# A 3D biophysical model for cancer spheroid cell-enhanced invasion in collagen-oriented fiber microenvironment\*

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The process of *in situ* tumors developing into malignant tumors and exhibiting invasive behavior is extremely complicated . From a biophysical point of view, it is a phase change process affected by many factors, including cell-to-cell, cell-to-chemical material, cell-to-environment interaction, etc. In this study, we constructed spheroids based on green fluorescence metastatic breast cancer cells MDA-MB-231 to simulate malignant tumors in vitro, while constructed a threedimensional (3D) biochip to simulate a micro-environment for the growth and invasion of spheroids. In the experiment, the 3D spheroid was implanted into the chip, and the oriented collagen fibers controlled by collagen concentration and injection rate could guide the MDA-MB-231 cells in the spheroid to undergo directional invasion. The experiment showed that the oriented fibers greatly accelerated the invasion speed of MDA-MB-231 cells compared with the traditional uniform tumor micro-environment, namely obvious invasive branches appeared on the spheroids within 24 hours. In order to analyze this interesting phenomenon, we have developed a quantitative analyzing approach to explore strong angle correlation between the orientation of collagen fibers and invasive direction of cancer cell. The results showed that the oriented collagen fibers produced by the chip can greatly stimulate the invasion potential of cancer cells. This biochip is not only conducive to modeling cancer cell metastasis and studying cell invasion mechanisms, but also has the potential to build a quantitative evaluation platform that can be used in future chemical drug treatments.

#### Keywords: 3D biochip, spheroids, MDA-MB-231 cells, oriented collagen fibers, cancer cell invasion 10

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# 12 **1. Introduction**

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Cancer has become a major health problem worldwide 13 14 with increasing morbidity and mortality, and has attracted 15 widespread attentions. Breast cancer is one of the most com-16 mon cancers, which accounts for 30% of the confirmed cancer <sup>17</sup> cases in 2019.<sup>[1]</sup> The main threat of cancer is the high fatality 18 rate, especially as cancer cells invade and metastasize, caus-<sup>19</sup> ing up to 90% of death of cancer patients.<sup>[2,3]</sup> In clinic, tumor <sup>20</sup> growth in primary sites could be surgically removed at its early <sup>21</sup> stage.<sup>[4]</sup> However, after the tumor has developed to a certain 22 extent, the cancer cells will detach from the primary tumor site 23 and transfer to the extracellular matrix (ECM), which leads to 24 the surgically removing invalid.

Figure 1 is a schematic diagram of tumor local invasion 25 26 and infiltration in vivo. At the first stage, the tumor is sur-27 rounded by a rich extracellular matrix, and these collagen 28 fibers are randomly oriented (black). At the second stage, 29 the cancer cells start to invade locally and change the orien-

30 tation of the collagen fibers (green fibers) with the growth of 31 the tumor. Meanwhile, the presence of the nutritional gradient 32 would establish rapidly along the collagen fibers. At the third 33 stage, cancer cells destroy the blood vessel wall, penetrate the <sup>34</sup> blood vessel and migrate to other parts of the body with the cir-35 culation of blood or lymph fluid. The result is to damage other 36 parts and functions of the body, leading to the death of the pa-37 tient. Due to the randomly scattered sites of cancer metastasis, 38 it is difficult to achieve the desired results with single surgery, <sup>39</sup> chemotherapy, drugs, *etc*.<sup>[5]</sup> Therefore, it is essential to de-<sup>40</sup> velop clinically more effective treatment methods based on the 41 characteristics of tumor and invasion micro-environment.

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42 Culturing single or multiple cancer cells is the most com-43 monly used method for *in vitro* studies of the cancer invasion. 44 Cells will attach to the bottom of the culture dish in the tra-45 ditional two-dimensional (2D) cell culture system, which ren-46 ders the 2D cell culture many limitations, such as the lack of 47 cell-cell and cell-ECM interactions. What is more, the inva-<sup>48</sup> sion, metastasis, and the effects of drugs may be restricted.<sup>[6]</sup>

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<sup>50</sup> tumors, which is increasingly recognized as an effective way <sup>55</sup> phology, function, and characteristics of tumor tissue *in vivo*  $_{51}$  to study the complex growth and development of tumors,  $^{[7-9]}$   $_{56}$  can be simulated *in vitro*, such as cell–cell interaction, cell mi-52 and the most advanced anti-cancer drug test and screening 57 gration, cell signaling, drug penetration, response, and drug <sup>53</sup> platform.<sup>[10,11]</sup> It fills the gap of traditional 2D *in vitro* cul- <sup>58</sup> resistance.<sup>[13,14]</sup>

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<sup>49</sup> Here, a three-dimensional (3D) spheroid can better simulate <sup>54</sup> ture and animal models.<sup>[12]</sup> Through 3D cell culture, the mor-

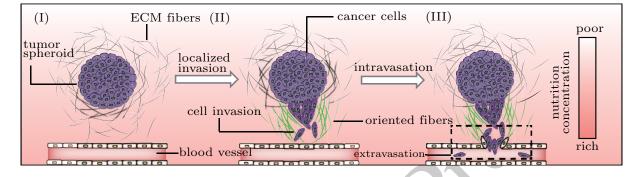


Fig. 1. The multiple stages of metastatic dissemination of spheroid from the primary tumor into the blood circulation. (i) Non-invasive tumor spheroid surrounded by collagen fibers (black). (II) Local invasion occurs on the cancer spheroid, and the collagen fibers surrounding the branches have orien-60 tation. (III) The cells at the front of the invading branch of the cancer spheroid invade the nutrient-rich blood vessels. Metastatic cancer cells rapidly invade by changing the orientation of collagen fibers.

At present, commonly used methods for generating tumor 91 sidered when studying the invasion of cancer cells in vitro. 61 <sup>62</sup> spheroids include: hanging drop, rotating flask, rotating cell <sup>92</sup> The microenvironment of *in vivo* invasion is more compli-63 culture system, ultra-low attachment plate, and microfluidic. 93 cated, and the extracellular matrix is an important part of the 64 Each method has its advantages and limitations. The hang-94 microenvironment. The occurrence, development, invasion, 65 ing drop method is relatively simple and suitable for many 95 and metastasis of malignant tumors are often accompanied 66 cell lines. The resulting spheroid is tightly packed, and they 96 by changes in the extracellular matrix.<sup>[19,20]</sup> The extracellular <sup>67</sup> show strong stability in size. The volume of cells containing <sup>97</sup> matrix is mainly composed of four types of substances, namely es droplets is generally 15 µL–30 µL (including drug test media), 🤐 collagen, elastin, proteoglycan, and aminoglycan, which are <sup>69</sup> because the surface tension of the liquid that remains attached <sup>99</sup> the basement membrane at the base of epithelial or endothelial <sup>70</sup> to the culture surface does not support a larger volume.<sup>[15]</sup> The <sup>100</sup> cells, and the intercellular adhesion structure in the interstitial <sup>71</sup> spinner bottle bioreactor works in a similar manner. The ad- <sup>101</sup> connective tissue.<sup>[21,22]</sup> <sup>72</sup> vantage is that it can produce a large number of spheroids, and <sup>102</sup> 78 the medium can be changed frequently to support the long- 108 specific proteins on invasive cancer cells can induce cancer <sup>74</sup> term cultivation of 3D cancer cell spheroids, etc.<sup>[16]</sup> The at- <sup>104</sup> cell invasion by binding collagen fibers, thereby changing the 75 tachment plate method is simple and reproducible, because it 105 direction of collagen fibers.<sup>[23]</sup> Many studies on the impact of 76 is possible to strictly control the inoculation of the same num- 106 cancer cell complex microenvironment on the invasion of can-<sup>77</sup> ber of cells in each well of the well plate, which can produce <sup>107</sup> cer cells are based on organ-on-chip with specific functions. <sup>78</sup> cancer cell spheroids of uniform size and shape.<sup>[17]</sup> The ad-<sup>108</sup> These chips have more controllability, quantification, and bet-79 vantage of microfluidic method is to repeat multiple experi-<sup>80</sup> ments on a chip to ensure the accuracy of experimental data. <sup>110</sup> a more complex cell microenvironment, such as lung on a chip 81 The technique does not require special equipment, and the 111 reconstructing the organ-level structure and function of the hu-<sup>82</sup> cells can be easily observed under the microscope, and the <sup>112</sup> man lung to evaluate the lung toxicity of nanoparticles.<sup>[24]</sup> <sup>83</sup> required liquid sample is very small. The disadvantage is that <sup>113</sup> Liver on chip can be dynamically perfused, and has a lifes-<sup>84</sup> because the sample volume generated by each plate is small, <sup>114</sup> pan of at least 28 days, which also helps query patient-specific <sup>85</sup> and the further analysis of samples (such as immunoblotting) <sup>115</sup> liver response.<sup>[25]</sup> <sup>86</sup> based on the microfluidic chip may be difficult.<sup>[18]</sup> Therefore, <sup>116</sup> <sup>89</sup> spheroids within a short preparation time.

According to recent studies, it has been confirmed that

However, it is still difficult to quantitatively control colla-87 there is a lack of standard and rapid methods for laboratory 117 gen fiber orientation in vitro and analyze the effect of recom-<sup>88</sup> research to simply control the size and shape of cancer cell <sup>118</sup> binant collagen tissue on tumor cells. In this study, we con-119 structed a 3D biochip with oriented collagen fiber for spheroid

At the same time, the micro-environment must be con- 120 invasion. The orientation of collagen fibers can be quantita-

121 tive controlled by regulating the concentration and injection 167 and processed a 3D biochip based on polydimethylsiloxane 128 vasion.

# 129 2. Experimental methods

# 130 2.1. Cell culture

Combining several common spheroid culture methods, 131 132 we inoculated cancer cells into ultra-low attached 96-well 133 plates, so that cancer cells can only grow in suspension, 134 and then form cancer cell spheroids by self-aggregation, and 135 promoted the growth of cancer cells by additives. The hu-136 man breast cancer cell line MDA-MB-231 (China Infrastruc-137 ture of Cell Line Resources, Beijing, China) was cultured 138 in complete medium (DMEM, Corning, USA) containing 139 10.0% fetal bovine serum (FBS, Corning, USA) and 1.0% 140 penicillin/streptomycin (Corning, USA) MDA-MB-231 cells 141 (green) were previously labeled with GFP via stable trans-142 fection of DsGFP plasmid vector. Before inoculating MDA-143 MB-231 cells into 96-well plates, they were grown to 80% 144 fusion in Petri dish (Corning, USA) and washed twice with 145 phosphate buffered saline (PBS, Corning, USA), then digested 146 with 0.25% trypsin-EDTA (Corning, USA) to form a cell sus-<sup>147</sup> pension and counted by a hemocytometer. The solution was <sup>148</sup> diluted to  $2.0 \times 10^4$  cells/mL (4000 cells per well). Ma-<sup>149</sup> trigel (Corning, USA) was thawed in a refrigerator at 4.0 °C 150 overnight, then the liquid matrigel was added to the cell sus-151 pension with a frozen pipette, so that the final concentration 152 of matrigel in the cell suspension was 3.5%. A volume of  $_{153}$  200 µL of this cell suspension was added to each well of an 154 ultra-low adsorption round bottom 96-well plate (Ultra low 155 attachment, ULA, 7007, Corning, USA). The plate was cen- $_{156}$  trifuged at 1000 Gs (1 Gs =  $10^{-4}$  T) for 10 minutes by using 157 an Eppendorf 5430R desktop high-speed cryogenic centrifuge 158 (Eppendorf, Germany) for the purpose of pelleting the cells at <sup>159</sup> the bottom of the well. Placing the well plate in a constant 160 temperature cell culture incubator with standard cell culture 161 conditions (37.0 °C, 5.0% CO<sub>2</sub>, 95% humidity). Finally, the 162 cancer cell spheroids were imaged under an inverted micro-163 scope (Ti-E, Nikon, Japan) with a 10X air objective.

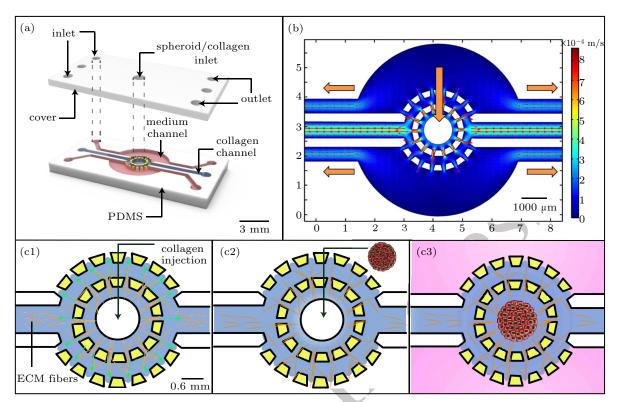
# 164 2.2. Chip design and preparations

165 166 is closer to the cancer cell invasion process, we designed 214 cell invasion pictures.

122 rate of collagen, which simulates the micro-environment of 166 (PDMS) through soft-lithographic technology. As shown in 123 the spheroid *in vivo*. The combination of optical microscopic 169 Fig. 2(a), it is an exploded view of the 3D structure of the 124 imaging technology to study the invasion of cancer cells, such 170 chip, which is mainly divided into two layers (white), and 125 as the direction of invasion and the speed of invasion, further 171 the upper structure is the cover part, including the injection 126 reflects the significant advantages of biochips in constructing 172 hole and the outlet hole, used for the injection of spheroid, 127 an in vitro micro-environment and quantitatively studying in- 173 collagen, and culture medium. The bottom structure is com-174 posed of microfluidic channel, collagen channel (blue), and 175 spheroid culture area. Each part is divided by trapezoid pil-176 lars (yellow) and the trapezoidal gap of the inner and outer 177 rings is different. The radius of inner ring is 116 µm, while  $_{178}$  the outer ring 178  $\mu$ m. The round spheroid culture area in 179 the middle is directly in front of the injection hole of the up-180 per cover. Spheroid is injected into the collagen in this area 181 through the injection hole. When the spheroid culture area 182 is filled with collagen, collagen enters this channel through 183 the gaps of trapezoid pillars. The excess collagen will be dis-184 charged to the outside of the chip through the channels on both 185 sides. It has media channels (pink) on both sides, and also 186 through the gaps of the trapezoid pillars (yellow) at the pe-187 riphery to provide nutrients for the growth and invasion of the 188 middle spheroid. Therefore, the spheroid is restricted to grow 189 in spheroid culture area by trapezoid pillars.

> Figure 2(b) is a simulation of the internal flow field of the 191 chip using COMSOL (Comsol Multiphysics 5.4a, Sweden). In 192 the simulation, collagen was injected from the middle injec-193 tion hole, and the flow rate was reflected by different colors. <sup>194</sup> It can be seen that in the trapezoid pillars, especially the pil-195 lars gap between the collagen channel and the spheroid culture  $_{196}$  area, the flow velocity is the highest, reaching  $8\times10^{-4}$  (m/s), <sup>197</sup> which shows there is a significantly high flow velocity when 198 collagen passes through the gap. It will a significant stress field 199 in and around the gap, resulting in *a*-directional orientation of 200 collagen fibers.

As shown in Figs. 2(c1)-2(c3), firstly pure collagen is in-201 202 jected into the center of the spheroid culture area through the 203 middle injection hole, and the mixed solution will form a rel- $_{204}$  atively high flow rate in the gap as shown in Fig. 2(c2). After 205 curing the collagen for 60 min in a 20-°C environment, the 206 collagen fibers will generate a fiber orientation (brown) con-207 sistent with the flow field distribution. Secondly the spheroid  $_{208}$  is injected into the spheroid area [see Fig. 2(c2)]. Then the 209 medium is injected into the medium channel on both sides 210 from the injection holes on both sides [see Fig. 2(c3)]. Fi-211 nally placing the chip in a cell incubator with a concentration  $_{212}$  of 5.0% CO2, a temperature of 37.0 °C, and a saturated hu-In order to establish an *in vitro* experimental model that <sup>213</sup> midity of 95%. Light microscopy is applied to obtain cancer



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Fig. 2. The microchip design, flow field simulation, and experimental operation. (a) The 3D design of the chip. (b) Simulation result for complete flow field, showing the consistent flow field distribution of the chip. (c1)-(c3) Injection process for the collagen and spheroid (red). (c1) Injecting collagen 216 into the chip from the middle hole (blue channel). (c2) Seeding spheroid into the collagen from the middle hole. (c3) Injecting medium from both channels to provide nutrition for cell invasion (pink channel).

### 217 2.3. Analysis of microscopy image

Real-time spheroid compaction and invasion processes 218 219 were measured using an inverted time-lapse microscope (Ti-220 E, Nikon, Japan). For compaction analysis, spheroids com-221 posed of green fluorescent cancer cells were imaged at 24-h 222 intervals for 72 h. The readout rate of the Nikon microscope 223 is 560 Hz. Its emission wavelength of the laser is 535 nm <sup>224</sup> and the excitation wavelength is 480 nm. The image acqui-225 sition of collagen fibers is realized by confocal microscopy 226 (SP8, Leica, Germany). The scan speed of the confocal mi-227 croscope is 200 Hz, the pinhole size is 53 µm and the emis-228 sion wavelength is 580 nm. The images were first processed 229 by Curvelet-Based Alignment Analysis Software (University 230 of Wisconsin at Madison) to obtain the angular distribution of 231 collagen fibers, and then statistics and analysis were carried 232 out by Origin (Origin2018, USA). Finally, the Matlab (MAT-233 LAB R2015b, USA) helps to obtain the interaction between 234 cancer cells and collagen fibers.

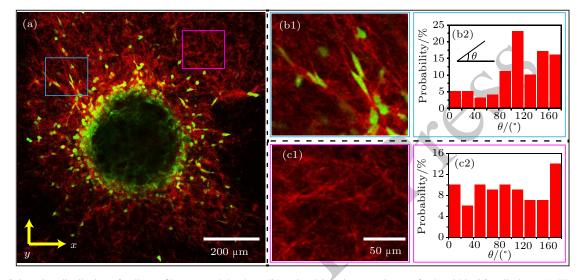
# 235 3. Results and discussion

236 237 cell invasion analysis in a homogenous collagen ECM envi- 263 gen fiber is imported into Origin (Origin2017, USA), and the 238 ronment. The result would be a comparison to the later cell 264 distribution of collagen fibers is obtained through histogram  $_{209}$  behaviors in oriented collagen in the biochip. In this experi- $_{265}$  statistics. Here, the horizontal direction to the right x axis is

241 (MDA-MB-231-GFP, spheroid) is injected into an ultra-low 242 adsorption 96-well plate, where the concentration of collagen 243 is 2.0 mg/mL. The well plate is placed in a cell culture incu- $_{244}$  bator for cultivation when collagen is solidified. Figure 3(a)245 shows that the cancer cell spheroids in the well plate for 24 246 hours taken by reflection pattern (10X) of confocal micro-247 scope. The figure shows the cancer cell spheroids (green) and 248 abundant collagen fibers (red) are uniformly distributed in the 249 well plate. The collagen fibers where invading branch occurs 250 exhibit obvious orientation, which is consistent with the direc-251 tion of the invading branch. However, the collagen fibers at the  $_{252}$  non-invading branch have no orientation. Figures 3(b1)-3(c1)253 is an enlarged view (20X) of the confocal image of the invasive 254 branch around the cancer cell spheroid and the non-invasive 255 branch. Figure 3(b1) shows the distribution of cells and colla-256 gen fibers in the invading branch, while figure 3(c1) shows the <sup>257</sup> distribution of collagen fibers in the invading branch.

The Curvelet-Based Alignment analysis software was 258 259 used to analyze the collagen fiber orientation in the B1 and 260 C1 areas around the cancer cell spheroid. The fiber orientation 261 is quantified by measuring its angle relative to the channel di-The first experiment performed is spheroid culture and 262 rection (x axis).<sup>[26]</sup> After that, the obtained angle of each colla-<sup>240</sup> ment, 200-μL mixed gel of collagen and cancer cell spheroid <sup>266</sup> defined as 0°, and the vertical direction is defined as 90°, while

 $_{267}$  the horizontal direction to the -x axis is defined as 180°. Fig-  $_{274}$  (green) also shows an orientation similar to that of collagen 268 ure 3(b2) shows the quantitative statistics of collagen fiber an- 275 (arrow), which indicates that the orientation of metastatic cells  $_{269}$  gle at panel 3(b1). It shows that the surrounding angles with  $_{276}$  is closely related to the orientation of fibers. Figure 3(c2) 270 invasion branches of cancer cells are concentrated at 100°- 277 shows that collagen fibers are more randomly distributed in all 271 120° displaying the certain orientation. The localized cell ori- 278 directions, which means that the orientation of collagen fibers 272 entation may be resulted by strain field from interactions of 279 in the orifice plate is more uniform, and it will not significantly 273 spheroid development and collagen fibers. Besides, the cells 280 affect the spheroid branch.



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Fig. 3. Orientation distribution of collagen fibers around the three-dimensional invasion experiment of spheroid in 96-well plate. (a) The confocal image of spheroid branches (green) and collagen fibers (red) at 24th hour. (b1) and (c1) The enlarged pictures of the "invasive branches" (blue box) and "non-invasive branches" (pink box) regions, respectively. (b2) and (c2) Statistics of orientation angle of collagen fibers in different parts around spheroid. The orientation distribution analysis of collagen fibers in the "invasive branches" (blue box) and "non-invasive branches" (pink box) regions, respectively.

The extracellular matrix not only serves as an inert sup- 306 figure shows the invasion of the cancer cell spheroid at differ-283 284 port, provides strong and stable support, but also actively par- 307 ent times. At the 0th hour, the cancer cell spheroid was inocu-285 ticipates in controlling cell growth, polarity, shape, migration, 308 lated into the chip and exhibited no invasion behavior, and the 286 and metabolic activities.<sup>[27]</sup> Collagen is one of the commonly 309 collagen was just solidified. At the 48th hour, the cancer cell 287 used substances for simulating extracellular matrix *in vitro* and 310 spheroid invaded obviously, and the invasion range becomes <sup>288</sup> has good biocompatibility.<sup>[28,29]</sup> Collagen fibers can form a <sup>311</sup> larger with time. At the 72th hour, apoptosis appeared at the 289 network structure, which can help the growth and invasion of 312 front of the invasive branch, and the invasive range began to <sup>290</sup> cancer cells through their permeability and orientation.<sup>[30,31]</sup> <sup>313</sup> decrease. Referring to Fig. 3 and Fig. 4, it can be concluded <sup>291</sup> At the same time, collagen fibers have good plasticity, and <sup>314</sup> that the oriented collagen fibers have guiding and assisting ef-292 could change their orientation through the stress of the mi- 315 fects on the invasion of cancer cells. 293 croenvironment, providing some specific microenvironments 316 for the growth and invasion of cancer cells.<sup>[32,33]</sup> 294

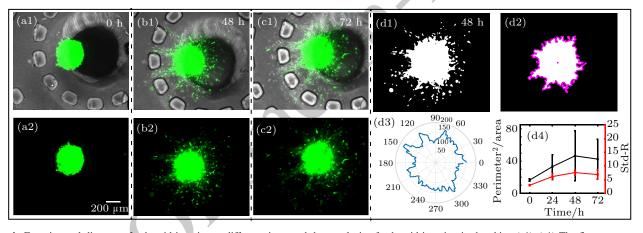
295 <sup>296</sup> we first inject the cancer cell spheroids and collagen in the <sup>319</sup> inverted microscope through the Matlab program. First, the 297 concentration of 2.0 mg/mL into the middle channel of the 320 grayscale image is obtained by performing grayscale opera-<sup>298</sup> chip (2 μL/s) using the syringe pump, and cure in the envi-<sup>321</sup> tion on the fluorescent image. Second, the Gaussian blur algo-299 ronment of 20.0 °C for 1 hour. Then injecting the medium 322 rithm is used to the grayscale image to filter the noise points 300 from the injection holes on both sides, and placing the chip 323 on the background. Then, the binary threshold of the image is 301 in the cell incubator for cultivation. At the same time, the 324 automatically determined through the built-in graythresh func- $_{302}$  culture medium is renewed every 24 hours. Figures 4(a)-4(c)  $_{325}$  tion in Matlab, and the image is binarized. Finally, the built-in 303 show the spheroid culture area of the chip at 0, 24 (not shown), 326 infill function in Matlab is used to fill the holes in the binary 304 48, and 72 hours, the bright-field and fluorescence images of 327 map and determine the largest connected component, as shown 305 growth and invasion are obtained by inverted microscope. The 328 in Fig. 4(d1). Here, the processed spheroid boundary is con-

In order to quantitatively study the changes of cancer cell 317 spheroid invasion over time in the chip, we processed the can-In order to construct oriented collagen fiber in the chip, 318 cer cell spheroid invasion resulting images obtained from the

330 <sup>331</sup> we use a unified polar coordinate system to describe the <sup>348</sup> frequency part corresponds to the attack area.<sup>[34]</sup> 332 boundary of the cell spheroid. As shown in Fig. 4(d3), we 349 333 divide the points on the boundary curve into 300 parts in polar 350 quantify the invasive characteristics of the spheroid, such as 334 coordinate space, and set the maximum distance in each part to 351 geometric parameters (area, circumference, radius, and vol-<sup>335</sup> the value of the polar diameter, and polar angle is the radian of <sup>352</sup> ume of the spheroid). Since the invasion branch will make the 336 the angle bisector in each aliquot. Among them, the distance 353 circumference and area of the cancer cell spheroid relatively 337 is defined as the length from the boundary to the center of 354 increases, we define the ratio of the square of the circumfer-338 gravity. After smoothing the edges of the cancer cell spheroid, 355 ence to the area to quantify the cancer cell spheroid with the in-339 a new cancer cell spheroid boundary can be obtained. If the 356 vasion branch, and the mutation time of the slope on the curve <sup>340</sup> shape of the cancer cell spheroid is relatively regular, then the <sup>357</sup> is defined as the invasion time of cancer cell spheroid. Fig- $_{341}$  spheroid part is the main part of the cancer cell spheroid, and  $_{358}$  ure 4(d4) shows the change in the ratio of the square of the 342 the branch on the spheroid is the invasive branch. In fact, the 359 spheroid to the area over time (black curve), with a large in-343 shape of the cancer cell spheroid obtained in the experiment is 360 crease between 0 h and 24 h. The average increase of the ratio 344 often ellipsoidal, so it is necessary to find the area correspond- 361 of the square of the circumference of the cancer cell spheroid  $_{345}$  ing to the low frequency part and the high frequency part of  $_{362}$  to the area is 16.67, and the slope is 0.69.

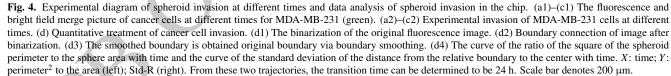
 $_{329}$  nected to obtain an irregular spheroid, as shown in Fig. 4(d2).  $_{346}$  the cancer cell spheroid through Fourier transform, that is, the For comparing the quantitative data at different moments, 347 low frequency part corresponds to the nucleus area, the high

We have defined several morphological parameters to



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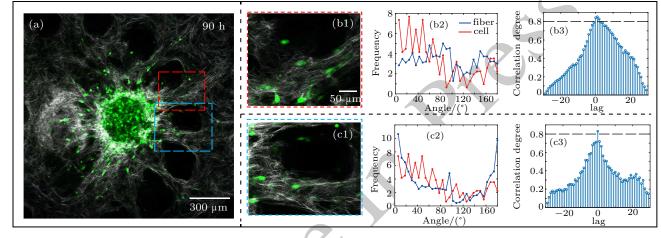
In addition, the protrusions in the invading branch will 380 near the trapezoidal part of the inner circle. 365 <sup>366</sup> also increase the roughness of the cancer cell spheroid, which <sup>381</sup> 367 is characterized by the standard deviation Std-R relative to the 382 invasion, we purposefully choose two local areas from the  $_{368}$  boundary to center distance. The results in Fig. 4(d4) (red  $_{383}$  confocal image [see Fig. 5(a)]. These two areas are magni-369 curve) also show a large increment between 0 and 24 hours. 384 fied for details and displayed in Figs. 5(b1) and 5(c1), respec-370 The average increment of Std-R is 3.17, and the slope is 0.13. 385 tively. Both of these local areas show the detailed fiber mor-371 372 curves are the same, that is, the slope is the largest within 387 Analysis software (University of Wisconsin at Madison) was 373 24 hours, indicating that the cancer cell spheroids in the en- 388 applied to quantitatively analyze the fiber orientation. Fiber 374 vironment of oriented collagen fibers have rapidly invaded. 389 orientation was calculated by measuring its angle relative to 375 Since the chip can control the orientation of collagen fibers, 390 the channel direction, and the corresponding angle distribu- $_{376}$  the two-photon mode (10X) of a confocal microscope can be  $_{391}$  tions (red dotted lines) are plotted in Figs. 5(b2) and 5(c2).  $_{377}$  used to obtain the cancer cell spheroid (green) and the distri-  $_{392}$  It is obvious that majority of the fiber distribute around at 0°  $_{378}$  bution of collagen fibers (white). The image shows that the  $_{393}$  and  $180^{\circ}$ , which is parallel to the channel direction, as seen 379 orientation of collagen fibers and cancer cells is very obvious 394 in Fig. 5(c2). Similarly, we also calculated the distribution

In order to investigate the effect of oriented fiber on cell We find that the times of the mutation slopes of the two  $_{386}$  phology, e.g., fiber branch. The Curvelet-Based Alignment <sup>397</sup> tributions of cell shape behave like these for the correspond- <sup>405</sup> signals. <sup>398</sup> ing distributions of fiber. In order to quantitatively figure out <sup>406</sup> 401 ing expression

$$R_{xy}(\tau) = \sum_{n=1}^{N} x(n) \cdot y(n+\tau)$$

 $_{395}$  of migrating cells based on the cell shape in these two areas,  $_{403}$  where x and y are two discrete signals,  $\tau$  the corresponding  $_{396}$  as shown in Figs. 5(b2) and 5(c2). Clearly, the obtained dis-  $_{404}$  lag between the signals, N the total number of the individual

The results are plotted in Figs. 5(b3) and 5(c3). We find  $_{399}$  the relationship between the fibers and the migrating cells, we  $_{407}$  that the values of correlation function at lag = 0, are greater 400 computed the cross-correlation function defined in the follow- 408 than 0.8 for these two local areas, which indicates the direc-409 tion of cell invasion is strongly related to the direction of fiber 410 alignment. The results show aligned fibers can direct tumor 411 cell intravasation.



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Fig. 5. Analysis of the correlation between spheroid invasion branch cells and fibers in the chip. (a) Confocal image of collagen fibers (white) obtained in two-photon mode of inverted microscope and cancer cells (green) obtained in fluorescent mode at 90th hour. (b1) and (c1) Enlarged views of the invasion branches of two different parts of spheroid, respectively. (b2)-(b3), (c2)-(c3) Representation of the angle distribution of fiber and cell, the correlation between collagen fibers, and cells at the pink box and the blue box, respectively. The Y value is greater than 0.8 at time 0 hour, indicating that collagen fibers have strong correlation with cells.

# 414 **4.** Conclusion

In this study, we designed a 3D chip that can control the 415 416 orientation of collagen fibers and combined with cancer cell 417 spheroids to study the invasion behavior of cancer cells in 418 vitro. We first inoculated cancer cells in a 96-well ultra-low <sup>419</sup> adsorption plate to prevent cancer cells from adhering to the 420 wall, and added 3.5% matrigel as a binder to the cell suspen-421 sion to promote the formation of cancer cells. Then inoculat-422 ing the cancer cell spheroids into the targeted collagen fibers, 423 we found that in the environment of oriented collagen fibers, 424 the cancer cell spheroids can quickly and directionally invade 425 within 24 hours, that is, cancer cells can invade along the col-426 lagen fibers at extremely high speed. By quantitatively ana-427 lyzing the invasion of cancer cell spheroids, we found that the 428 invading cells have a strong correlation with collagen fibers. 429 Therefore, we concluded that the tumor microenvironment of 430 collagen fiber orientation plays an important role in guiding 431 cell infiltration and promoting rapid cell invasion.

The results show that the rapid invasion of cancer cells in 432 433 the organism is not only related to the nutrient gradient, but 434 also closely related to the changes in the surrounding envi-435 ronment. Therefore, we suggest that future treatments may 436 consider adjusting the biophysical microenvironment of the 437 tumor, for example, changing the orientation of already ori-

438 ented collagen fibers to slow the invasion potential of invasive 439 cancer cells. We can also inoculate epithelial cells on the out-440 ermost circle of the chip, which is the outermost trapezoid in 441 Fig. 2(a), forming a dense layer of cells to simulate the blood 442 vessel wall. By directional collagen fibers, cancer cells can 443 invade the outermost trapezium, and by secreting some sub-444 stances to destroy the blood vessel wall and enter the culture 445 medium channel. In this way, the invasion process that sim-446 ulates the extravasation of cancer cells into blood vessels in 447 vitro is realized in the chip. In addition, we can also add drugs 448 to the media channels on both sides to form a drug gradient to 449 study the inhibitory effect of drugs on the growth and invasion 450 of cancer cells. Therefore, this chip not only provides a model 451 for studying the behavior of cancer cells in a 3D environment 452 in vitro, but also build a comprehensive experimental platform 453 for evaluating the effects of drugs.

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