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# Moving dynamics of a nanorobot with three DNA legs on nanopore-based tracks†

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DNA nanorobots have garnered increasing attention in recent years due to their unique advantages of modularity and algorithm simplicity. To accomplish specific tasks in complex environments, various walking strategies are required for the DNA legs of the nanorobot. In this paper, we employ computational simulations to investigate a well-designed DNA-legged nanorobot moving along a nanopore-based track on a planar membrane. The nanorobot consists of a large nanoparticle as the robot core and three single-stranded DNAs (ssDNAs) as the robot legs. The nanopores linearly embedded in the membrane serve as the toeholds for the robot legs. A charge gradient along the pore distribution mainly powers the activation of the nanorobot. The nanorobot can move in two modes: a walking mode, where the robot legs sequentially enter the nanopores, and a jumping mode, where the robot legs may skip a nanopore to reach the next one. Moreover, we observe that the moving dynamics of the nanorobot on the nanopore-based tracks depends on pore-pore distance, pore charge gradient, external voltage, and leg length.

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#### 1. Introduction

In living organisms, the operations of many cellular functions, such as organelle transport and synthesis, rely significantly on the dynamics of biomolecular motors. 1,2 Typical examples include kinesin, dynein, and myosin that can transport various cellular cargoes along cytoskeletal tracks.3,4 Inspired by the natural motors, many artificial biomolecular nanodevices have been synthesized to accomplish specific tasks in the nano-/micro-world.<sup>5,6</sup> The DNA molecule is one of the most important building blocks for constructing these nanodevices due to its easily programmable sequence and welldefined base pairing rule.7-9 Various DNA-based nanostructures, such as DNA switches, 10,11 DNA tweezers, 12,13 DNA rotors, 14,15 DNA carriers, 16,17 and DNA walkers, 18,19 have been designed and shown promising potentials in applications, biosensing, 20-22 diagnostics, 23-27 including therapeutics. 28-30

To achieve complex nanomechanical tasks, it is often necessary to combine the functions of multiple types of the

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† Electronic supplementary information (ESI) available: Detailed descriptions for the force-field of our CG model (section S1); snapshots before state F2 for the selected jumping event (section S2); another type of jumping mode (section S3); nanorobot moving on the nanopores with high charge densities (section S4); parameters of the CG model for the nanorobot (Table S1); energy parameters of the energy potentials (Table S2); simulation data shown in Fig. 4–6 and 8 (Tables S3–S6). See DOI: https://doi.org/10.1039/d3nr03747a

DNA nanomachines. A novel example is the DNA nanorobot,<sup>6</sup> which integrates the DNA carrier and walker functions to transport cargoes (such as nanoparticles<sup>31</sup> and DNA fragments<sup>32</sup>) from a donor location to a receiver location. A recently reported cargo-sorting DNA nanorobot,<sup>33</sup> which consists of three single-stranded DNA (ssDNA) domains (building blocks), can use one ssDNA domain like a hand to load two types of molecular cargoes at arbitrary locations, and then use the other two ssDNA domains like feet to walk randomly on a track, until the cargoes are successfully unloaded at specified destinations.

The design of different walking tracks is advancing in parallel with the development of the DNA nanorobot, expanding the range of applications for these nanomachines in various environments.34 Currently, walking tracks can be classified one-dimensional (1D) tracks, such as carbon nanotube31,35 and double-stranded DNA backbone36; twodimensional (2D) tracks, such as DNA paper origami33,37 and inorganic surface; 38,39 and three-dimensional (3D) tracks, such as nanoparticle surface40-42 and cell membrane43. Based on these tracks, one of the most widespread mechanisms used to move the DNA-legged nanorobot is the strand displacement approach. 44,45 In this approach, one walking step of the nanorobot starts by unzipping the old duplex between a DNA foot of the nanorobot and a foothold (a DNA/RNA strand complementary to foot domain) on the track and ends by forming a new duplex between the released foot and another foothold. 46,47 The strand displacement reactions can be controlled by additional molecular ligands, 48 metal ions, 49 pH values, 50 and other factors, 51-54 allowing for the manipulation of the nanoro-

bot movements. Whereas, unintended displacement interactions between robot feet and track footholds will reduce the moving efficiency of the nanorobots. 55,56 Moreover, the nanorobot-track systems will be contaminated by the additional molecules, which can limit the functions of the DNA-legged nanorobots.45 Therefore, new moving strategies beyond the strand displacement approach are desirable.

Nanopores have shown promising potential in controlling the dynamics of nanomachines.<sup>57</sup> In fact, the nanopores are initially developed for sensing biomolecules such as nucleic acids. 58-62 Nanopore-based sensing is a label-free, single-molecule, high-throughput analysis technology that relies on the current signal produced by the translocation of nucleic acids through a nanopore. 63 To improve resolution of the current signal, the translocation dynamics of the nucleic acids should be manipulated.<sup>64</sup> Utilizing a multiple-nanopore platform is an effective approach 65,66 that provides opposite driving forces for a nucleic acid. This "tug-of-war" effect can lead to a more prolonged retention of the nucleic acid inside the nanopores, resulting in a clearer and longer current signal output. 67,68 The rapid development in nanopore fabrication technologies<sup>69,70</sup> has made it possible to independently adjust the sizes<sup>71,72</sup> and surface charges<sup>73,74</sup> of the nanopores. Therefore, the moving direction and speed of the trapped nucleic acid can be manipulated by the multiple-pore device.<sup>75</sup>

Due to their ability to control the movements of the nucleic acids, the multiple-nanopore systems can be used to manipulate the walking of the DNA-legged nanorobots. In a proof-of-principle research, <sup>76</sup> a nanoparticle-DNA assembled nanorobot with four ssDNA legs is powered to move by four nanopores placed in the corners of a square on a planar membrane. Each robot leg is captured by a corresponding nanopore, and the fuel to move the nanorobot is generated by the nanopores with distinct charges. It has also been demonstrated that this nanorobot can walk on the nanopore-based track by adjusting the direction and magnitude of the external voltage across the nanopores.<sup>77</sup> In the non-autonomous walking process, the external voltage is artificially changed to control the movement of the DNA legs, leading them to leave the old toeholds (nanopores) for new ones. Based on the chemical reaction-free driving mechanism, the multiple-nanopore device provides the DNA-legged nanorobots with a clear and stable working environment, facilitating the accomplishment of their complicated tasks. However, it is still challenging to realize the autonomous walking of the nanorobot along the nanoporebased track.

In this article, we theoretically design a nanorobot with three ssDNA legs that can autonomously move along the nanopore-based tracks by using computational simulations. Specifically, when two ssDNA legs of the nanorobot are trapped in the nanopores, the third leg can enter another nanopore to generate an additional force for the nanorobot, which drags the lagging leg to leave its original nanopore for a new one. We observe two moving modes of the nanorobot on the nanopore-based track, a stepwise walking mode, in which the legs enter the nanopores one by one, and a jumping mode, in which the legs skip a nanopore to directly find the next one.

Additionally, we study the moving dynamics of the nanorobot under various influencing factors, such as the distances between pores, pore charge gradients, and external voltages, ssDNA leg lengths.

#### 2. Simulation model and methods

#### 2.1. Coarse-grained model in simulation

In this paper, we study the moving dynamics of the nanorobot with DNA legs on the nanopore-based track by using computational simulations. The simulation model is composed of two main components: the nanorobot with three legs (see Fig. 1A) and the membrane with four nanopores (see Fig. 1B and C).

As shown in Fig. 1A, the nanorobot consists of a nanoparticle (as the robot core) and three ssDNA chains (as the robot legs). The nanoparticle is represented as a large spherical bead NP (red). The ssDNA legs are three polythymines, each having the same number of nucleotides (nts). In experimental settings, the ssDNA legs can be attached to the nanoparticle covered by thiol group or streptavidin, and the number of legs can be controlled through atomic force microscope by removing the redundant legs. 77,78 In order to improve efficiency of the simulation, we use our recently developed coarse-grained (CG) model to describe the ssDNA chains. 79,80 The CG model employs three bead types, namely P (green), S (orange), and B (blue), which correspond to the atomic groups phosphate, sugar, and base thymine, respectively, within each nucleotide. The mass of each bead is equal to the total mass of its corresponding atomic group, and the bead radius is determined by considering the hydration effects.<sup>81</sup> In addition, we adopt a CG effective charge model for the nanorobot in the single salt NaCl solution, with only bead P carrying an effective negative charge -Qe, where  $Q \approx 0.615$  is the Manning constant, 82,83 and other beads (B, S, and NP) being neutral. The parameters of the nanorobot model can be found in Table S1 of the ESI.† Here we should note that although the nanorobot legs are only considered as the polythymines, the simulation results are still qualitatively applicable to other types of ssDNA legs, such as polyadenines and polyguanines, since they have the similar environment-dependent conformations<sup>84,85</sup> and nanopore-based translocation dynamics.86,87

As shown in Fig. 1B and C, an infinitely large membrane is placed at the y-z plane to divide the entire simulation box into two chambers of the same size. The membrane is composed of two planar walls. Four nanopores (I-IV) embedded into the membrane distribute in a line along the y-direction with a pore-pore distance  $D_p$  within the range of [48 Å, 96 Å]. The walls and nanopores are constructed using wall beads (gray) and pore beads (yellow) of the same radius (also see ESI Table S1†). The nanopores serve as the toeholds for the robot legs. To ensure that each nanopore accommodates only one robot leg and prevents the nanoparticle from passing through, we set the nanopore diameter to  $d_p = 12 \text{ Å}$ . Moreover, the nanopore length is fixed as  $L_p$  = 90 Å to allow that most nucleotides

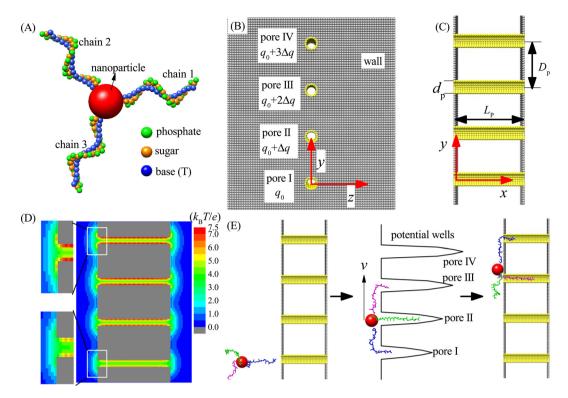


Fig. 1 (A) The coarse-grained representation of the nanorobot with three ssDNA legs. The nanoparticle, bead P (phosphate), bead S (sugar), and bead B (base thymine) are colored in red, green, orange, and blue, respectively. (B and C) The 2D sketches of the multi-nanopore platform viewed from the x-direction (B) and z-direction (C). The walls and nanopores are built by gray and yellow beads, respectively. Here the bead charge of pore I is set to a fixed value of  $q_0$ , and a gradient  $\Delta q$  is introduced to bead charges from pore II to pore IV. In addition,  $d_p$ ,  $D_p$ , and  $L_p$  denote the pore diameter, pore-pore distance, and pore length (wall-wall distance), respectively. (D) A 2D electrostatic potential distribution at the x-y plane with z=0under  $q_0 = \Delta q = 0.25e$ . The zoom-in panels on the left clearly display the difference in electrostatic potentials between pore I and pore IV. (E) The schematic illustration of the three-legged nanorobot walking along the nanopore-based track under the free energy gradient produced by the charge gradient of nanopores. The three ssDNA legs are colored in blue, green, and magenta, respectively.

of one ssDNA chain can be hold by a nanopore. Despite significant advancements in nanopore fabrication technologies due to their growing applications, 88,89 producing tiny pores with small distances (≤96 Å) remains challenging. Nevertheless, recent utilization of electron beam shrinking technology has allowed the fabrication of a nanopore array with a given porepore distance.90 Furthermore, existing techniques, such as controlled breakdown, 91 electrochemical reactions, 92 and laser etching,93 can adjust the nanopores to ssDNA-compatible sizes. As a result, the realization of experimental multi-pore devices in the near future is plausible. Our proof-in-principle study can provide valuable insights for the future development of chemical reaction-free nanorobot movement.

The simulation box has dimensions of 300 Å, 540 Å, and 300 Å along the x, y, and z directions, respectively, with periodic boundary conditions applied to avoid the boundary effect. The entry center of pore I is defined as the coordinate origin of the three-dimensional (3D) box, i.e., (x, y, z) = (0, 0, 0)0). To activate the moving of the nanorobot without the chemical reactions, a gradient of free energy along the nanoporebased track is required. In this paper, we use a pore charge gradient to generate the free energy difference for the robot legs in the nanopores. Each pore bead of the pore I carries a fixed

positive charge  $q_0 = 0.25e$ , and the bead charges from pore II to pore IV increase by  $\Delta q$  to  $3\Delta q$  accordingly (see Fig. 1B). Fig. 1D shows the 2D electrostatic potential distribution at the x-y plane under the charge gradient of  $\Delta q = 0.25e$ . As a result, a gradient of potential wells is created due to the different ssDNA-pore attractions, which thus can power the nanorobot to move from pore I to pore IV, as shown in Fig. 1E.

#### 2.2. The model-matched CG potentials

In our CG model, four types of the virtual bonds are used to connect the neighbouring beads of the nanorobot. For each ssDNA chain, there are three virtual bonds P-S, S-P, and S-B. Moreover, the terminal nucleotide at 3' end of each ssDNA chain is anchored at the bead NP via the virtual bond S-NP. The model-matched potential energy for the nanorobot is given by:

$$U_{\rm CG} = U_{\rm lj} + U_{\rm b} + U_{\rm a} + U_{\rm d} + U_{\rm e}.$$
 (1)

The above CG potentials include volume excluded interaction  $(U_{li})$ , virtual bond interaction  $(U_b)$ , bond-bond angle potential  $(U_a)$ , dihedral potential  $(U_d)$ , and bead P-bead P electrostatic interaction  $(U_e)$ .

The detailed descriptions of the five potential terms in eqn (1) and the potential parameters are described in the ESI.† In brief, the volume excluded interaction  $U_{li}$  between two nonbonded beads, including the nanorobot beads and membrane beads, is described using a "12-6" Lennard-Jones potential; the three virtual bond-involved interactions  $U_{\rm b}$ ,  $U_{\rm a}$ , and  $U_{\rm d}$  account for chain connectivity and angular rotation of the ssDNA legs; the electrostatic interaction  $U_e$  is described by the Manning Counterion Condensation theory<sup>81</sup> that implicitly treats the ion effects. Especially, the energy parameters of the bondinvolved interactions are derived from the Boltzmann inversion80 of the corresponding structural probability distributions, which can be statistically obtained from the experimentally measured ssDNA structures. The simulation results of the current CG model for the ssDNA structures have been validated against the experiment results. 79,80

#### 2.3. Langevin dynamics simulation

In the simulations, the beads of the nanorobot (NP, P, B, and S) are movable, while the wall and pore beads are immobile. The dynamics of a nanorobot bead i is determined by Langevin equation:

$$\ddot{\vec{r_i}} = -\sum_i (\nabla U_{CG}) + F_{T} - \eta_i \dot{\vec{r_i}} - Qe\nabla(\phi + \varphi). \tag{2}$$

Here  $m_i$  and  $\vec{r}_i$  are the mass and position vector of the bead i, respectively.  $U_{\rm CG}$  expressed in eqn (1) is the interactions between the bead i and other beads (including other nanorobot beads, wall beads, and pore beads). The random force  $F_{\rm T}$  is Gaussian white noise with zero mean. The viscous force  $-\eta_i \vec{r}_i$  is mainly determined by the velocity  $\vec{r}_i$  of the bead i and the viscosity coefficient  $\eta_i$  is proportional to the bead radius according to the Stokes' formula. For simplicity, the viscosity coefficient  $\eta_P$  of the bead P is set as the unit in our simulations.

The last term in eqn (2) denotes the electric field force experienced by the charged beads in the nanorobot, which are induced by the external voltage and the pore charges. The electric field within the simulation box is influenced by the DNA charges when the nanorobot moves around. However, accounting for the effects of DNA charges on the electric field requires extremely significant computational resources, making it impractical for this study. Therefore, we assume that the electric field is independent of the DNA charges. Additionally, we do not consider the mobilities of the cations (Na<sup>+</sup>) and anions (Cl<sup>-</sup>) under the external voltage. 83 Consequently, the electroosmotic flow across the nanopore is neglected, which indicates that the ion distributions only depends on the pore charges. Therefore, the external voltage-induced electric potential  $\phi$  and pore charge-induced electric potential  $\varphi$  can be calculated separately.  $\phi$  is determined by Laplace equation:<sup>94</sup>

$$\nabla^2 \phi = 0. \tag{3}$$

The boundary conditions of the above equation are that  $\phi = 0$  and  $\Delta V$  beyond a distance of 60 Å away from the left wall and right wall of the membrane, respectively. In addition, the pore

charge-induced  $\varphi$  can be calculated from the Nonlinear Poisson–Boltzmann equation:  $^{95,96}$ 

$$\varepsilon_0 \epsilon \nabla^2 \varphi = -4\pi \left[ p_{\rm pc} + \sum_j z_j e c_j^{\ 0} e^{-z_j e \varphi/k_{\rm B} T} \right].$$
(4)

Here  $\varepsilon_0$  is the dielectric constant of a vacuum and  $\varepsilon$  (= 78.5 at room temperature) is the relevant dielectric constant of the solvent.  $p_{\rm pc}$  denotes the density of the pore charges. The subscript j represents the ion species (Na<sup>+</sup> and Cl<sup>-</sup>) and  $Z_j$  is the ionic valency.  $c_j^0$  (= 0.1 mol L<sup>-1</sup> for both Na<sup>+</sup> and Cl<sup>-</sup>) denotes the bulk concentration of the ion species j.  $k_{\rm B}$  and T are the Boltzmann constant and temperature. Both  $\phi$  and  $\varphi$  are solved on the cubic lattice with the lattice size 2 Å.

In our simulations, the length and energy units are set as  $\sigma_0$  = 1 Å and  $u_0$  = 1 $k_BT$  at the room temperature (T = 25 °C). The mass unit  $m_0$  is considered as the mass of bead P ( $m_P$  = 95 Da). Accordingly, the units of time and voltage are  $t_0 = \sqrt{m_0\sigma_0^2/u_0} = 0.62$  ps and  $V_0$  = 25.8 mV. The modified velocity-Verlet algorithm<sup>97</sup> is employed to solve the Langevin equation with a time step  $\Delta t$  = 0.001 $t_0$ .

#### Results and discussion

We will study the moving dynamics of the nanorobot by varying the pore–pore distance  $D_{\rm p}$ , the charge gradient  $\Delta q$ , the external voltage  $\Delta V$  (applied along x-direction), and the leg length N (the number of nucleotides). All data presented in this study are averaged from 100 samples, unless otherwise mentioned.

# 3.1. Successful probability of the nanorobot landing on the nanopore-based tracks

At the beginning of each simulation sample, we first equilibrate the conformation of the nanorobot for a sufficient long time (=  $10^7 \Delta t$ ) and then place the nanorobot near the membrane surface with one leg near the entry of the pore I (see Fig. 1E). Afterwards, the nanorobot is left to move freely. Because of the entropic barrier at the pore entry, the nanorobot may fail to land on the nanopore-based track and diffuse away from the membrane surface. If the distance between the nanorobot and the membrane surface is greater than 20 Å, we will reposition the nanorobot to its original location and restart this sample. The successful landing probability is defined as  $P_{\rm L} = 1/(1 + n_{\rm fail})$  with  $n_{\rm fail}$  as the number of failed attempts for the nanorobot landing on the nanopore-based track

Although the nanorobot is initially placed near the pore I, the neighbouring nanopore (pore II) is also involved in the landing process. If a robot leg has already entered the pore I, a longer pore–pore distance will result in a longer duration for the nanorobot to find the next pore. During the period, the leg already in the pore I may retreat back and the nanorobot can diffuse away. Therefore, we can observe that the successful landing probability  $P_{\rm L}$  decreases with an increase in the pore–

pore distance  $D_{\rm p}$ , as shown in Fig. 2A. On the other hand, if the neighbouring nanopore can provide a strong attraction for the robot legs, the nanorobot will be more likely to land on the nanopore-based track. As a result, a larger pore charge gradient  $\Delta q$  can lead to an increase in  $P_{\rm L}$ , as shown in Fig. 2B. In addition, as the external voltage applied along the x direction can effectively reduce the free energy barrier of the nanopores, we can find that  $P_{\rm L}$  increases with  $\Delta V$ , as shown in Fig. 2C. We also explore the leg length N-dependent landing probability, as illustrated in Fig. 2D. Since the possible number of conformations for a free ssDNA chain increases with the chain length, longer ssDNA legs entering the nanopore will experience a higher entropic barrier at the pore entry due to the loss of more possible conformations. Consequently, an increase in leg length N leads to a decrease in the landing probability.

After several unsuccessful landing attempts, the nanorobot eventually lands and successfully moves along the nanopore track, taking step-by-step movements similar to the strand displacement-based movement. Here, a step is defined as the distance traveled by the nanorobot from finding a pore to finding the next one. Therefore, the entire moving process, from pore I to pore IV, can be divided into three steps: step I–II (from pore I to pore II), step II–III (from pore II to pore III), and step III–IV (from pore III to pore IV). Since the nanorobot is initially placed near the pore I, the step I–II is incomplete. Therefore, our investigation of the moving dynamics of the nanorobot focuses on the main moving process, *i.e.*, the steps II–III and III–IV.

#### 3.2. Two moving modes of the nanorobot

Our simulation results reveal two main moving modes of the nanorobot: the walking mode (see Fig. 3A and B) and the jumping mode (see Fig. 3C and D). Fig. 3A shows a time-evolutional trace in the y-direction for the nanoparticle (robot core) in the walking mode. The nanoparticle moves towards the pore IV with forward-backward motions, which are strongly dependent on the states of the robot legs. During the main moving process (the steps II-III and III-IV), five special states are observed (see Fig. 3B). The first state, F2, occurs when leg2 (green) finds the pore II for the first time, while leg1 (blue) is already inside the pore I and leg3 (magenta) is diffusing outside. After the state F2, the leg2 may undergo several failed attempts to enter the pore II,98 requiring necessary conformational adjustment (see the mid-state after state F2). The subsequent state E2 occurs when the head nucleotide of the leg2 successfully enters the pore II without retreating back. Due to the attraction of the pore II, most nucleotides of the leg2 quickly enter the pore (see the mid-state after the state E2), dragging the nanoparticle to approach the pore II. Meanwhile, the leg3, which is still outside the nanopores, seeks its corresponding toehold. The state F3 describes the moment when the leg3 finds the pore III for the first time, which ends the step II-III and triggers the step III-IV. In the new moving step, the states E3 (that the leg3 successfully enters the pore III) and the state F4 (that the leg1 finds the pore IV) occur in order, similar to the states E2 and F3.

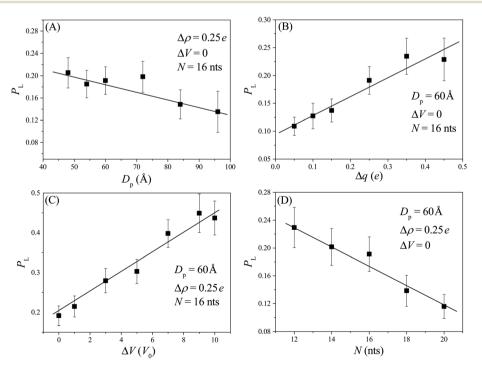


Fig. 2 The successful landing probability  $P_L$  of the nanorobot as a function of pore–pore distance  $D_P$  (A), pore charge gradient  $\Delta q$  (B), external voltage  $\Delta V$  (C), and the leg length N (D). The lines serve as a visual guide. It should be noted that the data point at  $D_p$  = 96 Å presented in panel (A) is an average of 40 samples due to the long computational time required.

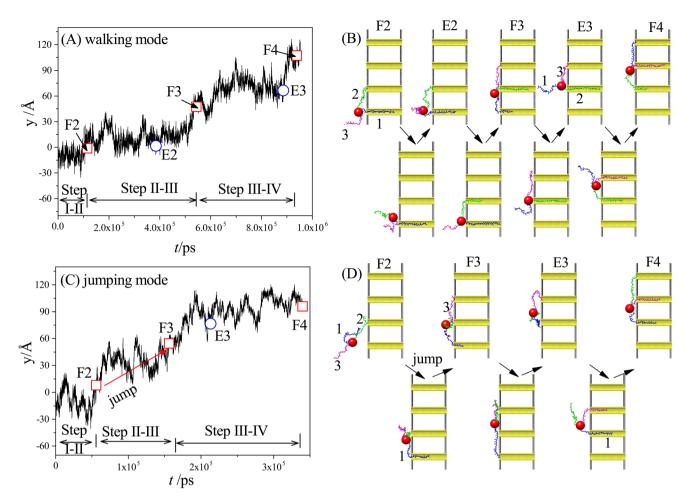


Fig. 3 (A and B) The time-evolutional trace along the *y*-direction (A) and the snapshots of the nanorobot states (B) for the walking mode. (C and D) The time-evolutional trace (C) and the corresponding snapshots of the nanorobot states (D) for the jumping mode. The leg1, leg2, and leg3 are colored in blue, green, and magenta, respectively. The states F2, F3, and F4 represent the moments when the ssDNA legs of nanorobot find the pore II, III, and IV, respectively, for the first time. The states E2 and E3 represent the moments that the legs enter the pore II and III, respectively, without retreating. Moreover, the snapshots between the F-states and the E-states represent the mid-states that the nanorobot adjusts its conformation, while the snapshots between the E-states and the F-states show the mid-states that the nanorobot moves forward.

By analyzing the time-evolutional trace and special states in the walking mode, we can find that the nanoparticle remains in close proximity to the pore entries during the conformational adjustment periods from the F-states to the E-states. However, the nanorobot is able to move forward along the nanopore-based track during the named forward-moving period between the E-states and the F-states.

Fig. 3C displaces the trajectory of the nanoparticle during a moving event in the jumping mode. In this selected event, a notable phenomenon observed in Fig. 3D is that leg1 leaves pore I when the state F2 occurs. The moving process of the nanorobot before reaching the state F2 is depicted in ESI Fig. S1.† After the state F2, the leg1 still has a chance to reenter the pore I (observed in the mid-state after the state F2). However, during this time, the leg3 directly finds the pore III before the leg2 can successfully enter the pore II (as shown in the state F3), giving rise to the absence of the state E2 in the step II–III. Subsequently, the states E3 and F4 occur sequen-

tially, completing the step III–IV. It is noteworthy that the jumping behavior also can be observed in the step III–IV of other jumping events, as depicted in ESI Fig. S2.†

To achieve the autonomous moving (in the walking and jumping modes) of the nanorobot, it is essential to pull the lagging leg (e.g. leg1 in state F3) out of its original nanopore. For a two-legged nanorobot, even if the leading leg inside the next nanopore can win the "tug-of-war", it can still be challenging to drag the lagging leg to leave its toehold. Therefore, a third leg is necessary to provide additional assistance in dragging the lagging leg. However, compared to the jumping mode, the walking mode might be more desirable as the robot core can dock with every nanopore for a while to accomplish its tasks such as drug releasing. In the following sections, we will further investigate the manipulation method of the nanorobot moving dynamics by varying the pore–pore distance  $D_p$ , the charge gradient  $\Delta q$ , the external voltage  $\Delta V$ , and the leg length N.

#### 3.3. Effects of the pore-pore distance $D_p$

As shown in Fig. 4A, the probabilities of the walking  $(p_w)$  and jumping  $(p_i)$  modes are highly dependent on the pore-pore distance  $D_{\rm p}$ . Here the charge gradient  $\Delta q = 0.25e$ , the external voltage  $\Delta V = 0$ , and the leg length N = 16 nts. At short  $D_{\rm p}$  (= 48 Å), almost all moving events select the jumping mode, as the 16 nts-long ssDNA chains are more likely to skip the neighboring nanopore and find a farther one. As  $D_p$  increases, the nanorobot moves in the walking mode more easily, leading to an increase in  $p_{\rm w}$ . When  $D_{\rm p} \ge 70$  Å, more than 95% of the moving events choose the walking mode. Moreover, we also find that the total moving time from the state F2 to the state F4 in the walking mode  $t_w$  is longer than that in the jumping mode  $t_i$  (see Fig. 4B). This is because the nanorobot in the walking mode needs to spend time on adjusting its conformation to enter the nanopores one by one, whereas in the jumping mode, this duration is saved in one of the moving steps.

In addition to the probabilities of the moving modes, the velocity  $\nu$  of the nanorobot moving on the nanopore-based track is also an important parameter for investigating its moving dynamics.<sup>39</sup> The nanorobot velocity is averaged from

all moving events, including both the walking and jumping modes, as v = D/t with D as the moving distance of the nanorobot and t as the total moving time from the state F2 to the state F4. We find that the nanorobot moves more slowly on the nanopore-based track as the pore-pore distance increases (see Fig. 4C), primarily due to the longer moving time t. The entire moving time t can be further divided into the conformational adjustment duration  $\tau_a$ , which contains the time intervals between the F-states and the E-states (state E2-state F3 and state E3-state F4), and the forward-moving duration  $\tau_f$ , which includes the time intervals between the E-states and the F-states (state F2-state E2 and state F3-state E3), i.e.,  $t = \tau_a + \tau_f$ . Notably, the entire duration of a jumping step, during which the nanorobot skips the conformational adjustment period to directly find the next nanopore (e.g. from state F2 to state F3 in Fig. 3D or from state F3 to state F4 in Fig. S2†), is added to the forward-moving duration in the jumping modes.

The simulation results of the  $D_p$ -dependent  $\tau_a$  (black squares) and  $\tau_f$  (red cycles) are presented in Fig. 4D. We find that  $\tau_a$  increases more rapidly than  $\tau_f$  as the pore-pore distance increases, indicating that the nanorobot will spend a majority of the moving time on adjusting its conformation at long pore-pore distance. During the forward-moving periods, the

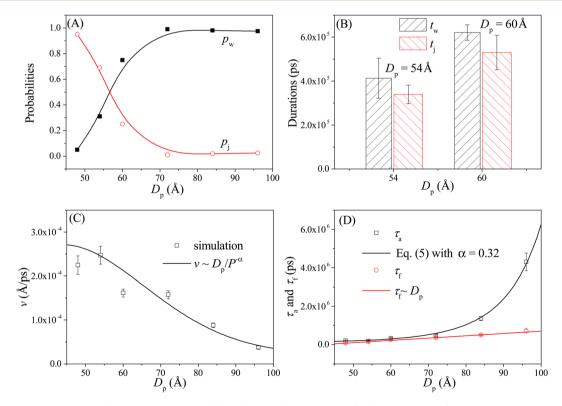


Fig. 4 (A) The pore-pore distance  $D_p$ -dependent probabilities of the walking mode  $p_w$  (solid black squares) and the jumping mode  $p_i$  (open red cycles). The lines serve as visual guide. (B) The moving times for the nanorobot in the walking mode  $t_w$  and jumping mode  $t_v$ , respectively, at  $D_p = t_w$ 54 Å and 60 Å. (C) The velocity v of the nanorobot moving on the nanopore-based track under various pore-pore distances. The open squares represent velocity calculated from the simulation results and the line represents the fitted relationship  $v \sim D_p/P^{-\alpha}$  with P as probability distribution (see eqn (5)) of the end-to-end distance for a robot leg. (D) The  $D_p$ -dependent conformational adjustment duration  $\tau_a$  and forward-moving duration  $\tau_f$ . The scatters are from the simulation results. The black and red lines are fitted from the relationships of  $\tau_a \sim P^{-\alpha}$  in eqn (5) with  $\alpha = 0.32$  and  $\tau_f \sim D_p$ . respectively. The simulations are performed under the conditions of  $\Delta q = 0.25e$ ,  $\Delta V = 0$ , and N = 16 nts.

nanoparticle moves from pore II to pore III and then to pore IV, causing  $\tau_f$  to be proportional to the pore–pore distance, as  $\tau_{\rm f} \sim D_{\scriptscriptstyle {
m D}}$  (the red line). Conversely, the conformational adjustment duration  $\tau_a$  should be dependent on the probability distribution P of end-to-end distance  $R_{ee}$  for a single ssDNA chain. For the leading robot leg in the F-states (e.g. the leg2 in the state F2 or the leg3 in the state F3), its one end is tethered at the nanoparticle, which is docking at a nanopore entry, while the other end is at the next pore entry, resulting in  $R_{\rm ee} \approx$  $D_{\rm p}-R_{\rm p}$  (the nanoparticle radius) for the leading leg at the moment. The higher probability of the leading leg finding the nanopore at the distance  $(D_p - R_n)$ , The shorter time interval between two failed pore-entering attempts will be, leading to the shorter  $\tau_a$ . Moreover, at the ion condition (0.1 mol L<sup>-1</sup> NaCl solution) employed in this article, the polythymine can be treated as a flexible self-avoiding polymer chain.<sup>85</sup> The relationship of P versus  $R_{\rm ee}$  thus can be described as  $P \sim$  $4\pi R_{\rm ee}^2 \exp(-3R_{\rm ee}^2/2Nb^2)$ , which is obtained from the polymer database. 99 Due to the dependence of  $\tau_a$  on P, the conformational adjustment duration  $\tau_a$  (see the black line in Fig. 4D) is empirically expressed as:

$$\tau_{\rm a} \sim P^{-\alpha} \sim \left[ 4\pi R_{\rm ee}^2 \exp\left(-\frac{3R_{\rm ee}^2}{2Nb^2}\right) \right]^{-\alpha}.$$
(5)

Here  $R_{ee} = D_p - R_n$ . In addition, N (= 16nts) and b (= 7 Å (ref. 88)) represent the nucleotide number and the distance between two neighbouring nucleotides. We obtain  $\alpha = 0.32$  by fitting eqn (5) to our simulation results. According to the analyses of the  $D_p$ -dependent  $\tau_a$  and  $\tau_f$  in Fig. 4D, the moving time t of the nanorobot is mainly determined by the conformational adjustment duration  $\tau_a$ , especially at long  $D_p$ . Furthermore, the moving distance D of the nanorobot is basically determined by the pore-pore distance  $D_p$ . As a result, we find that the velocity of the nanorobot follows the relationship of  $v \sim D_p/P^{-\alpha}$  (see the line in Fig. 4C).

We will also explore the impact of the charge gradient, external voltage, and leg length on the moving dynamics of the nanorobot. For this purpose, selecting an appropriate porepore distance is crucially important, which will be based on two criteria. Firstly, the pore-pore distance should result in relatively high probabilities of both walking and jumping events, enabling us to study the variation of the moving modes under different conditions. Secondly, the pore-pore distance should be relatively large to avoid the coupling effects of two neighboring charged pores. As a result, we choose the porepore distance of  $D_p = 60 \text{ Å}$  for our further investigations.

#### 3.4. Effects of the charge gradient $\Delta q$

Here we study the effect of the charge gradient  $\Delta q$  on the moving dynamics of the nanorobot, while keeping the porepore distance, external voltage, and leg length at  $D_p = 60 \text{ Å}$ ,  $\Delta V$ = 0, and N = 16 nts, respectively. Unlike the pore-pore distance, which alters the step size of the nanorobot, the charge gradient  $\Delta q$  modulates the moving dynamics by changing the electrostatic free energies of the robot legs inside the nanopores. In Fig. 5A, we presents the 2D electrostatic potentials  $\varphi$ (see eqn (4)), which are generated by the nanopore charges, at the y-z plane of x = -2 Å. Compared to the small charge gradient of  $\Delta q = 0.05e$  (the left panel), a large charge gradient of  $\Delta q$ = 0.45e (the right panel) will generate a more significant difference between the potential wells in the nanopores, impacting on not only the moving mode but also the moving velocity.

Fig. 5B shows the probabilities of the walking mode  $p_{\rm w}$  and the jumping mode  $p_i$  with various charge gradients. When a robot leg, such as the leg2 in the state F2 shown in Fig. 3B, adjusts its conformations to try to enter the nearest neighboring nanopore (pore II), the next nearest neighboring nanopore (pore III) can provide an attraction for the robot legs. If this attraction is weak at small charge gradient, most moving events still will choose the walking mode. However, As  $\Delta q$ increases, the attraction from the next nearest neighboring nanopore becomes stronger, leading the jumping behavior to occur more easily. Therefore, more jumping events can be observed at large charge gradient.

Meanwhile, we find that the moving velocity  $\nu$  of the nanorobot increases with the charge gradient  $\Delta q$ , as shown in Fig. 5C. Although the moving distance is nearly unchanged due to the fixed pore-pore distance, the strong nanopore-chain attraction can reduce both the conformational adjustment duration  $\tau_a$  and the forward-moving duration  $\tau_f$ . At large  $\Delta q$ , every ssDNA chain can easily enter the corresponding nanopore due to the strong nanopore-ssDNA chain attraction, 100 resulting in the decrease of  $\tau_a$ . In addition, the large  $\Delta q$  between nanopores provides a strong effective drag force for the nanorobot, leading the nanoparticle to move quickly from one nanopore to the next one, thereby reducing  $\tau_f$ . However, as presented in Fig. 5D, the decrease trends of  $\tau_a$  (black squares) and  $\tau_f$  (red cycles) with respect to  $\Delta q$  are different. Specifically, It is found that the conformational adjustment duration  $\tau_a$  is nearly inversely proportional to  $\Delta q$ , as  $\tau_{\rm a} \sim 1/\Delta q$ , while the forwardmoving duration  $\tau_f$  shows a linear reduction of  $\tau_f \sim -\Delta q$ . From the different decrease trends of  $\tau_a$  and  $\tau_f$ , we can find that  $\tau_a$  is dominant in the total moving time of the nanorobot. Therefore, based on the relationship between  $\tau_a$  and  $\Delta q$ , the velocity of the nanorobot can be described by the empirical relationship  $v \sim \Delta q/(1 + 2\Delta q)$  by fitting our simulation results, as presented in Fig. 5C.

#### 3.5. Effects of the external voltage $\Delta V$

The moving properties of the nanorobot presented above are obtained under the conditions without the external voltage. However, in many nanopore-device-based applications, 58-61 an external voltage (across the nanopores) is required to create a steady electric field within the nanopores. Therefore, we further study the effect of the external voltage on the moving dynamics of the nanorobot. The left panel of Fig. 6A shows the 2D voltage-induced electric potential  $\phi$  (see eqn (3)) at the x-y plane of z = 0 Å. In addition to the electrostatic potential  $\varphi$  generated by the pore charges, the total potential  $(\phi + \varphi)$  is more complicated (see the right panel in Fig. 6A). The simulations are performed with the external voltage varying in the range of

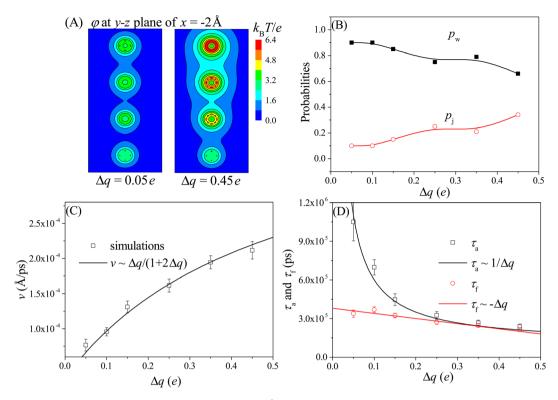


Fig. 5 (A) The 2D electrostatic potentials  $\varphi$  at the y-z plane of x=-2 Å for the cases of  $\Delta q=0.05e$  (left panel) and  $\Delta q=0.45e$  (right panel). This plane is located near the left wall (at x = 0 Å) of the membrane. (B) The  $D_p$ -dependent probabilities of the walking mode  $p_w$  (solid black squares) and the jumping mode  $p_i$  (open red cycles). The lines serve as visual quide. (C) The velocity v of the nanorobot under various charge gradients. The simulation results are represented by the scattered data points and the empirical relationship  $v \sim \Delta q/(1+2\Delta q)$  is described by the line. (D) The  $D_0$ -dependence of the lating representation dent conformational adjustment duration  $\tau_a$  and forward-moving duration  $\tau_t$ . The scattered points represent the simulation results, while the lines are fitted based on the relationships of  $\tau_a \sim 1/\Delta q$  and  $\tau_f \sim -\Delta q$ . The simulations are performed at conditions of  $D_p = 60$  Å,  $\Delta V = 0$ , and N = 16 nts.

 $\Delta V = 0-10V_0$ , where  $V_0 = 25.8$  mV is used as the voltage unit in our CG model. The pore-pore distance, charge gradient, and leg length are fixed as  $D_p = 60 \text{ Å}$ ,  $\Delta q = 0.25e$ , and N = 16 nts, respectively.

Due to the uniform size of the nanopores, the external voltage produces the same electric fields inside the nanopores, as shown in Fig. 6A, thereby deepening the free energy wells at each pore entry. As a result, during the nanorobot adjusting the conformations, the robot legs find it increasingly challenging to skip the nearest neighboring nanopore since the deep free energy well at the pore entry can trap the legs more effectively. Consequently, the probability of the walking mode  $p_{\rm w}$ increases with the external voltage as shown in Fig. 6B. When  $\Delta V > 5V_0$ , more than 90% of the moving events choose the walking mode.

Moreover, we find that as  $\Delta V$  increases, the moving velocity of the nanorobot  $\nu$  remains nearly constant at small  $\Delta V$ , and then decreases rapidly at large  $\Delta V$ , as depicted in Fig. 6C. This change behavior in  $\nu$  is induced by the combined effects of the conformational adjustment duration  $\tau_a$  and forward-moving duration  $\tau_{\rm f}$ , as shown in Fig. 6D. With the increase of  $\Delta V$ ,  $\tau_{\rm f}$ increases in a power relationship as  $\tau_f \sim \Delta V^{1.27}$ , while  $\tau_a$  exhibits a non-monotonic behavior. At small  $\Delta V$ , the opposite trends of  $\tau_f$  and  $\tau_a$  versus  $\Delta V$  balance each other, leading to a nearly constant velocity of the nanorobot. However, at large

 $\Delta V$ , both  $\tau_{\rm f}$  and  $\tau_{\rm a}$  increase with  $\Delta V$ , resulting in the decrease of velocity of the nanorobot. Combined with the empirical relationships of  $\nu$  with  $D_p$  and  $\Delta q$  shown in Fig. 4C and 5C, here we use a phenomenological function to describe the velocity for the nanorobot with the fixed leg length:

$$v \sim \frac{D_{\mathrm{p}}}{P^{-a}} \times \frac{\Delta q}{1 + 2\Delta q} \times \frac{1}{\left(a\Delta V\right)^{\beta} + 1}.$$
 (6)

Here *P* is the distribution probability of the end-to-end distance for a robot leg expressed in eqn (5). The parameters a =0.106 and  $\beta$  = 4.93 are fitted from our simulation results at  $D_p$ = 60 Å and  $\Delta q = 0.25e$ .

In order to investigate the moving dynamics of the nanorobot at large external voltage in detail, we present the time-evolutional trace of the nanoparticle in Fig. 7A at  $\Delta V = 10V_0$ . During the conformational adjustment period (from F3 to E3 in Fig. 7B), if  $\Delta V$  is large, the robot leg (e.g. leg3) may be attracted back to the nanopore entry where the nanoparticle is located, and be trapped there for some time (as seen in the snapshot at 310 ns). However, this phenomenon cannot be observed at small  $\Delta V$ . Therefore, we can find that the conformational adjustment duration  $\tau_a$  decreases at small  $\Delta V$  and then increase at large  $\Delta V$  in Fig. 6D.

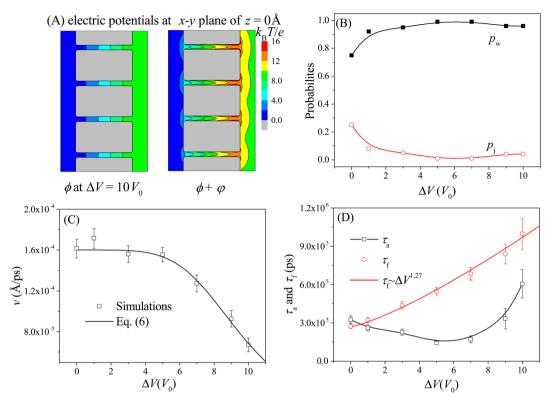


Fig. 6 (A) The 2D electric potential  $\phi$  induced solely by the external voltage  $\Delta V = 10V_0$  (left panel) and the total electric potential  $\phi + \phi$  caused by the combination of the external voltage and nanopore charges (right panel) at the x-y plane of z=0 Å. (B) The  $\Delta V$ -dependent probabilities of the walking mode  $p_w$  (solid black squares) and the jumping mode  $p_i$  (open red cycles). The lines are provided as a visual guide. (C) The moving velocity vof the nanorobot as a function of the external voltage. The simulation results are represented by the scattered points and the empirical relationship in eqn (6) is shown by the line with the best-fitted parameters a=0.106 and  $\beta=4.93$ . (D) The  $\Delta V$ -dependent conformational adjustment period  $\tau_a$ and forward-moving period  $\tau_f$ . Here  $D_p = 60$  Å,  $\Delta q = 0.25e$ , and N = 16 nts.

After the leg3 enters the pore III successfully (the state E3), the leg1 (already inside the pore I) and the leg3 engage in a "tug-of-war" (as seen in the snapshot at 558 ns), which can last hundreds of nanoseconds.<sup>68</sup> The leg1 eventually loses competition (as seen in the snapshot at 614 ns) because of the free energy difference; however, it still cannot approach the pore IV smoothly. The leg1 can be trapped at the entries of the pores II and III due to the deep potential wells induced by the large  $\Delta V$ (as seen in the snapshots at 744 ns and 806 ns), while the nanoparticle still lingers around the entry of the pore II, as shown in Fig. 7A. The effects of the "tug-of-war" and poretrapped processes are more pronounced at large voltages, leading to the fast increase of the forward-moving duration  $\tau_f$ presented in Fig. 6D. In fact, at extremely large external voltage beyond the voltage regime used in this paper, all three legs of the nanorobot will be always trapped inside the corresponding nanopores, leading to the failed moving event. Therefore, the change in the external voltage can be used to turn the moving case of the nanorobot on or off.

#### 3.6. Effects of the leg length N

We also study the effects of the leg length N on the moving dynamics of the nanorobot. The ssDNA leg lengths of the nanorobot vary from N = 12 nts to 20 nts under the conditions

of  $D_p = 60 \text{ Å}$ ,  $\Delta q = 0.25e$ , and  $\Delta V = 0$ . While maintaining a fixed pore-pore distance, the nanorobot with three longer legs is more likely to skip the neighbouring nanopore to find a farther one. Therefore, the probability of walking mode  $p_{\rm w}$ decreases with the increase in N, as shown in Fig. 8A.

However, the impact of leg length on the moving velocity  $\nu$  $[=D/(\tau_a + \tau_f)]$  of the nanorobot is relatively complicated due to the sensitivity of the conformational adjustment duration  $\tau_a$ , forward-moving duration  $\tau_f$ , and the moving distance of the nanorobot D to changes in leg length (see Fig. 8B and C). On one hand, as mentioned above, the conformational adjustment duration  $\tau_a$  depends on the occurrence probability P of the leading leg locating the next nanopore, as described in eqn (5). This probability is mainly determined by both the porepore distance  $D_p$  and the leg length N. However, the effects of  $D_{\rm p}$  and N on the conformational adjustment duration  $\tau_{\rm a}$  are different. A larger  $D_p$  can reduce the probability of the nanorobot finding the next pore, resulting in an extended  $\tau_a$  (see Fig. 4D). Conversely, a longer N can facilitate the nanorobot in locating the next nanopore, leading to a shorter  $\tau_a$  (see Fig. 8B). We find that the relationship between  $\tau_a$  and N can still be described by eqn (5) with the parameter  $\alpha = 0.32$  (see the black line in Fig. 8B). On the other hand, during the forward-moving process, the leading leg drags the nanoparticle

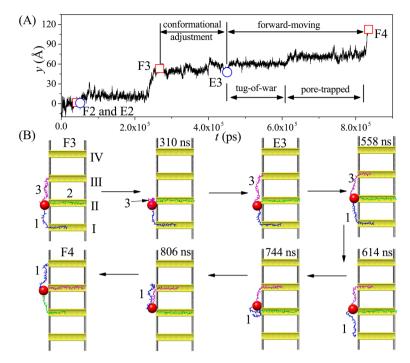


Fig. 7 (A) The time-evolutional trace of the nanoparticle along y-direction at  $D_p = 60$  Å,  $\Delta q = 0.25e$ , and  $\Delta V = 10V_0$ . (B) The snapshots of the nanorobot in the step III-IV (from the state F3 to state F4). In order to clearly discriminate the three legs of the nanorobot in different states, leg1, leg2, and leg3 are highlighted by blue, green, and magenta, respectively.

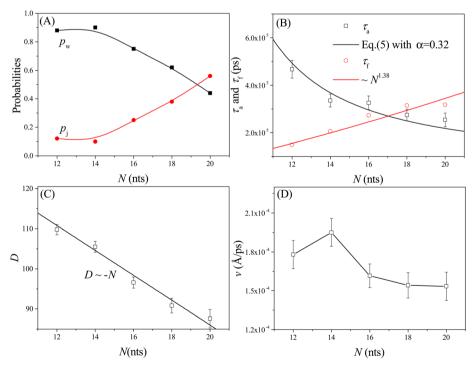


Fig. 8 The leg length N-dependent walking and jumping probabilities  $p_w$  and  $p_j$  (A), conformational adjustment duration and forward-moving duration  $\tau_a$  and  $\tau_f$  (B), moving distance D of the nanorobot from the state F2 to the state F4 (C), and moving velocity v from all simulation samples (D). Here  $D_p = 60$  Å,  $\Delta q = 0.25e$ , and  $\Delta V = 0$ .

to approach a nanopore by completely entering this nanopore. Therefore, the forward-moving duration  $\tau_{\rm f}$  increases with a scaling relationship as  $\tau_{\rm f} \sim N^{1.38}$ , which agrees with the simulation results of our previous study on the translocation of a ssDNA chain through a nanopore. Moreover, the moving distance D of the nanorobot from the state F2 to the state F4 (see Fig. 3B and D) linearly decreases with the leg length N, as shown in Fig. 8C.

The varied trends observed in the leg length N-dependent conformational adjustment duration  $\tau_a$ , forward-moving duration  $\tau_f$ , and moving distance D result in a non-monotonic pattern in moving velocity  $\nu$  of the nanorobot, as depicted in Fig. 8D. Specifically, in comparison to the nanorobot with 12 nt-long legs, the one with 14 nt-long legs can more easily locate the next nanopore due to its longer legs. Therefore, within a moving step, the 14 nt-long legs can facilitate the nanorobot in completing the conformational adjustment stage and thus enable it to enter the forward-moving stage more quickly. Fig. 8B reveals that the conformational adjustment duration  $\tau_a$  for N = 14 nt is significantly shorter than that for N= 12 nt. While both an increase in  $\tau_f$  and a decrease in D (see Fig. 8C) contribute to the reduction of the moving velocity, the drastic decrease in  $\tau_a$  at short leg lengths takes precedence over the effects of  $\tau_f$  and D, leading to the moving velocity  $\nu$  at N = 14 nt being faster than that at N = 12 nt. However, as Nincreases further, the decline in  $\tau_a$  becomes more gradual. Consequently, the dominant factors influencing moving velocity shift to the forward-moving duration  $\tau_f$  and moving distance D. Specifically, as  $\tau_f$  increases and D decreases, these two factors collaboratively result in a reduction in  $\nu$  for N > 14 nt. It is essential to note that in our simulations, the moving of nanorobot only includes two complete steps (II-III and III-IV) from pore II to pore IV. For nanorobot with longer legs (>20 nts), it might not find the pore IV when lingering near the pore III. Therefore, more systematic analyses of the dependence of the moving velocity on the leg length require longer nanopore-based tracks, which will be considered in our future study.

#### 4. Conclusions

In this proof-of-principle study, we use a CG model to investigate the moving dynamics of a well-designed nanorobot with three DNA legs on the nanopore-based track. The nanorobot is composed of a large nanoparticle and three ssDNA chains. The nanopores embedded into the membrane distribute in a line and their different charges produce a gradient of the nanopore-leg attractions for the nanorobot. The autonomous walking of the nanorobot is made possible by its three-leg design. As two legs are trapped inside the corresponding nanopores, the remaining one attempts to enter a farther nanopore, generating an effective drag force that help the lagging leg to leave its nanopore.

The nanorobot can move autonomously on the nanoporebased track by using two main modes: walking and jumping. The former mode allows the nanorobot to dock with each nanopore to perform its tasks, while the latter mode involves the nanorobot skipping a nanopore to move directly to the next one. The study explores the effects of the pore–pore distance  $D_{\rm p}$ , the charge gradient of the nanopores  $\Delta q$ , the external voltage  $\Delta V$ , and leg length N, on the moving dynamics of the nanorobot. It finds that longer  $D_{\rm p}$ , smaller  $\Delta q$ , larger  $\Delta V$ , and shorter N can help the nanorobot to prefer the walking mode. Moreover, the moving velocity of the nanorobot also can be controlled by varying the conditions.

However, we should note that the current simulation model has several limitations. First, the robot core used in this study is smaller and lighter than those used in experiments, such as gold nanoparticle, 19,39 CdS nanocrystal, 31 and streptavidin protein, 101 which may affect the quantitative results of the simulations. Whereas, as the CG model accurately reflects the key properties of the nanorobot, especially for the ssDNA chains, the simulation results are still qualitatively reliable. Second, the nanopore-based track is designed to be onedimensional (1D) on the planar membrane, while in reality, the fabrication technologies usually produce the two-dimensional (2D) nanopores. 69,70 On the 2D nanopore-based tracks, the nanorobot will have more complicated moving behaviors.<sup>77</sup> Third, the charge gradient along the nanopore distribution is the only power source considered in this study. A large charge difference, such as  $\Delta q = 0.45e$ , may limit the fabrication of the nanopores and extension the track due to the high charge density of the last nanopore ( $\approx 0.23$  e Å<sup>-2</sup>). Moreover, even if the nanopores with high charge density can be realized, it will attract a great amount of ions to screen the ssDNA-pore attractions. Therefore, the nanorobot cannot move along the nanopore-based track for a long distance. Our tests presented in the ESI (see the details in ESI section S4†) show that the nanorobot will be trapped when the charge density of a nanopore is greater than  $0.36 \text{ e Å}^{-2}$ . Our future simulation studies will consider other power-generating approaches that can be easily employed in applications and can help the nanorobot move longer distance, such as the gradients of the pH value, 102 ion concentration, 103-105 and temperature. 106,107

#### **Author contributions**

Li-Zhen Sun designed and performed simulation model; Yao-Jun Ying collected and analyzed simulation data; both authors participated in manuscript writing.

#### Conflicts of interest

There are no conflicts to declare.

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