototype visible-light imager utilizing a GDY NWs/WSe<sub>2</sub> device as an imaging pixel was demonstrated in Fig. 5c. A three-primary-color laser source illuminated a shadow mask engraved with letters "FDU". The device, mounted on a dual-axis XY precision displacement platform, scanned the image along x and y axes at 3.38 Hz (0.296 s/period). The multi-color images of "F" (red, 635 nm), "D" (green, 532 nm), and "U" (violet, 405 nm) were clearly observed in Fig. 5d. This single-pixel imager offers potential for multi-pixel imaging. Future integration with array fabrication and color-processing algorithms could enable full-color array sensors mimicking conventional cameras.



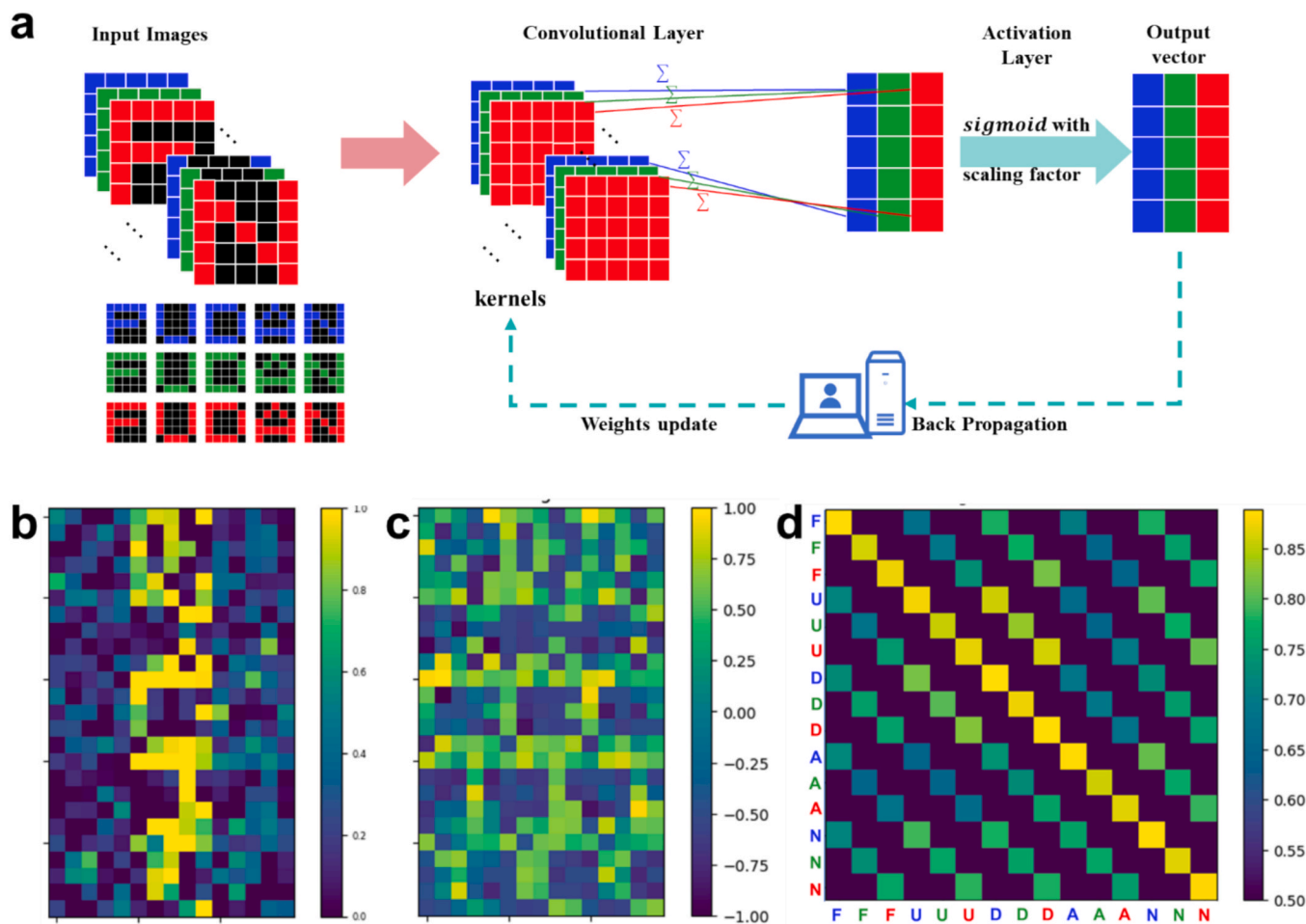
**Fig. 5.** Adaptive temporal specificity and image sensing of the GDY NWs/WSe<sub>2</sub> devices. (a) A typical pulse sequence of "1011" under different wavelength ( $V_{ds} = 0.01$  V,  $P_{in} = 1$  mW/cm<sup>2</sup>). (b) The EPSC responses to 16 different pulse trains for 4-bit separation and multiple reservoir states ( $\Delta t = 1$  s,  $V_{ds} = 0.01$  V,  $P_{in} = 1$  mW/cm<sup>2</sup>). (c) A schematic of the image scanning system, featuring three different light sources: red, green, and violet. (d) Corresponding image obtained by scanning the 'FDU' images with a single-pixel imager based on the GDY NWs/WSe<sub>2</sub>.

### 2.5. Image recognition capability

To evaluate its practical applications, the image recognition capability is investigated. A CNN classifier, composed of a 5-channel convolutional layer and activation layers, is constructed for multi-letter image recognition based on the  $I_{ph}-P_{in}$  curve under 405 nm (violet), 532 nm (green) and 635 nm (red) illumination. The number of channels in the convolutional layer corresponds to the number of input images, with each channel containing a kernel that extracts features from the input image. A sigmoid function with a scaling factor is employed as the activation function to ensure full value range accessibility during training during training. The dataset for training and testing comprises 15 letters, 'F', 'U', 'D', 'A' and 'N' in violet, green and red, represented as 3-channel images. The training dataset is expanded to 250 samples incorporating five Gaussian noise levels (Fig. 6a), while the testing dataset remains at 50 samples with level-1 noise. After 50 training epochs, the 15 images are used to train weights in corresponding kernels (Fig. 6b), followed by multi-channel processing to determine maximum recognition probability (Fig. 6c) of image recognition. Fig. S9 illustrates the CNN's training loss and accuracy under varying artificial noise levels. Consequently, the five letters in three colors are successfully classified, demonstrating the high-accuracy image recognition capability of the GDY NWs/WSe<sub>2</sub> device. Detailed calculations are provided in Note 7 of the [supporting information](#).

### 3. Conclusions

In summary, this study demonstrates the *in situ* synthesis of GDY NWs/WSe<sub>2</sub> heterostructures with remarkable optoelectronic and neuromorphic computing capabilities. The heterostructures deliver self-powered broadband photodetection from UV to NIR spectrum (405–980 nm) and achieve an exceptional responsivity of 2176 A/W and detectivity of  $3.6 \times 10^{12}$  Jones under green light at low power densities, surpassing previously reported GDY-based devices. The GDY NWs/WSe<sub>2</sub> devices mimic synaptic plasticity through short/long-term memory behaviors, essential for neuromorphic systems. The retinomorphic device exhibits stable photoresponse across red (635 nm), green (532 nm), and violet (405 nm) spectra, enabling in-sensor 4-bit encoding and multi-color image sensing. By implementing a configurable CNN with diverse convolutional kernels, we achieve 100 % accuracy in classifying the 5 letters 'F', 'U', 'D', 'A', and 'N' in three colors, demonstrating the high-accuracy image recognition capability of the GDY NWs/WSe<sub>2</sub> device. The wavelength-dependent reservoir state dynamics enable effective separation and processing of spatio-temporal signals, facilitating advanced tasks like and artificial neural network-based image recognition. With their superior photodetection, adaptive learning, and image sensing capabilities, these devices hold significant potential for future applications in neuromorphic computing, intelligent imaging, and wavelength-selective photodetection technologies.



**Fig. 6.** One-shot recognition of multi-letter image based on CNN under 405 nm (violet), 532 nm (green) and 635 nm (red) illumination. (a) The training process of image recognition for 15 target letters "FUDAN". (b) Data matrix of 5 letter images (noise level2). (c) Trained weight matrix (noise level2). (d) One-shot recognition of 15 letter images.

## CRedit authorship contribution statement

**Hongyu Tang:** Writing – original draft, Validation, Methodology, Formal analysis, Data curation, Conceptualization. **Weiqi Shi:** Visualization, Data curation. **Wanlin Jiang:** Validation, Methodology, Data curation. **Gaoyuan Wang:** Validation, Data curation. **Mengyuan Tang:** Visualization, Formal analysis. **Zihao Cai:** Data curation. **Ruiteng Li:** Data curation. **Shuai Wu:** Supervision, Investigation. **Guoqi Zhang:** Writing – review & editing, Supervision. **Jian Li:** Writing – review & editing, Validation, Supervision, Methodology, Data curation.

## Declaration of competing interest

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

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## Appendix A. Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.cej.2025.164215>.

## Data availability

Data will be made available on request.

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