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Transport of a graphene nanosheet sandwiched inside cell membranes

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The transport of nanoparticles at bio-nano interfaces is essential for many cellular responses and biomedical applications. How two-dimensional nanomaterials, such as graphene and transition-metal dichalcogenides, diffuse along the cell membrane is, however, unknown, posing an urgent and important issue to promote their applications in the biomedical area. Here, we show that the transport of graphene oxides (GOs) sandwiched inside cell membranes varies from Brownian to Lévy and even directional dynamics. Specifically, experiments evidence sandwiched graphene–cell membrane superstructures in different cells. Combined simulations and analysis identify a sandwiched GO–induced pore in cell membrane leaflets, spanning unstable, metastable, and stable states. An analytical model that rationalizes the regimes of these membrane-pore states fits simulations quantitatively, resulting in a mechanistic interpretation of the emergence of Lévy and directional dynamics. We finally demonstrate the applicability of sandwiched GOs in enhanced efficiency of membrane-specific drug delivery. Our findings inform approaches to programming intramembrane transport of two-dimensional nanomaterials toward advantageous biomedical applications.

INTRODUCTION

The dynamic nature of cell membranes is essential for cellular functioning (1–4). As the basis of a cell membrane, the lipid bilayer provides a compartmentalized matrix within and on which nanoscale particles, such as proteins, macromolecules, and therapeutic nanocarriers, are in a constant state of motion and redistribution (5–7). These dynamic processes play a critical role in cellular mechanisms encompassing metabolism, endocytosis and secretion, differentiation, locomotion, and signal transduction (8–12). Understanding the diffusive dynamics of nanoparticles on the cell membrane is thereby crucial for their efficient and safe biomedical applications. Experiments (13, 14) and theoretical models (15, 16) have been intensively proposed to examine and explain the diffusive transport of spheres or other three-dimensional (3D) nanoparticles on the cell membrane. It is, however, less well understood how 2D nanomaterials, such as graphene and transition-metal dichalcogenides, transport along the cell membrane.

As the most well-known 2D nanomaterials, graphene and its derivatives have a range of unique and versatile physical and chemical properties (17, 18). The tunability of the properties is perhaps unprecedented among other nanomaterials, offering immense design capabilities that may enable a considerable number of applications of these emerging nanomaterials in the cutting-edge fields of biological and medical science (19–21). Biomedical applications for graphene are attracting interest from academics and industrial partners aiming to develop nextgeneration medical devices and therapies (22, 23). Yet, the detailed dynamical process and underlying molecular mechanism of how graphene transports on the cell membrane remain unclear, posing an urgent and important issue to promote their applications in biomedicine. This gap in our understanding is largely attributable to the intrinsically high complexity of the interaction states between graphene and the Copyright © 2019 The Authors, some rights reserved; exclusive licensee American Association for the Advancement of Science. No claim to original U.S. Government Works. Distributed under a Creative Commons Attribution NonCommercial License 4.0 (CC BY-NC).

membrane (24–27). To definitely elucidate the diffusion dynamics of graphene at such unconventional bio-nano interfaces, here, we focus on a unique state of graphene–cell membrane interaction, that is, the sandwiched graphene–cell membrane superstructure (28), where the graphene oxide (GO) is hosted in the hydrophobic interior of the lipid bilayer as illustrated in Fig. 1A. Despite needing to be experimentally validated, this is the first graphene–cell membrane interaction state predicted by simulations (28, 29). The GO encapsulation makes this super-structure absolutely distinct from the basic features of interfacial transport of membrane-trapped 3D nanoparticles (15, 29, 30) and may allow diverse approaches for novel biomedical applications.

In the present work, we first provide experimental evidence of sandwiched graphene-cell membrane superstructures in different cells. By combining simulations and experiments, we find that the translational transport of GOs sandwiched inside cell membranes changes from Brownian to Lévy and even directional dynamics, governed by various states of a sandwiched GO-induced pore in the leaflet of the membrane. A mechanistic interpretation of the emergence of Lévy and directional dynamics is realized by quantitatively correlating the simulations to an analytical model that is developed to rationalize the regimes of the membrane-pore states spanning unstable, metastable, and stable cases. Last, both experiments and simulations point to the enhanced efficiency of membrane-specific drug delivery for the sandwiched GO. This work elucidates the translation or diffusion dynamics of cell membraneembedded 2D nanomaterials and discloses the basic nature of the mechanism of such intramembrane transport dynamics with programmable directional persistence.

RESULTS

Experimental evidence of the sandwiched graphene-cell membrane superstructure

To enable experimental validation of the simulations (27, 28), we herein used GOs with ultrasmall size (fig. S1) and a certain oxidization degree (26.1%) (31, 32), which allows us to provide direct evidence of the sandwiched graphene-membrane superstructure in a cellular level. To provide evidence of the sandwiched superstructure, we use the cryogenic transmission electron microscopy (cryo-TEM) technique and visualize

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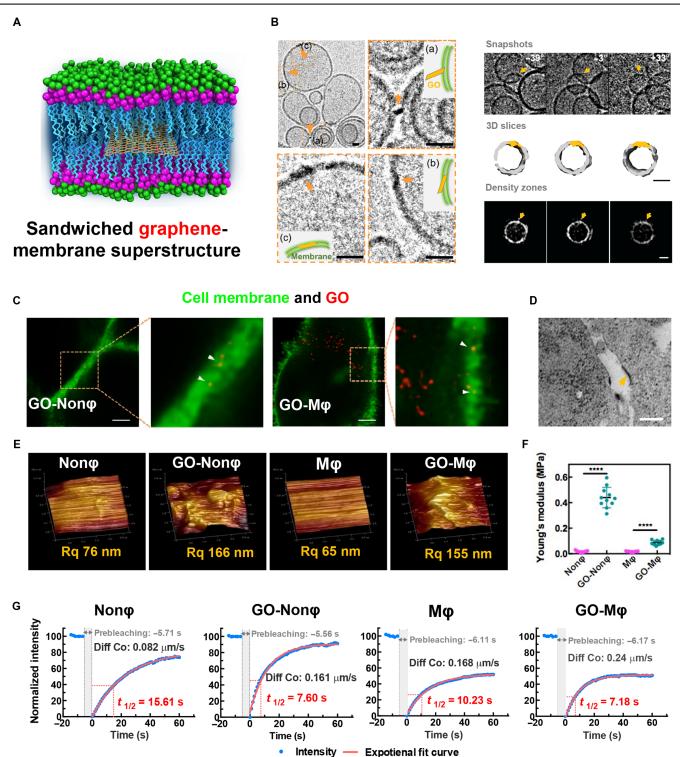


Fig. 1. Experimental evidence of the sandwiched graphene membrane superstructure and the following cell responses. (**A**) Cartoon illustrating the superstructure integrating GO inside the cell membrane. (**B**) Cyro-TEM images (left) and tomography views (right) of the lipid vesicles in the presence of GO. Scale bars, 20 nm. The sandwiched graphenemembrane superstructure was formed via three possible processes: primary contact, perpendicular/slant insertion, and final settlement. The lipid vesicle in the presence of a GO nanosheet (as indicated by the arrows) shows higher mass density. (**C**) Super-resolution confocal images showing the GO sandwiched in the membrane of different cells (macrophage M ϕ and nonphagocyte Non ϕ). The green fluorescence indicates the phospholipid bilayer membranes bound by the lipid probe [3,3'-dioctadecyloxacarbocyanine perchlorate (DiO)], while the false-colored red spots indicate the GO signal. Yellow spots indicate the sandwiched GO in the membrane. Scale bars, 1 µm. (**D**) TEM images exhibiting the GO-sandwiched superstructure. The GO is marked by the yellow triangle. Scale bar, 100 nm. (**E**) AFM images and the roughness index of the cell membrane with embedded GOS. (**F**) The Young's modulus indicating the rigidity change of cell surface upon GO interaction. (**G**) FRAP analysis showing the fluidity of the membrane lipids. Diff Co and the $t_{1/2}$ represent the diffusion coefficient and half-time for the fluorescence recovery of membrane after photobleaching, respectively.

the GO membrane in a fully hydrated medium, close to native state. As shown in the images and tomography views (Fig. 1B and figs. S2 and S3), darker lines (with higher mass density, as shown in Fig. 1B and fig. S3C) appear within the lipid bilayer membrane upon exposure to GO nanosheets, which is quite different from that of the blank lipid vesicles with homogeneous density (figs. S2A and S3, D to G). Moreover, the sandwiched structure of GO in the lipid bilayer membrane can be reconfirmed at different detection angles (Fig. 1B and figs. S2C and S3A) and particularly through the 3D views of the tomography snapshots in Fig. 1B and fig. S3. We can thereby identify the formation process including the primary contact, perpendicular/slant insertion, and final settlement within the membrane (Fig. 1B and fig. S2B), consistent with our previous simulations (*27*).

Together with the cyro-TEM proof, the super-resolution confocal images (Fig. 1C) and TEM images (Fig. 1D and fig. S4) also provide in vitro evidence for GO-based superstructures in the cell membrane. GO nanosheets are found to be hosted inside the membrane of a non-phagocyte (Non φ , 4T-1). A similar phenomenon can also be identified on a macrophage (M φ , J774A.1) (Fig. 1C), although some GOs are internalized into the cell due to the active phagocytosis (fig. S5A).

Although such a GO-sandwiched structure has very little effect on the leakage of cell membrane (fig. S5B), we observe its notable influence on the membrane morphologies using an atomic force microscope (AFM). Compared with untreated cells, the GO insertion results in a wavier surface with a higher roughness index Rq (root-mean-square roughness) (Fig. 1E), especially for the Nonø. The GO-Nonø group also induces a 10-fold increase in membrane rigidity (indicated by Young's modulus), which is much larger than that of the GO-M ϕ group (Fig. 1F). In agreement with our following simulations (fig. S18), membrane fluidity can be recognized to evidently increase by using the fluorescence recovery after photobleaching (FRAP) technique (Fig. 1G and fig. S5C). For example, the diffusion coefficient (Diff Co) of the GO-Non group is almost twice as much as that of the untreated group, and the half-time $(t_{1/2})$ of fluorescence recovery correspondingly reduces from 15.61 to 7.60 s for the GO-Nonø group. Together, the experimental data demonstrate the existence of the sandwiched graphene-membrane superstructure and reveal its nontrivial effects on membrane properties including roughness, rigidity, and fluidity.

Simulations reveal Lévy and directional dynamics of the sandwiched GO

In the sandwiched graphene-membrane superstructure, the lipid bilayer of the membrane almost fully isolates the embedded GO from the external solution, making it difficult to directly characterize its intramembrane diffusion. To accomplish such a challenging task, we perform coarse-grained molecular simulations where the mesoscopic simulation technique (33–37), including explicit solvent beads, has been fully proved to faithfully reproduce all key properties of the self-assembling fluid bilayer membrane and the GO-membrane interactions (see Materials and Methods, section S1, and fig. S6 for more details) (27, 29). We start from obtaining the GO-sandwiched structure by simulating the interaction between GO with edge length a = 4.9 nm and a square patch of the lipid bilayer membrane, where the interaction parameter between GO and lipid tails, χ_{GT} , can be changed to reproduce different oxidization degrees or chemical modifications of the GO (see Materials and Methods for more details and figs. S7 and S8 and movies S1 and S2).

Three typical trajectories of the center of mass (COM) of the sandwiched GO are illustrated in Fig. 2 (A to C), where the attraction between GO and lipid tails is gradually reduced, mimicking, for example,

the increased oxidization degree of the GO (see movies S3 to S5 for detailed dynamics). Note that, for each analysis, the COM of the associated bilayer leaflet is subtracted from the trajectories of the GO to remove effects of COM motion of the membrane. For strong GO-lipid tail attraction ($\chi_{GT} = 1.43$), the diffusion of GO within the membrane undergoes Brownian dynamics, as confirmed by the stochastic trajectory (Fig. 2A) and the Gaussian distribution of displacements (fig. S9A). In this case, the translational diffusion coefficients of the GO can still be well described by the Saffman-Delbrück model (15) that is widely used to quantitatively understand the Brownian diffusion of proteins trapped in the membrane (fig. S9B). Upon reducing GO-lipid tail attraction to $\chi_{\rm GT}$ = 7.15, the sandwiched GO alternatively performs persistent walks and local jiggling, which are schematically indicated by arrows and dashed ovals, respectively, in Fig. 2B. To reveal the inner nature of this unusual randomness, we used a wavelet-based method to rapidly separate persistent segments from random jiggling (38, 39), as shown in the inset of Fig. 2B (section S1). This allows us to calculate the time-averaged mean-square displacement (MSD) of both these segments and thereby identify that the jiggling segment is invariably Fickian while the persistent segment is invariably superdiffusive (Fig. 2D).

Extending the analysis, we denote the length of the persistent or jiggling segment as *l*. Figure 2E shows the plots of relative probability against l on log-log scales for various GO-lipid tail interactions. In sharp contrast to the exponential distribution for the Brownian dynamics at χ_{GT} = 1.43, the distribution at χ_{GT} = 7.15 exhibits a power-law slope of μ = -2, determined from maximum likelihood estimation (section S1) (40). In addition to the uniformly distributed turning angles between neighboring persistent segments (Fig. 2F and fig. S10), we can conclude that the transport of the sandwiched GO upon reduced GO-lipid tail attraction follows the landscape of Lévy walk, where the distribution of step length is heavy-tailed with slope μ satisfying $-3 < \mu < -1$ (41). This result is also confirmed by analyzing the displacement probability distributions, the non-Gaussian parameters, the displacement autocorrelation function, the MSD of the whole trajectories, and the relative standard deviation of MSDs (fig. S11) (8). However, further decreasing $\chi_{\rm GT}$ to 14.3 resulted in a change in isotropy. The transport of the sandwiched GO instead prefers nontrivial directionality, as confirmed by the directional trajectory (Fig. 2C), the biased distribution of turning-angle statistics (Fig. 2F), and the power-law slope of $\mu = -1$ for the l distribution (Fig. 2E) (42).

As the most efficient random search strategy, Lévy walks are broadly found in nature (40, 43). The aforementioned results hint that such a prominent strategy might also be adopted by cells for efficient transport of nanoparticles along the cell membrane. To assess the detailed range for the emergence of Lévy dynamics, we systematically examine the power-law slope of μ by walking through the parameter space of χ_{GT} . This leads to the 2D diagram as shown in Fig. 2G, which summarizes the outcomes of about 50 independent simulation runs at each value of χ_{GT} . Specifically, below $\chi_{GT} = 4.50$, the transport reverts to Brownian; above $\chi_{GT} = 12.87$, the transport favors statistic directionality. Within a broad range in between, Lévy walk emerges.

Sandwiched GO-induced hemi-pore in the leaflet of the cell membrane

To understand the transition of such transport patterns, we examine the details of the sandwiched graphene–cell membrane superstructure in response to various GO–lipid tail interactions. The GO is found to remain within the center of the lipid bilayer during the whole simulation period and in the current range of χ_{GT} (inset of Fig. 2C), ruling out the

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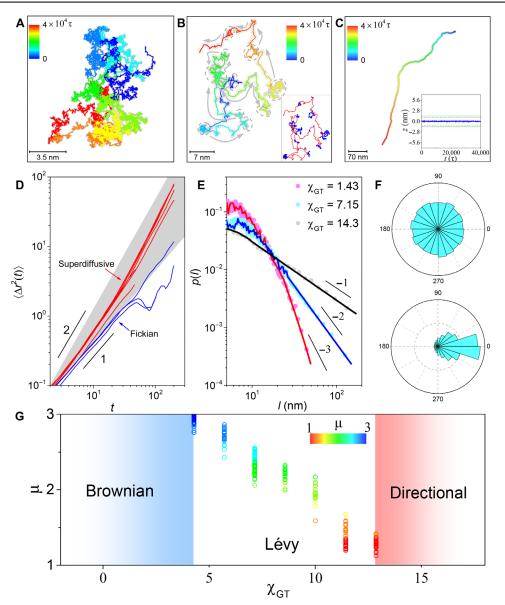


Fig. 2. Transition of diffusion patterns of the sandwiched GO from Brownian to Lévy and even directional dynamics. (A to C) Representative trajectories tracked for $4 \times 10^4 \tau$, when the interaction parameter between GO and lipid tails, χ_{GT} , is (A) 1.43, (B) 7.15, and (C) 14.3. Colors denote the time lapse of each trajectory. In (B), arrows and dashed ovals indicate alternating persistent segments and jiggling periods, respectively, which are quantitatively identified by wavelet analysis shown in the inset. Inset of (C): The averaged position of GO in the *z* axis as a function of time, where z = 0 represents the middle of the membrane. (**D**) Time-averaged mean square displacement $\langle \Delta r^2(t) \rangle$ as a function of lag time on log-log scales for persistent (red) and jiggling (blue) segments of the trajectory at $\chi_{GT} = 7.15$. (**E**) The probability distribution of step length, *l*, on log-log scales, showing exponential statistics at $\chi_{GT} = 7.15$ (top) and 14.3 (bottom). (**G**) The plot of the exponent defining the power-law distribution of step length, μ , against χ_{GT} for the systems exhibiting Lévy dynamics. The step-length distribution from about 50 sets of simulated trajectories at each χ_{GT} is summarized. The color bar encodes the value of μ .

contribution from the GO fluctuation normal to the membrane plane. Changing the GO geometry from a square shape to a circular one, as well as enlarging the membrane size, we find that GO geometry has a trivial effect on the transition of the transport patterns (figs. S12 and S13). These results inspire us to turn to focusing on the detailed structure of the membrane integrating GO. For this purpose, a simple indicator of the integrity of the membrane is obtained by counting the number of GO beads that contact solvent, *N*. Figure 3A shows the probability distributions of *N*, which summarize every time within the whole simulation period (5 million time steps) at each χ_{GT} (fig. S14, A to D). The nonzero

values of *N* suggest that the membrane integrity cannot hold, especially for a reduced attraction between GO and lipid tails. At corresponding values of χ_{GT} , a hemi-pore (for brevity, "hemi-" is omitted in the rest of this paper) can be identified in the leaflets of the bilayer membranes and just above the GO plane (fig. S15) (44).

A close examination of the N distributions in Fig. 3A leads to an intriguing observation: All the distributions of N can be classified into four types based on differences in their maxima, as shown in Fig. 3 (B to E). For a strong GO–lipid tail attraction, N remains at zero, demonstrating that no pore occurs (Fig. 3B). Upon reducing GO–lipid tail

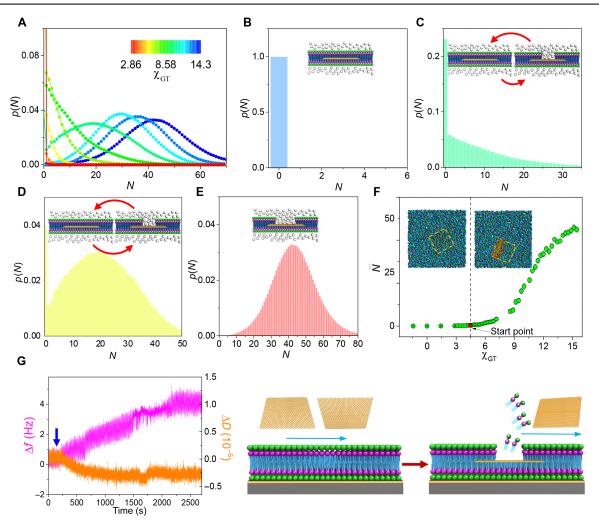


Fig. 3. Combined simulations and experiments demonstrate the sandwiched GO-induced pore in the leaflets of cell membranes. (A) Probability distribution of the number of GO beads contacting solvent, *N*, during a simulation period of $4 \times 10^4 \tau$, *p*(*N*), at a series of χ_{GT} encoded by the color bar. (**B** to **E**) *p*(*N*) at various χ_{GT} . (B) 1.43, (C) 7.15, (D) 10.01, and (E) 14.3. *N* indicates the size of the pore in the leaflet of the membrane, as schemed by the insets. (**F**) The time-averaged *N* in the whole period, \bar{N} , as a function of χ_{GT} . The red circle in the plot marks the start point from which \bar{N} is above 0 and pore occurs. The insets are two snapshots showing the typical GO-sandwiched structures without (left) and with (right) a pore, where the dashed squares mark the contour of GO and the red outline displays the pore. (**G**) QCM data (frequency, Δf ; dissipation, ΔD) during the interaction between GO and the lipid bilayer, as schematically illustrated by the right diagram.

attraction, the maximum remains at N = 0 along with a few nonzero N, indicating a reversible transition between the structures without and with a pore during GO transport (Fig. 3C). In this case, the former dominates the transition, causing the unstable state of the pore. With further reducing χ_{GT} , the transition between both structures almost balances, as described by the formation of the other maximum at non-zero N (Fig. 3D). Here, a small perturbation may readily trigger the transition between both structures, suggesting the metastable nature of the pore (42). When χ_{GT} is large enough, only the maximum at non-zero N exists so that the pore reaches the stable state (Fig. 3E). The remarkable dependence of these diverse pore states on χ_{GT} corroborates that such a pore is substantially induced by the sandwiched GO. Particularly, plotting the time-averaged N within the simulation period, \bar{N} , against χ_{GT} confirms that the occurrence of the pore starts from $\chi_{GT} = 4.50$ (Fig. 3F).

To experimentally verify the sandwiched GO–induced pore, we constructed a special quartz crystal microbalance (QCM) chip (fig. S14E) and measured the structure changes (dissipation, ΔD) and the mass

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changes (frequency, Δf) during the interaction between GO and the lipid bilayer (37). As shown in Fig. 3G, the addition of GO has little effect on the ΔD . In notable contrast, the gradually increased Δf suggests that the mass on the chip decreases with the interaction time. In light of the above simulation results, this can be attributable to loss of lipid molecules during the insertion process of GO.

Analytical model of the sandwiched GO-induced pore

To complement the simulations and provide a fundamental insight into various states of the sandwiched GO–induced pore, we develop a model that is amenable to analytical solutions (see Materials and Methods and section S2 for details). As illustrated by the schematic diagram in Fig. 4A, the energy of the membrane tension induced by the interaction between GO and lipid tails drives the pore formation, which, however, is opposed by the energy of the line tension that creates the edge of the pore. This leads to a critical relationship between the energy cost of pore formation, E_R , and the radius of the pore, R, as defined by Eq. 1 and plotted in Fig. 4B. For relatively weak GO–lipid tail repulsion with small

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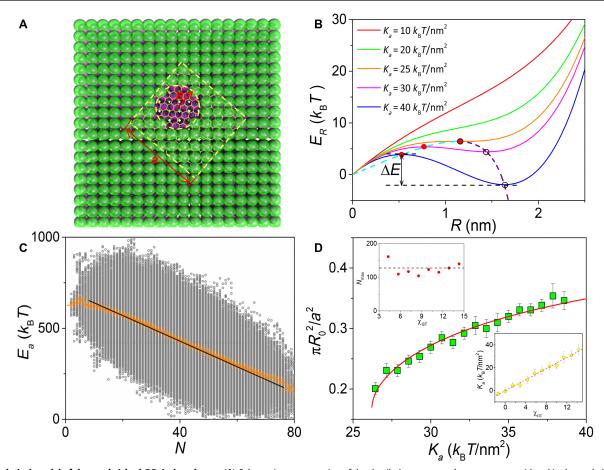


Fig. 4. Analytical model of the sandwiched GO-induced pore. (**A**) Schematic representation of the detailed structure and parameters considered in the analytical model of the sandwiched GO-induced pore. (**B**) The energy cost of pore formation, E_{R} , as a function of pore radius at different K_{ar} , i.e., the interaction energy density of lipid tails with GO. The solid and hollow circles at each plot mark the local maximum and the local minimum of E_{R} , respectively. The dashed cyan and purple curves give the analytical solutions of both of these types of points, which meet at the transition point with $K_a = 25 k_B T/nm^2$. (**C**) Plot of GO-lipid tail interaction energy, E_{ar} , versus the number of GO beads contacting solvent *N*, where $\chi_{GT} = 10.01$. Averaged from 5 million time steps (raw data obtained from simulation results and shown as gray circles), the yellow crosses have the linear fitting indicated in the figure. (**D**) The ratio between the most probable pore (pore at the energy minimum) area and GO area as a function of K_a . The green points and red curve represent the results from the simulation and analytical model, respectively. Top inset: The maximum of GO beads contacting solvent, N_{maxr} remains almost unchanged with increasing χ_{GT} . Bottom inset: The plot of K_a used in the analytical model versus χ_{GT} used in the simulation, approximating a linear fitting as indicated by the dashed red line.

interaction energy density K_{α} , E_R increases monotonically with R, indicating that the pore cannot occur or is unstable. As K_a increases, there exists a local energy maximum at smaller R and a local energy minimum at larger R, and the energy difference between them results in an energy barrier, ΔE , for the annihilation of a formed pore. The detailed values of both of these points can be analytically determined, as indicated by the dashed curves in Fig. 4B (see also section S2 and fig. S16). When K_a is not too high, the energy barrier is lower and may be readily overcome; thereby, the pore is metastable in nature. If K_a is large enough, then the local energy minimum tends to be global and ΔE becomes so high that the pore reaches the stable state. In short, compared with the results of Fig. 3 (A to E), these energy evolution profiles reproduce various pore states observed in the simulations.

For further quantification, we first derive the relationship between N and GO–lipid tail interaction energy, E_a , as described in Eq. 4 (see Materials and Methods). By applying this model to fit the averaged E_a -N data within a whole simulation period (Fig. 4C), the values of K_a and N_{max} , the maximum of GO beads contacting solvent, can be obtained for a certain χ_{GT} . Repeating this process with a series of χ_{GT}

allows us to determine the K_a - χ_{GT} relationship, as well as almost invariant N_{max} , which highlights the consistency of the model (insets of Fig. 4D and fig. S17). Meanwhile, the systematic simulations give the area change of the most probable pore with respect to χ_{GT} . On the basis of Eq. 2, the dependence of the pore area on K_a can also be analytically obtained, which agrees exactly with the simulation results in light of the K_a - χ_{GT} relationship (Fig. 4D). Such a close agreement underscores a quantitative support for the correlation between our analytical model and simulations.

Mechanisms of the emergence of Lévy and directional dynamics

Having established the states of the sandwiched GO–induced pore and the quantitative relations between simulations and the analytical model, we now provide a refined picture of the mechanism underpinning the transition of transport patterns from Brownian to Lévy and even directional dynamics. First, we determine the precise boundaries of four different regimes of the pore states by combining simulations and theoretical analysis (Fig. 5A). The details regarding this aspect can be

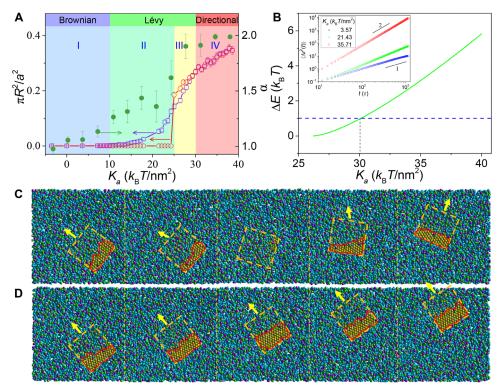


Fig. 5. Correlation between diffusive dynamics and membrane-pore states elucidates the mechanisms of Lévy walk and directional motion of sandwiched GO. (**A**) The area ratio between pore and GO and the diffusion exponent, α , as a function of K_{α} . The red and blue curves depict the cases of the most probable pore area and the averaged pore area, respectively. The shaded regions divide four regimes of the membrane-pore states, where the colors correspond to those adopted in Fig. 3 (B to E). (**B**) The energy barrier in the E_{R} -R curve, ΔE (Fig. 4B), as a function of K_{α} . The dashed blue line plots the thermal energy, 1 $k_{B}T$. Inset: Time-averaged mean square displacement $\langle \Delta r^{2}(t) \rangle$ as a function of lag time on log-log scales for various K_{α} , where the slopes give α . (**C** and **D**) Successive stages of a sandwiched GO exhibiting Lévy walk at $\chi_{GT} = 10.01$ ($K_{\alpha} = 25.29 k_{B}T/nm^{2}$) (C) and directional motion at $\chi_{GT} = 14.3$ ($K_{\alpha} = 34.74 k_{B}T/nm^{2}$) (D). The dashed squares mark the contour of GO, the red outlines display the pore induced by the sandwiched GO, and the arrows denote the moving direction of the GO. The times of the simulation snapshots are (from left to right) 22,160 τ , 22,240 τ , 22,480 τ , 22,880 τ , and 23,040 τ for (C) and 22,320 τ , 22,360 τ , 22,400 τ , 22,440 τ , and 22,480 τ for (D).

found in section S2. Briefly, the boundary between regimes I (without pore) and II (unstable state) occurs at $K_a = 10 k_B T/nm^2 (\chi_{GT} = 4.50)$ as determined by simulations (Fig. 3F). For the boundary between regimes II and III (metastable state), it can be obtained by either the crossover in the curve describing K_a dependence of the most probable pore area from simulations or the transition point in the E_R -R curves from theoretical analysis (see Fig. 4B, Materials and Methods, and fig. S16). The boundary between regimes III and IV (stable state) is determined by the occurrence of an energy barrier equal to thermal energy, i.e., $\Delta E = 1 k_B T$, where $K_a = 30 k_B T/nm^2 (\chi_{GT} = 12.43)$ (Fig. 5B).

Intriguingly, the boundaries between regimes I and II and between regimes III and IV quantitatively coincide with two boundaries distinguishing Brownian, Lévy, and directional dynamics (Fig. 5A). In particular, in the regime without pore, the sandwiched GO diffuses via Brownian dynamics with diffusion exponent α , from the power-law fit for MSD (inset of Fig. 5B), about 1; in the regime of stable pore, the GO exhibits directional ("ballistic") motion where $\alpha = 2$. Within the broad range of regimes II and III, Lévy walk emerges, with increasing α between 1 and 2. Actually, although regime III is mathematically distinct from regime II, the metastable pore in regime III can still behave like the unstable state due to the thermal fluctuations that readily surmount the lower energy barrier. Therefore, regimes II and III are physically equivalent. Thus, such a good overlap corroborates that the transition of transport patterns can be fundamentally attributed to various membrane-pore states. In the unstable state, the formation of the

pore leads to persistent walks, while the spontaneous annihilation of the pore causes intermediate jiggling, both of which combine to promote Lévy walk (Fig. 5C and movie S4). In stark contrast, the stable pore deviating from the GO center restrains the diffusion direction and favors directional motion (Fig. 5D and movie S5).

Particularly, the somewhat intractable nature of the GO material and complex biological responses makes it extremely challenging to isolate definite influences of proteins, such as biomolecular corona (45) and the proteins residing on the membrane (36), on the formation and dynamic behaviors of the sandwiched superstructures. However, we emphasize that the results conceived in the present work apply to the interaction of particles with cells under low (or absent) protein conditions, where the biological recognition is lacked but can, in itself, be very interesting for new modalities of interaction of particles with cells and thereby has an intrinsic scientific merit. Furthermore, our previous simulations have demonstrated that the sandwiched graphene–cell membrane superstructures can still occur when the fraction of the receptors is not larger than 0.1 for a tensionless membrane (29), whereas before contact with the particle, the receptor density does seem much lower (46) and a diffusive process is required for the increase of the receptor-density level (36).

Applicability of the sandwiched GO: Enhanced efficiency of membrane-specific drug delivery

To test the feasibility of membrane-specific drug delivery via the sandwiched structure, we selected tyrosine kinase inhibitors as the cargo, which could act against the transmembrane receptor (e.g., epidermal growth factor receptor), inhibit its catalytic activity, and lead to an anticancer effect (47). In comparison with the free drug vandetanib (VTB) and a classical carrier liposome (Lipo), GO significantly improves the drug cytotoxicity (Fig. 6A) and induces more death of cancer cells (Fig. 6B). Taking half-maximal inhibitory concentration as an example, the value in the GO-VTB group reduces to ~1.25 μ g/ml, which is nine- and sixfold lower than that in the free VTB and Lipo-VTB group, respectively. Similar results are also obtained in different cells and different membrane receptor inhibitors (fig. S20, C and D), which are irrelevant to the empty carrier (fig. S20, A and B). Such a synergism effect could be attributed to two effects. In addition to the moderate improvement in drug entry in view of the whole cell, GO also demonstrates its excellent properties in the selective import of a greater amount of drug into the membrane owing to the unique sandwiched structure

(Fig. 6C and fig. S20E). Consequently, more membrane receptors are disabled, leading to an aforementioned decrease in cell viability.

To rationalize the experimental observations, we design a doublemembrane system to simulate the membrane-specific drug deliveries from both the sandwiched GO and the intracellular region (see Materials and Methods, section S1, and fig. S6). Initially, the sandwiched GO carrying drug molecules and a cluster of drug beads are placed respectively in the membrane interior and the center of the intracellular region, with almost the same distance from the receptor (Fig. 6, D and E). Note that the sandwiched structure can still form the GO carrying drug molecules on its surface (see fig. S20F), and the drug molecules remain on the surface of the GO until it inserts into the cell membrane due to the stronger attraction between the lipid tails and the drug molecules (fig. S20G). After releasing the initial constraints for equilibrium, the drug beads diffuse along the membrane interior in the

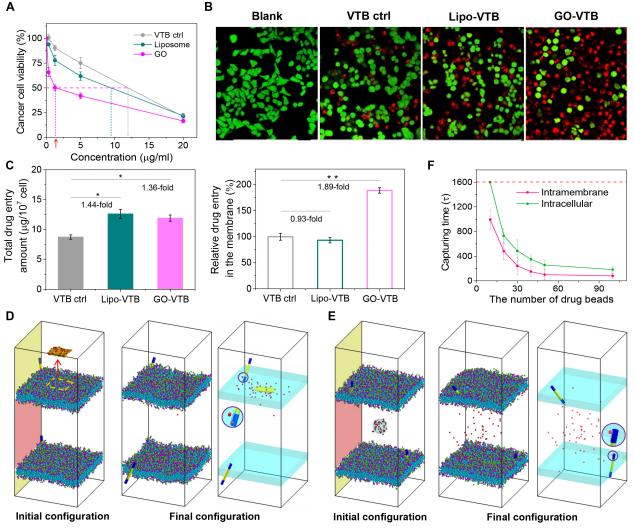


Fig. 6. The feasibility of delivering membrane-specific drugs via the sandwiched superstructure. (A) Relative cell viability of VTB with the assistant of GO or liposome in breast cancer cells MCF-7. Control, ctrl. (B) Corresponding live (green)/dead (red) images at a dose of 5 µg/ml. (C) Analysis of total drug entry amount and relative drug distribution in the cell membrane. (D) The initial and final simulation configurations of the drug beads undergoing the intramembrane delivery from a sandwiched GO. Left: The GO carrying drug beads is moved away from the membrane interior for the exhibition of its initial configuration, and the dashed square marks the contour of the sandwiched GO. (E) The initial and final configurations of the drug beads undergoing the intracellular delivery. In (D) and (E), the right panel with transparent membranes displays the final configuration, where the first drug bead is captured by the transmembrane receptor, as featured by the circle. (F) The capturing time as a function of the drug-bead number for the intramembrane and intracellular deliveries.

former system while they scatter within the intracellular region for the latter one (fig. S21). Here, the capturing time, defined as the period for the first drug bead to be bound by the receptor, is used to characterize the delivery efficiency, with a shorter capturing time indicating a higher efficiency (Fig. 6, D and E). As demonstrated in Fig. 6F and fig. S22, the statistics of the capturing time at different numbers of initial drug beads results in a good agreement with the experimental measurements shown in Fig. 6A, underpinning the enhanced efficiency of membrane-specific delivery for the sandwiched GO.

DISCUSSION

Here, we experimentally evidence the sandwiched graphene–cell membrane superstructure and theoretically demonstrate that the transport of such a 2D nanosheet integrated inside the cell membrane exhibits the transition of diffusion patterns from Brownian to Lévy and even directional dynamics, modulated by its interaction with the membrane interior. To gain insights into such an intriguing transition, we examine the details of the superstructures and first identify the sandwiched GO– induced pore in the leaflets of cell membranes by simulations, which is then validated by the experiments. In combination with the energetic analysis through a newly developed theoretical model, the pore is found to present unstable, metastable, and stable states. Last, a quantitative correlation between simulations and theoretical analysis corroborates that the transition of transport patterns of the sandwiched GO can be fundamentally attributable to the membrane-pore states that contribute to various directional persistence.

In light of the universal capabilities of the simulation models and the theoretical approaches, the results seem to be general for all the 2D nanomaterials. Thus, the information points toward the possible nature of the intramembrane transport of these emerging nanomaterials: the transition of transport patterns from Brownian to non-Brownian with programmable directional persistence. In principle, the findings of controllable pore states and resulting persistent transport within cell membrane have a bearing on establishing a guide for the design of novel 2D nanocarriers for precision drug delivery (e.g., targeting membrane receptors) and unique therapeutic approaches. Furthermore, such superstructures could also serve as a platform for the development of biosensors and electronic circuits where the lipid bilayer isolates the sandwiched GO from the electrically conducting physiological solutions present inside biological systems. We believe that our findings will certainly stimulate new efforts into the above promising topics of interest to materials scientists and physicists.

MATERIALS AND METHODS

GO preparation

The graphene nanosheets with a certain oxidization degree (26.1%) were prepared on the basis of previously established methods (*31*, *32*). In particular, following extensive sonication at high power for a total time period of 8 hours in the ice, the GO solutions were ultracentrifuged at 300,000g for 4 hours (Thermo Sorvall WX 100), and the ultrasmall GOs were acquired by discarding the centrifugation sediments while preserving the supernatant. The minimum and maximum radii of the SW rotor, i.e., R_{min} and R_{max} , are 66.7 and 158.8 mm, respectively. The vesicle density for GO is calculated to be 1.02. The online calculator http://vesicles. niifhm.ru showed that the cutoff size is 57 nm for the maximum 300,000g after 4 hours. To concentrate the GO nanosheets, the ultrafiltration process was required, and the GO samples were diluted in ultrapure water.

Cryo-TEM was used to provide further evidence of the sandwiched graphene-membrane superstructure. Primarily, lipid bilayer vesicles were formed from a dry film of DOPC (1,2-dioleoyl-sn-glycero-3-phosphocholine) via a miniextruder (100 nm of polycarbonate porous membrane). Afterward, the lipid bilayers and GO were mixed at a ratio of 5.6:1 and incubated for 2 hours at 20°C. By using a FEI Vitrobot rapid-plunging device, a 3.5- μ l mixture solution was flash-frozen on a Quantifoil support foil after 3 s of blotting with filter paper. Then, the frozen-hydrated grids were transferred to liquid nitrogen before imaging. Cryo-TEM images were acquired by a FEI Talos F200C TEM (200 kV) at 36,000× magnification (with a pixel size about 0.328 nm) and under low–electron dose conditions.

Cell culture

The murine macrophage cell line J774A (phagocyte, M ϕ) and the murine breast cancer cell line 4T1 (nonphagocyte, Non ϕ) were supplied from the American Type Culture Collection. J774A.1 and 4T1 were cultivated in Dulbecco's minimum essential medium and RPMI 1640 medium, respectively, at 37°C, 5% CO₂. Both media were added with 10% (v/v) fetal bovine serum, penicillin (100 U/ml), and streptomycin (100 U/ml). Unless specified, GO (5 µg/ml) incubation was used in most of the cellular experiments.

Cell imaging

Cells (2 × 10⁵/ml) were incubated with GO at 10 mg/ml for 3 hours. For confocal imaging, cells were fixed in 3.7% paraformaldehyde for 30 min, and the cell membrane was stained with a lipid probe, DiO (green). The GO-membrane interaction was initially imaged using confocal laser scanning microscopy (Leica TCS SP8) and further via HyVolution. Taking advantage of the intrinsic photoluminescence of GO in the near-infrared (NIR) region, the sample were excited at a 633-nm laser and monitored at an emission spectrum larger than a 700-nm wavelength during confocal imaging. The GO signal was marked by red.

For TEM imaging, cells were collected and fixed in 2.5% glutaraldehyde [pH 7.4, in phosphate-buffered saline (PBS)] for 1 hour at room temperature to maintain the ultrastructure of the cells as close to the living material. Following that, the samples were dehydrated through an ethanol series, passed through a propylene oxide, and then embedded in a liquid resin. Subsequently, the resin block was sectioned by a microtome (Lecia EM UC6), and the sections were collected and stained with electron-dense strains (1% lead citrate following 4% uranyl acetate) before observation. Further evidence of the GO-membrane sandwiched structure was acquired under a Hitachi H-7650B microscope.

AFM analysis

Cells were incubated with GO for 3 hours and then fixed in 3.7% paraformaldehyde in a 6-cm plastic dish. The cells with or without GO treatment were scanned by using an AFM (Bruker BioScope Catalyst) at a frequency of 1 Hz. To avoid confusing results regarding the heterogenicity on roughness and rigidity, we primarily scanned the whole cell and excluded the nucleus region via the AFM height analysis. Subsequently, the near-edge region (2.7 μ m by 2.7 μ m) as far from the nucleus as possible was scanned and recorded. For the roughness measurement, a plane fit was applied, and then, the statistical values (Rq) were calculated according to the heights of each pixel in the image by using NanoScope Analysis software. In addition, the 3D image was also provided with color-coded height information. To compute the Young's modulus of cell surface, the force curves were measured, and an indentation model (Sneddon conical) was fitted to the force curves.

LDH release assay

The total release of cytoplasmic lactate dehydrogenase (LDH) into the medium is a consequence of cellular integrity damage. Cells were seeded in a 96-well plate and treated with GO for 24 hours. The cells treated with LDH release solution were defined as positive control (P-ctr), while cells without treatment were defined as negative control (N-ctr), and the medium without cells was defined as blank control. The evaluation was based on a coupled enzymatic conversion from a tetrazolium salt into a formazan product, and the absorbance was measured at 490 nm by the Infinite M200 Microplate Spectrophotometer (Tecan). All values were normalized against the P-ctr (100% LDH leakage) and the blank control (0% LDH leakage).

FRAP analysis

Cells were seeded on a petri dish overnight to encourage adhesion, and then, 2 µl of the membrane fluorescent probe DiO (initial concentration, 1000 µM) was added. After a 20-min GO incubation (10 µg/ml), cells were immediately monitored by an UltraVIEW (Perkin Elmer) under a 100× oil objective. Regions of interest in the stained membranes were noted and photobleached using a 488-nm laser operating at 13% power. Single images were then collected at maximum speed. All FRAP data were analyzed with the prepackaged analysis software, which can fit the model to experimental data reasonably through a nonlinear curve fit to $f(t) = y + A \cdot e^{-kt}$.

QCM-D testing

Before testing the GO-lipid interaction, the lipid vesicles were formed according to a standard protocol. Briefly, 10 mg of 1,2-dilauroyl-snglycero-3-phosphocholine (DLPC; Sigma-Aldrich) was dissolved in 40 ml of chloroform. Under a nitrogen atmosphere, the lipid was dried onto the wall of a round-bottom flask by vortexing for 30 min at 25°C and then suspended in 1 ml of Milli-Q water. Lipid vesicles were formed by extruding 10 times through an 800-nm polycarbonate porous membrane (Avanti miniextruder) from the suspension to clarity. All the solvents, excluding the lipid vesicles, were sonicated before use to debubble. The first step in the actual experiment was to flush the QCM chip (Sensor Crystal QSX 301) using only Milli-Q water for at least 30 min, allowing the system to equilibrate. Subsequently, the suspension of lipid vesicles was injected, and the signal of bilayer formation was recorded. After a water rinse for removing any extra unfused vesicles, the GO suspension (20 µg/ml) was then injected in the QCM chambers. There is a linear dependence of frequency and mass change, also known as the Sauerbrey relation: $\Delta m = -C \frac{1}{n} \Delta f$.

Experimental statistical analysis

Statistical evaluations of data were performed by Student's *t* test for two groups and one-way analysis of variance for multiple groups. All results were expressed as mean \pm SD. **P* < 0.05 was considered statistically significant. *****P* < 0.0001.

Drug-loading procedure

To examine the efficacy of GO on delivering the membrane-specific drugs, the tyrosine kinase inhibitors were selected as the cargo, and classical liposome was used as a control carrier. Drugs (1 mg) were loaded on GO by using a simple adsorption method, and the loading efficiency was 73 and 74% for VTB and regorafenib (REGO), respectively. For drug-loaded liposomes, 1 mg of drug solution is primarily added to the liposome powder solvent (8 mg of DC-cholesterol and 2 mg of 1,2-distearoyl-sn-glycero-3-phosphoethanolamine (DSPE) phospholipid

were dissolved in chloroform). Subsequently, liposomes (~100 nm) were prepared following a typical procedure, including lipid hydration, stirring, and downsizing.

Cell viability test for the membrane-specific drug delivery

The cytotoxicity of the loading drugs (VTB and REGO) was tested by a cell counting kit (CCK8). Typically, 5000 cancer cells (4T-1 and MCF-7) were cultured in each well (100 µl) of a 96-well plate and allowed to adhere overnight. Cells were then treated with 10-µl serial dilutions of drug or carrier-loaded drug. We also prepared wells for background absorbance measurement that contains all empty carriers except cells. After 24 hours of cell-drug incubation, 10 µl of CCK8 was added to the cells and incubated for 1 hour at 37°C. The absorbance of a water-soluble formazan product was determined on an Infinite M200 microplate spectrophotometer (Tecan) at 450 nm, which was normalized to compare with the untreated cell control. For further confirmation, cells were seeded on a petri dish, and the cell viability was detected by a LIVE/DEAD kit. On the basis of good esterase activity of live cells and impaired membrane of dead cells, live (stained by green calcein) and dead (stained by red EthD-1) cells were imaged by a confocal imaging system (Leica TCS SP5).

Drug distribution analysis of the drug-loaded cells

Cells were seeded in a 10-cm plate overnight and were exposed to different drug solutions. After cell-drug interaction for 24 hours, 10⁷ cells were harvested and washed twice with PBS. To determine the drug distribution amount, cell membrane fractions were isolated by using a Membrane and Cytosol Extraction Kit. The drugs from different cell fractions were then extracted from the water phase (cell fraction suspensions) to the oil phase (chloroform). The amounts of drug importing into the membrane and total drug entering the cell were finally detected by using a liquid chromatography mass spectrometer (Thermo Scientific TXQ Quantum ACCESS Max) and by using a selective reaction monitoring model. To further delineate the relationship between the sandwich structure and the intracellular drug amount, the mean fluorescence intensity of cells was assayed by flow cytometry (Cytoflex), where the fluorescence was sourced from the sandwiched GO upon excitation by an 808-nm NIR laser.

Computer simulation methods

Computer simulations use the dissipative particle dynamics (DPD) technique (48), which extends the simulation scales of time and space to be appropriate to the study of nanoparticle-membrane systems with explicit water. The models of lipid, membrane, and GO are shown in fig. S6. The model of the amphiphilic lipid was constructed by a head group with three hydrophilic beads and two tails consisting of three hydrophobic beads. A total of 625 lipids self-assembled into a tensionless lipid bilayer membrane spanning the simulation box. Each GO was modeled by arranging the hydrophobic beads on a single layer of a face-centered cubic (fcc) lattice into a desired geometrical shape and size (29, 49). The modulus of the GO model was calibrated according to the experimentally found elasticity of graphene (49, 50).

In particular, the interaction parameter between GO and lipid tails, χ_{GT} , is varied to reproduce different oxidization degrees or chemical modifications of the GO. For example, increasing χ_{GT} indicates a higher oxidization degree of the GO due to the reduced attraction between GO and lipid tails. Upon interacting with the lipid bilayer membrane, the GO model leads to structures and dynamic behaviors similar to those constructed based on the typical structure model representing outcomes

from standard oxidization processes (see figs. S7, S8, S14, S15, and S19, and movies S1 and S2) (29, 51, 52). Furthermore, the results based on such a model are readily generalized to other 2D nanomaterials.

The size of our simulation box is $20 \times 20 \times 20 r_c^3$ and periodic boundary condition in all directions is taken into account, where $r_c = 0.7$ nm is the cutoff distance. To exclude the effect of system size on the diffusion of GO, we also performed simulations with a box size of $40 \times 40 \times 40 r_c^3$. All systems were pre-equilibrated for the first $10^4 \tau$ to confirm the equilibrium of the GO-sandwiched structures, while the production trajectories of the sandwiched GO are obtained from succeeding $4 \times 10^4 \tau$ simulations. Here, $\tau \approx 7.7$ ns and is the time unit used in the simulations.

In addition, to compare the efficiencies of drug delivery from a sandwiched GO and the intracellular region, we built a double-bilayer system, which divides the system into two regions: an "extracellular" region without drug bead and an "intracellular" region where the drug beads can be added into it (fig. S6). Each receptor, which will be targeted by the drug beads, is modeled as a cluster of frozen DPD beads grouped into a rigid body with fcc-arranged beads (53). Two pieces of lipid membranes have a total of 1952 lipids, with each membrane having 976 lipids. The size of such a simulation box is $25 \times 25 \times 60 r_c^3$. The lower membrane is $10 r_c$ away from the bottom of the box, while the upper membrane is $20 r_c$ away from the top. Drug beads are represented by a single DPD bead.

More details on the simulation methods, models, and data analysis are given in section S1.

Development of an analytical model for the states of the sandwiched GO-induced pore

The detailed deduction can be found in section S2. Briefly, the energy cost of pore formation, E_{R} , is determined from the governing equation

$$E_R = 2\pi\gamma R - K_a \frac{\pi a^2}{A_m} R^2 + K_a \frac{\pi^2}{A_m} R^4 \tag{1}$$

which originates from the balance of energies of both membrane tension and line tension of the pore. Here, *R* and γ are the radius and the linear tension of the pore, respectively. *A*_m denotes the membrane area. *a* is the edge length of the GO. By minimizing Eq. 1, a local energy maximum at smaller *R* and a local energy minimum at larger *R* can be identified, and the transition point occurs at $K_{a0} = \frac{\gamma A_m}{a^3} \sqrt{\frac{27}{2}\pi}$. When

 $K_a > K_{a0}$, a straightforward calculation of the minimum leads to the relation between the pore area and K_a

$$\frac{\pi R^2}{a^2} = \frac{2}{3} \cos^2 \frac{\theta}{3}$$
 (2)

where $\theta = \arccos\left(-\frac{\gamma A_{\rm m}}{K_a a^3}\sqrt{\frac{27}{2}\pi}\right)$.

Determination of the relation between GO–lipid tail interaction energy and *N*

The GO-lipid tail interaction energy, E_a , can be calculated as

$$E_a = K_a (a^2 - \pi R^2) \tag{3}$$

In the simulations, the area of the sandwiched GO–induced pore is indicated by *N*, i.e., the number of GO beads that contact solvent. Thus,

 $\pi R^2/a^2 = N/N_{\text{max}}$ where N_{max} is the maximum of GO beads contacting solvent. After substituting this equation into Eq. 3, the interaction energy between GO and lipid tails reads

$$E_a = -\frac{K_a a^2}{N_{\text{max}}} N + K_a a^2 \tag{4}$$

In DPD, E_a can be estimated through summarizing the conservative energy (54) between these two types of beads, E_S . However, to eliminate the purely repulsive nature of the interaction potential adopted in DPD, E_S should be amended by subtracting excess repulsion at $\chi_{GT} = 0$, E'_S , so that the interaction energies at $K_a = 0$ and $\chi_{GT} = 0$ are equal. Thus, $E_a = E_S - E'_S$.

SUPPLEMENTARY MATERIALS

Supplementary material for this article is available at http://advances.sciencemag.org/cgi/ content/full/5/6/eaaw3192/DC1

Section S1. Details of simulation methods, models, and data analysis

Section S2. Details of analytical models

Fig. S1. Characterizations of the prepared 2D material of GO.

Fig. S2. Cryo-TEM images of the blank liposomes, the formation process of the sandwiched GO superstructure, and the sandwiched structure at different detection angles.

Fig. S3. Tomography views of the 3D map for the GO-membrane superstructure and the blank liposome vesicles.

Fig. S4. A series of TEM images of the GO–cell membrane interaction and the cells after exposure to different dimensional materials.

Fig. S5. The interaction between GO and the cells.

Fig. S6. Molecular models for the individual entities used in the simulations.

Fig. S7. Translocation pathways of GO across the lipid membrane toward the sandwiched GO structure.

Fig. S8. Translocation pathways of GO, with the model representing outcomes from standard oxidization, across the lipid membrane.

Fig. S9. The displacement probability distributions and the translational diffusion coefficients of the GO sandwiched inside the membrane.

Fig. S10. A schematic diagram illustrating the definition of the turning angle between the neighboring persistent segments.

Fig. S11. Diffusive properties of GO with $\chi_{GT} = 7.15$.

Fig. S12. Transition of diffusion patterns of the sandwiched GO from Brownian to Lévy and even directional dynamics with a membrane size of 40 \times 40 r_c^2 .

Fig. S13. Diffusive dynamics and membrane-pore states of a circular GO.

Fig. S14. Simulation results demonstrate various membrane-pore states and the mechanism of pore formation.

Fig. S15. Representative snapshots from simulations feature the sandwiched GO-induced pores in the single leaflet of cell membranes.

Fig. S16. The energy of the sandwiched GO-induced pore as a function of the radius of the pore *R* at $K_a \ge K_{a0}$ ($K_{a0} \approx 25 k_{\rm B}T/{\rm nm}^2$).

Fig. S17. Correlation between the analytical model and simulation results.

Fig. S18. Diffusive dynamics of lipids varies from Fickian to superdiffusive.

Fig. S19. Sandwiched GO-induced pores in the single leaflet of the cell membrane for the GO model representing outcomes from standard oxidization processes.

Fig. S20. The efficacy of the GO-sandwiched structure on drug delivery.

Fig. S21. Diffusive dynamics of a representative drug bead captured by the transmembrane receptor.

Fig. S22. Probability distribution of the capturing time for the drug beads released from the sandwiched GO and the center of the intracellular region.

Movie S1. Detailed translocation pathway of GO across the lipid membrane toward the sandwiched GO structure at χ_{GT} = 15.73.

Movie S2. Detailed translocation pathway of the GO model, representing outcomes from standard oxidization processes with the oxidation degree $p_O = 0.3$, across the lipid membrane toward the sandwiched GO structure.

Movie S3. Detailed diffusive dynamics of a sandwiched GO exhibiting Brownian motion at χ_{GT} = 1.43.

Movie S4. Detailed diffusive dynamics of a sandwiched GO exhibiting Lévy walk at $\chi_{GT} = 10.01$. Movie S5. Detailed diffusive dynamics of a sandwiched GO exhibiting directional motion at $\chi_{GT} = 14.3$.

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