

Oriented collagen fibers direct tumor cell intravasation

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In this work, we constructed a Collagen I–Matrigel composite extracellular matrix (ECM). The composite ECM was used to determine the influence of the local collagen fiber orientation on the collective intravasation ability of tumor cells. We found that the local fiber alignment enhanced cell–ECM interactions. Specifically, metastatic MDA-MB-231 breast cancer cells followed the local fiber alignment direction during the intravasation into rigid Matrigel (~10 mg/mL protein concentration).

cancer | intravasation | collagen | oriented invasion | microenvironment

M etastasis is a lethal milestone in cancer: Cells escape from the confinement of primary tumor sites (intravasation), invade tissues as well as the lymphatic and vascular systems, and finally colonize (extravasation) distant sites. It has been estimated that less than 1% of tumor cells undergo this process, but metastasis contributes to more than 90% of cancerrelated deaths (1, 2). Metastasis involves both genetic and epigenetic alternation of tumor cells, as well as external biochemical and biophysical microenvironments (3–5). Pathology studies suggest that metastatic tumor cells exhibit highly branched morphologies and distinct aligned registration with aligned extracellular matrix (ECM) during metastatic tumor progression (4, 5).

We address three important questions concerning metastasis. (*i*) Can we build in vitro complex ECM structures with heterogeneously oriented collagen fibers and basement membrane components to mimic the cancer cell intravasation process? (*ii*) How does aligned collagen influence cell intravasation into/ through the basement membrane before entering vessels? (*iii*) After cell detachment from the primary tumor site, how does a heterogeneous ECM with a varying degree of local fiber alignment influence cell intravasation and subsequent penetration into the basement membrane during their intravasation process? The major obstacle to addressing these questions is the difficulty in constructing both an in vitro 3D microenvironment to mimic the above process and flexible controls of the environmental parameters, such as fiber orientations in a complex collagen/Matrigel composite, nutrition, oxygen, drug concentrations, etc.

In breast cancer metastasis, cancer cells are believed to reorganize and progress through the interstitial ECM matrix, break through the basement membrane, and enter blood vessels or lymphatic capillaries (6-10). Fig. 1C presents a schematic illustration of the intravasation process in metastasis. Tumor-associated collagen signatures (TACS), basically environmentally elevated collagen density and collagen fiber reorganization, are used to stage mammary carcinoma tumor progression levels (6, 11-13). Fig. 1 presents hematoxylin/eosin (H&E)-stained biopsy slices of breast cancer imaged by second harmonic generation (SHG) under a two-photon confocal microscopy (A1R MP; Nikon) (detailed information provided in SI Appendix, SI Text) (6, 14, 15). Fig. 1 A, 1-3 shows the stained human invasive ductal carcinoma tumor at grade I. In the enlarged figures (Fig. 1 A, 2 and 3), the cells have well-defined borders between the epithelium (gray) and stromal collagen (blue). The collagen fibers with higher density

surrounding the tumor lesion are parallel to the tumor boundary, where the collagen is located but without obviously specific alignment (termed TACS-1) (12). Fig. 1 *B*, 1-3 represents invasive ductal carcinoma at grade III. In this case, after cell development, collagen fiber (blue) and tumor cells (gray) have more mixed forms. Clearly, the filament-like collagen fibers show macro alignment along the cell invasive directions (termed TACS-3) (12), which is believed to correlate with cell invasive potential in human tissues.

Recently, a number of mouse models and in vitro 3D cell culture systems have been used to study the cell underlying molecular and mechanical mechanisms for local collagen fiber reorganization and alignment. These experiments showed that epithelial cells and fibroblasts are capable of using associated proteins to initiate the Rho- and Rho kinase (Rock) pathway and then mediate actinmyosin contractility to orient collagen fibers (13, 16–18). However, it remains difficult to analyze the influences of the reorganized collagen tissue on tumor cells so far. The reason for that is mainly because precise quantification of reorganized collagen tissue in vivo is significantly restricted by existing methods. Therefore, in vitro 3D models have been constructed to build linear oriented matrices in microchannels by mechanical strain and have demonstrated that 3D matrix alignment facilitates persistent migration of tumor cells (9, 19-22). For example, Jimenez Valencia et al. studied cell behaviors in and around spheroids, which could be regarded as a tumor model at an early stage of the intravasation process. The analysis showed that the cells aligned perpendicularly to the spheroid surface due to applied traction forces from the cells in the spheroid to reorganize the collagen matrix (23). Although the density and alignment of fibrillary collagen are clearly important markers in diagnosing a human breast carcinoma's stage (12, 14), biopsies merely provide static "snapshots" of the morphology

Significance

Intravasation is an early stage of metastasis that involves metastatic cells moving from the tumor into the extracellular matrix (ECM), breakthrough of the basement membrane, and entry into blood vessels. We found that the oriented fibers greatly enhance and facilitate the metastatic cell intravasation process during metastasis. We suggest that a possible "tissue treatment" therapy could be considered, in which the ECM fiber structure orientation in the tumor microenvironment might be altered to minimize the intravasation rate of metastatic cells.

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Fig. 1. Clinic biopsy of breast carcinoma progression at early (TACS-1) and late (TACS-3) stages. (A, 1-3) show the H&E-stained slices of tumor cell development during the TACS-1 stage. (A, 2) A second harmonic generation (SHG) image illustrating the complexity and variability of collagen localization. Combined with bright-field cell images, it seems that the locally dense collagen matrix surrounds ducts with a spherical morphology. For TACS-3 (B, 1-3), the tumor cells (gray color in B, 3) seem to interact with the parallel aligned collagen fibers for their invasion. (C) Drawing illustrating that metastatic tumor cells interact with oriented ECM fibers and invade toward the basement membrane and vessels during the intravasation process. The color depth represents the nutrient gradient in the tissues; higher nutrition in vessels is an attraction for cell intravasation into tissues.

of cells and collagen fibers. Further, although there have been constructs of homogeneous localized collagen alignments and of systematic quantified fiber alignment and associated cell displacement (9), a basic in vitro 3D ECM model for intravasation study should at least include structures mimicking both the interstitial matrix (collagen) and basement membrane (Matrigel), with various degrees of heterogeneities (e.g., locally oriented Collagen I fibers).

Materials and Methods

To investigate the effects of collagen alignment on the intravasation process, we created an engineered microenvironment within a microfabricated chip, using layered Collagen I and Matrigel with controllable heterogeneities in in vitro intravasation studies, as shown in Fig. 2A. The heterogeneous landscape is constructed within a microfabricated chip, shown in Fig. 2. The

pillar-like inner structures would efficiently stabilize gel structures inside and avoid unflavored mechanical influence by the fluid at the side channels (24).

Matrigel (100% concentration, 356237; Corning) and Collagen I (2 mg/mL in water, 354236; Corning) created the sandwiched ECM. The heterogeneous Collagen I orientation was induced by internally developing strain fields due to the Matrigel volume swelling upon setting (25–29). Fig. 2*B* shows the heterogeneous microenvironment made of the mechanically organized Collagen I–Matrigel composite structure (sandwiched ECM). Collagen I was injected while fluid into the Matrigel (Fig. 2 *C*, *1* and *2*). During the composite ECM solidification, the Matrigel volume expanded while the Collagen I section shrank (*SI Appendix*, Figs. S11 and S12). Although the ECM interface was reshaped, Fig. 2 *C*, *3* shows using cryo-Scanning Electron Microscope (FESEM, SU8010; Hitachi) imaging that the interface still remained distinct, indicating that Collagen I and Matrigel had little to no diffusion or mixing at the interface. Detailed information is provided in *SI Appendix, SI Text*.





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To identify the interface reshaping the Collagen I matrix section, fluorescent and reflection modes (30) of the confocal microscopy were used to characterize the Collagen I (blue region) and the Matrigel (mixed with green fluorescent beads) regions, respectively. Fig. 3A is a top view of the 3D reconstruction images on the composite ECM region and shows that Collagen I fibers form peninsula-like protrusions with significant perpendicular orientation at the tips after 24 h. In the 3D image reconstruction, images of green fluorescent beads in Matrigel layers do not overlap with Collagen I. Fig. 3B shows the corresponding 3D profiles in the vertical direction (z axis). Collagen I fibers connected with Matrigel were significantly reorganized and reoriented after being squeezed by Matrigel swelling from the top and bottom sides (SI Appendix, Fig. S9C). Fig. 3 C, 1 and C, 2 shows the detailed fiber morphology at the Collagen I-Matrigel boundary (red boxed region) as well in the bottom Collagen I region (green boxed region). Fig. 3 C, 1 shows that the fibers realigned in regular patterns and were perpendicular to the interface. The length of the longest visible fiber was about 30 µm. This observation implies that the collagen fibers have possibly infiltrated the Matrigel. The fiber density increased at the Collagen I bottom region (Fig. 3 C, 2). For comparison, Fig. 3 C, 3 shows the control experiment of pure and homogenous Collagen I at the same concentration with random fiber orientation.

The Curvelet-Based Alignment Analysis software (University of Wisconsin at Madison) was used to quantitatively analyze the Collagen I fiber orientation (Fig. 3 *C*, *1* and *2*) in sandwiched ECM and pure Collagen I in the control experiment (Fig. 3 *C*, *3*). Fiber orientation was quantified by measuring its angle relative to the channel direction (*x* axis), and angle frequency was plotted as a function of its distribution. Each bar represents the angle frequency within \pm 2.5°. In Fig. 3 *D*, *1*, the analysis shows that the majority of fibers in the protrusion tip region were oriented along the vertical direction toward the Matrigel region. However, in the Collagen I bottom region (Fig. 3 *D*, *2*), the majority of the fibers were oriented in a wide distribution centered at 0°, possessing on average parallel orientations to the ECM channel. In the control experiment, the same analysis on the pure Collagen I showed random orientation of the fibers (Fig. 3 *D*, *3*). A complete landscape of the distribution of collagen fiber orientation is plotted as a function of the position of collagen fiber in the sandwiched ECM in *SI Appendix*, Fig. S10.

In our system, the formation of the oriented collagen fiber landscape was controlled by the internal strain field inside the composite gels during the sandwiched ECM injection and Matrigel squeezing process. First, the injection of liquid Collagen I into viscous liquid Matrigel led to external forces that constrained the macroscopic shape of the Collagen I fiber network during gelation (31, 32). Further, the swelling Matrigel anisotropically squeezed specific Collagen I regions after immersion in the culture medium, leading to further fiber reorientation and reorganization.

To verify this scenario, we used a confocal microscope to take time-lapse images of the displacements of fluorescent beads in the composite ECM for 300 min continuously after immersion in culture medium. The tracked traces of the red fluorescent beads indicated their spatial movements in Collagen I region, and the yellow green fluorescent beads provided directions and degrees of the Matrigel deformation. The continuous tracking data were analyzed using the software Imaris (Bitplane), and the spatial displacements of the beads were plotted as a function of time, as shown in Fig. 4A. The *z* axis sectional view of displacement (Fig. 4A) during the tracking process indicates that the displacements of fluorescent microspheres in Collagen I were mainly constrained in the *y*-*z* plane and pointed to the center of the ECM channel. Our result indicates that the strain field in the latter process had major contributions to the heterogeneous collagen fiber reorientations (*SI Appendix*, Figs. S12 and S13).

The displacement field obtained via bead tracking was used to estimate the stress field in the system. In our analysis, elasticity was assumed for both Collagen I and Matrigel. Although both materials may exhibit certain viscoelastic behavior, we expected the estimated stress field qualitatively to represent the actual stress field in the system. Because the Collagen I section and the inside fiber orientation was our primary concern, its confocal image was reconstructed in 3D and subsequently used to analyze the stress inside. Our analysis indicated that σ_x , σ_y and τ_{yz} have major contributions to fiber orientation distribution (complete analysis of the strains provided in SI Appendix, Stress Field in Collagen I and Matrigel) (SI Appendix, Fig. S2). The normal stress σ_v was mainly due to the resistance of Matrigel to the intrusion of Collagen I, and the shear stress τ_{xy} and τ_{xz} fluctuated around zero. Therefore, these stress components did not significantly contribute to the observed fiber orientation correlations. As shown in Fig. 4 (and *SI Appendix*, Movie S1). it could be clearly seen that, close to the Collagen I-Matrigel interface (i.e., the extruded border of Collagen I shown in Fig. 4 C and D), the system is under biaxial compression. This stress state could be understood as follows: In response



Fig. 3. Analysis of collagen fiber orientation in the sandwiched ECM after formation. (*A*) The 3D confocal image reconstruction via image stacking (top view) shows the Matrigel/collagen composite ECM and their interface in three dimensions. (*B*) The cross-sectional view (side view) of the 3D ECM shows that the Matrigel affected the local morphology of collagen In the interface region. (*C*, 1) The collagen fibers near the interface region possess vertical orientations (red box). (*C*, 2) The collagen fibers in the centered region possess horizontal orientations (green box). Correspondingly, *D*, 1 and 2 demonstrates the orientation distribution analysis of the collagen fibers in the "vertical" and "horizontal" regions, respectively. The angle of fiber orientation is defined as the *Inset* in *D*, 1. As a comparison, *C*, 3 and *D*, 3 show the collagen fiber organization and orientation distribution in pure collagen as the control experiment. The quantitative analysis of the fiber orientation in the vertical region yielded a strong peak around 90° perpendicular to the ECM interface whereas the fiber orientation distribution in the horizontal region possesses peaks around 0°. The fibers in the pure collagen were randomly oriented and possessed a uniform distribution of angles.

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Down



Fig. 4. Dynamic strain field and analysis in the ECM. (A) Displacement field of fluorescent beads imbedded inside the collagen (red) and Matrigel (green). (B) A 3D reconstructed image of the beads' spatial distribution in the collagen region, with an illustration of action directions of different stress components. (*C*–*E*) The stress components σ_{x1} , σ_{z2} , and τ_{y2} in collagen. The results showed that large compressive normal stresses σ_x and σ_z led to a strong biaxial stress state and thus caused the reorientation of collagen fibers along the *y* direction in regions close to the extrusion front. The large shear stress τ_{yz1} , induced by the relative motion of two successive thin layers of collagen parallel to the *y*–*z* plane, could lead to significant fiber rotation and, thus, fiber realignment along the *x* direction.

to the osmotic pressure and Matrigel volume swelling, the convex extrusion front of Collagen I was "squeezed," leading to large compressive normal stress σ_x and σ_z . Such strong biaxial stresses caused the reorientation and local alignment of collagen fibers along the y direction in regions close to the extrusion front, which is consistent with the quantitative analysis of the confocal micrographs (Fig. 3 C, 1). In the middle region of the Collagen I system that was analyzed previously, both the normal and shear stresses fluctuated and thus could not lead to significant alignment of the Collagen I fibers. This result was consistent with the low degree of orientation correlations among the fibers observed in the confocal micrograph. On the hand, a large shear stress $\tau_{\rm VZ}$ was observed at the bottom of the Collagen I region we analyzed (Fig. 4E). As the Collagen I region close to the extrusion front was squeezed to the middle, the Collagen I away from the front was also "dragged" to the middle, leading to the observed large shear stress τ_{yz} (Fig. 4*E*). Such a shear stress, which could be considered as caused by the relative motion of two successive thin layers of Collagen I parallel to the y-z plane, could lead to significant fiber rotation and thus alignment along the x direction, which is consistent with the strong fiber alignment in the horizontal direction observed in the confocal micrograph (Fig. 3 C, 2).

Results and Discussion

Cell Behavior Heterogeneity of MDA-MB-231 Cells in the Composite ECM. Metastatic breast cancer cells (MDA-MB-231) (Xiehe Medical University Cell Culture Center) were mixed with the Collagen I and injected inside the chip with the collagen. They were used to characterize the influences of oriented collagen on collective cell invasive behavior. The orientation of MDA-MB-231 cells inside the ECM was quantified by ImageJ and then displayed as population distributions of the measured angles. Because cell nucleus shape mostly represents its morphological change (33–35), the MDA-MB-231 cells were stained with Hoechst so that their nuclei would be visible under the confocal microscopy.

Fig. 5A presents the integration of the bright-field and fluorescent images of cells at 96 h. The blue color indicates the nucleus position. The cells in the Collagen I region exhibited a highly heterogeneous orientation. Fig. 5 B, 1–3 shows the enlarged brightfield images of the boxed regions shown in Fig. 5A. Fig. 5 C, 1–3 presents the fluorescence images of cell nucleus orientations. In particular, Fig. 5 B, 1 and C, 1 shows that, inside the tip regions, the cell morphology and nucleus shape revealed that MDA-MB-231 cells assumed a vertical orientation through the ECM interface. Behind the tip zone, the yellow boxed region shows that the distribution of tumor cell orientation was gradually changed from the vertical direction to a random orientation (Fig. 5 B, 2 and C, 2).



Meanwhile, in the middle region of Collagen I, the cells presented a horizontal orientation (Fig. 5 B, 3 and C, 3).

The distributions of tumor cell orientation in different regions were analyzed using Curvelet-Based Alignment Analysis software and plotted as population distributions of the measured angles. In the tip zone, tumor cells formed cell branches, and there were more than 25% of tumor cells possessing orientations distributed around 90° (Fig. 5 D, 1). The cells around the ECM interface region (yellow box) exhibited almost uniform angular distribution (Fig. 5 D, 2). The orientations of cells in the middle region were mostly distributed around 0° and 180° (Fig. 5 D, 3). These results show that the cell orientation distribution was highly consistent with the distribution of Collagen I fiber orientation in the composite ECM. On the other hand, in the control experiment with pure and homogenous Collagen I (SI Appendix, Fig. S13), MDA-MB-231 cells had a random orientation distribution (detailed information provided in SI Appendix, SI Text). This observation indicates that the composite heterogeneous ECM had strong guidance for the orientation of MDA-MB-231 cells via the locally reorganized Collagen I fibers.

Enhanced MDA-MB-231 Cell Intravasation into the Matrigel Region. Fig. 6 A, 1-3 presents bright-field pictures taken by confocal microcopy and show the MDA-MB-231 cell intravasation toward the Matrigel region with time. Fig. 6 B, 1-3 shows the fluorescence images showing the relative positions of the invading cells within the ECM network. At 0 h, MDA-MB-231 cells were distributed randomly in the Collagen I region, most of which were more than 100 µm away from the ECM interface (indicated by the green fluorescent beads). After 48 h, the cells moved toward the interface with significantly increased cell numbers due to rapid cell proliferation. Some cells, as indicated by the arrow, already had a vertical orientation approach and had begun to enter the interface (Fig. 6 B, 2). After 96 h, the Collagen I shrinkage continued and significantly drove the gel interface to the center. However, the pioneering cell still invaded more than 200 µm deep into the Matrigel (100% concentration) region, as indicated by the white arrow in Fig. 6 B, 3). The major cell intravasation exhibited a collective behavior in the form of "single stream" branches (36). The cell intravasation speed was about 3 µm/h. Note that the



Fig. 5. Tumor cell in vitro intravasation in the heterogeneous ECM with various degree of local collagen fiber alignment. (*A*) The distribution of invading tumor cells in the sandwiched ECM after 96 h (*B*, 1–3 and *C*, 1–3). Enlarged *Insets* respectively show the bright field and fluorescent images of the spatial distribution and morphology of cells invading in the Matrigel region (*B*, 1 and *C*, 1), the aligned collagen region (*B*, 2 and *C*, 2), and the randomly oriented collagen region (*B*, 3 and *C*, 3). The *Insets* in *C*, 1–3 illustrate the magnifications of the corresponding areas, representing alignments of the cell nucleus (vertical, random, and horizontal alignment, as indicated by arrows). (*D*, 1–3) The quantitative analysis of cell orientation distributions in the aforementioned corresponding regions.

BIOPHYSICS AND OMPUTATIONAL BIOLOG Collagen I fibers and the orientation became indistinct under the reflection mode of confocal microscopy (indicated by the yellow arrow in Fig. 6 *B*, *3*), which suggests that the Collagen I fiber network was remodeled during the cell intravasation. In this process, the cancer cell should express matrix metalloproteinases (MMPs) that degrade the ECM, generate local paths, and help the cell invasion (37). At the 144th hour (Fig. 6*C*), the front cells successfully crossed the entire Matrigel region, which suggests that, even if there may be some infiltration of the collagen fibers in the Matrigel, the influence goes much further than their penetration lengths because cells could travel a much longer distance in the Matrigel after passing the interface. As a control, in homogeneous collagen, MDA-MB-231 were unable to invade the Matrigel (see *SI Appendix, Cell Invasion Process from Homogeneous Collagen to Matrigel* and *SI Appendix*, Fig. S1).

Weak Intravasation of MCF-7 Cells in the Heterogeneous ECM. In the control experiment, weakly metastatic breast cancer cell line MCF-7 cells (Xiehe Medical University Cell Culture Center) were also cultured in the composite ECM structures (Fig. 7). The MCF-7 cells exhibited spherical morphologies and more proliferation than intravasation. After 168 h, the cells aggregated and formed spheroid-like structures, which did not exhibit obvious intravasation into the Matrigel region. This result indicates that MCF-7 cells are unable to acquire enhanced invasive potentials from the prealigned Collagen I fibers. It would seem that metastatic cancer cells (such as MDA-MB-231 cells) are more sensitive to an orientated collagen fiber environment, which may benefit and enhance cell invasive potentials along the intravasation process. Opposite to that, the same environment would not affect the intravasation of weak metastatic cells (such as MCF-7 cells).

Conclusions

Our analysis and results show that the orientation of the Collagen I matrix can lead to significantly enhanced tumor metastatic potential. To further elucidate possible mechanisms for the enhanced intravasation, we used a minimalist 3D cell migration model that incorporates the effects of both a collagen network microstructure and a local fiber stress state on cell migration (see *SI Appendix, Computational Model for 3D Single Cell Migration in ECM*) without explicitly considering the effects of chemotactic cues. Specifically, we considered polarized actin polymerization (correlated with migration direction) and biased focal adhesion formation depending on the stress state of the fiber segments, leading to directed cell motions. On the other hand, the active



Fig. 6. The enhanced intravasation process of MDA-MB-231 cells in the composite ECM. (A, 1-3) The bright-field images showing snapshots of invading cells taken every 48 h. (B, 1-3) The fluorescent images combined with reflective mode, which show the Matrigel region with green beads embedded, the collagen region (blue), and the nuclei of invading cells (red). It is clear that, at the 96th hour, guided by oriented collagen fibers, the cells aggregated and strongly invaded into the rigid Matrigel region in single-stream forms. The field of view is the same for A, 1-3 and B, 1-3. (C) Cells broke through the Matrigel region and reached the side channel at the 144th hour, indicating the long-distance influence of the collagen fibers in enhancing the intravasation process of MDA-MB-231.

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Fig. 7. Proliferation and intravasation of weak metastatic MCF-7 cells in the composite ECM at the 0 h (*A*) and 168th hour (*B*), respectively. The enlarged image (*C*) shows that the cells present weak invasive behaviors, with spherical and sheet-like morphology inside the collagen matrix.

contraction of actin filaments also generated forces on the fibers mechanically coupled to the cell cytoskeleton via focal adhesion sites, and the forces propagated via the fiber network to cells at distant locations. Our simulations suggest that an oriented fiber network could lead to much stronger migration persistence for individual cells due to contact guidance (*SI Appendix*, Figs. S3–S6) and to collective directional migration for multiple cells due to both contact guidance and mechanical regulation (*SI Appendix*, Figs. S7 and S8). The resulting highly directional migration persistence could be responsible for the large penetration depth (~200 µm) in the Matrigel (Fig. 6 *B*, 1–3) and even the breakthrough (Fig. 6*C*). This depth is much larger than the thickness of the interface layer (~20 µm), suggesting that the cells acquire enhanced invasive potentials during the contact guidance or mechanical regulation.

It is known that radiotherapy, to some extent, promotes the specific alignment of the Collagen I matrix (38-41). Therefore, in light of our study, if there are tumor cells that have survived the treatment and proliferated after therapy, the oriented fiber network may drive their subsequent aggressive metastasis. We suggest that future therapy should consider treatment of the tumor physical microenvironment. The patients could receive a "tissue therapy" that alters the tumor microenvironment (e.g., to recover local ECM fiber orientation to the original unoriented state), to minimize the aggressive intravasation of the metastatic cancer cells. Some strategies have been developed to inhibit fiber formation and/or disassembly of the fibers: For example, physical (e.g., light, heat, and electrical field) (42-44) as well as chemical (45, 46) agents have been applied to this topic. Among the above methods, use of the nanomaterial graphene oxide to transform the energy of near infrared (NIR) light to thermal energy and consequently induce disassembly of the preformed fibers of the amyloid protein (47) might be applied using a spatiotemporal controllable photo-thermal treatment. We suggest that this approach seems most likely to match the concept of tissue therapy that we propose.

Our results provide strong evidence that, besides intrinsic properties such as genetics and morphology, the tumor microenvironment of local Collagen I fiber orientations plays an important role in guiding cell intravasation, promoting cell breakage into the basement membrane before entering the circulation systems. Our finding not only agrees with clinical biopsies of breast cancer metastatic cell intravasation, but also systematically reveals the process and mechanism of ECM enhanced cell intravasations during intravasation in a quantitative way. We propose that future therapy could consider tuning tumor biophysical microenvironment: e.g., recovering ECM fiber orientations and using local tissue treatment to reduce the intravasation potential of metastatic cancers.

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