



Biphasic response of cell invasion to matrix stiffness in three-dimensional biopolymer networks



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ARTICLE INFO

Article history:

Received 2 June 2014

Received in revised form 24 October 2014

Accepted 4 November 2014

Available online 11 November 2014

Keywords:

Cell migration

Matrix mechanics

Pore size

Crosslinking

Matrix metalloproteinase

ABSTRACT

When cells come in contact with an adhesive matrix, they begin to spread and migrate with a speed that depends on the stiffness of the extracellular matrix. On a flat surface, migration speed decreases with matrix stiffness mainly due to an increased stability of focal adhesions. In a three-dimensional (3-D) environment, cell migration is thought to be additionally impaired by the steric hindrance imposed by the surrounding matrix. For porous 3-D biopolymer networks such as collagen gels, however, the effect of matrix stiffness on cell migration is difficult to separate from effects of matrix pore size and adhesive ligand density, and is therefore unknown. Here we used glutaraldehyde as a crosslinker to increase the stiffness of self-assembled collagen biopolymer networks independently of collagen concentration or pore size. Breast carcinoma cells were seeded onto the surface of 3-D collagen gels, and the invasion depth was measured after 3 days of culture. Cell invasion in gels with pore sizes $>5\ \mu\text{m}$ increased with higher gel stiffness, whereas invasion in gels with smaller pores decreased with higher gel stiffness. These data show that 3-D cell invasion is enhanced by higher matrix stiffness, opposite to cell behavior in two dimensions, as long as the pore size does not fall below a critical value where it causes excessive steric hindrance. These findings may be important for optimizing the recellularization of soft tissue implants or for the design of 3-D invasion models in cancer research.

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1. Introduction

The ability of cells to migrate through their surrounding three-dimensional (3-D) extracellular matrix (ECM) is crucial for wound repair, immune responses, embryogenesis, tumor progression and metastasis formation, but also for the recellularization of biomaterials and the revascularization of porous implants [1–4]. Previous studies of cells grown on flat two-dimensional (2-D) substrates have shown that the mechanical properties—in particular the stiffness—of the underlying substrate influences cell migration [5,6]. On a more rigid substrate, cells form more stable focal adhesions, which leads to a reduced migration speed and contributes to durotaxis where cells migrate in the direction of increasing substrate stiffness [7,8].

In a 3-D environment, the migrating cells must, in addition to adhesion forces, also overcome the resisting forces imposed by the surrounding matrix [9–11]. Resisting forces arise from steric

effects as the cell moves through the matrix and deforms it. This steric hindrance depends on cell shape and cell mechanics but is also modulated by the effective mechanical properties of the matrix. For non-porous degradable polyethylene glycol (PEG)-based hydrogels, cell migration speed and migration persistence has been shown to decrease with increasing matrix stiffness [12]. In a porous matrix, however, the effective mechanical properties also depend on the porosity or the mesh size of the matrix [13–17].

3-D cell migration studies where the matrix protein concentration and hence matrix stiffness was changed, however, have reported inconsistent data. Cell migration speed in a 3-D porous collagen network was shown to decrease with increasing matrix protein concentration and hence higher stiffness [18]. By contrast, in a porous Matrigel network, cell migration speed was shown to exhibit a biphasic response, with a maximum speed at intermediate matrix protein concentrations [9]. These results are difficult to interpret, however, as matrix protein concentration not only determines the matrix stiffness but also pore size and adhesion ligand density [13,14,19], all of which can influence cell migration speed [9,18,20,21].

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In this study, we changed the pore size and stiffness of porous, fibrillar collagen gels independently, using the chemical cross-linker glutaraldehyde [22,23]. The highly reactive aldehyde groups of glutaraldehyde bind covalently to the N- and C-terminal ends of the collagen fibrils and increase matrix stiffness without changing the pore size [24]. We show that a higher matrix stiffness promotes 3-D cell invasion in gels with large pores where steric effects are small. By contrast, in gels with small pore sizes, an increasing matrix stiffness amplifies the steric hindrance of the matrix and therefore impairs cell invasion.

2. Materials and methods

2.1. Gel preparation

For collagen gels with a concentration of 2.4 mg ml⁻¹, we mixed 1.2 ml collagen G (4 mg ml⁻¹ bovine collagen type I; Biochrome), 1.2 ml collagen R (2 mg ml⁻¹ rat collagen type I; Serva, Heidelberg, Germany), 270 μl NaHCO₃ buffer (26.5 mM) and 270 μl 10× Dulbecco's modified Eagle's medium (DMEM, Biochrome), and adjusted the pH to 10 with 43 μl 1 M NaOH. All ingredients were kept on ice in order to prevent premature polymerization. For final collagen concentrations of 1.2, 0.6 and 0.3 mg ml⁻¹, the solution was diluted with a mixture of 1 vol part NaHCO₃ (26.5 mM), 1 part 10× DMEM and 8 parts H₂O, adjusted to pH 10 with NaOH (1 M). 1.2 ml of the final solution was pipetted in a 35 mm culture dish (Greiner, Germany), and gels were polymerized in a tissue culture incubator at 37 °C, 5% CO₂ and 95% humidity for 2 h. Afterwards, cell culture medium was added in order to prevent dehydration.

2.2. Crosslinking of collagen gels

Collagen gels were crosslinked for 1 h using 0.2% glutaraldehyde (25% stock solution, Merck, Darmstadt) in phosphate-buffered saline (PBS, Invitrogen). After crosslinking, the gels were washed every 2 h with 2 ml of 20 mM Tris buffer (Roth) at least 12 times. Before adding cells, the gels were washed twice with cell culture medium.

2.3. Cell culture

MDA-MB 231 cells were kept in 75 cm² cell culture flasks with DMEM (1 g glucose, Greiner) and 10% fetal calf serum (FCS, Greiner) at 37 °C, 5% CO₂ and 95% humidity. Cells were split every 2 days.

2.4. Invasion assay

50,000 cells were seeded on top of collagen gels and allowed to invade for 3 days at cell culture conditions. Afterwards, cells were fixed with 2 ml of 2.5% glutaraldehyde in PBS, and cell nuclei were stained with 1 μg ml⁻¹ Hoechst 33342 (Sigma) for 20 min. To analyze the invasion profile, 3-D image stacks with a z-distance of 2 μm were obtained with a motorized Leica 6000 inverse fluorescence microscope. The z-position of cell nuclei as a function of the invasion depth was determined in 36 fields of view using a custom-written Matlab script. The invasion profile was then computed as the cumulative probability of finding a cell at or below a given depth. We defined a characteristic invasion depth as the invasion depth that was reached or exceeded by 5% of the cells. This choice guarantees that we analyze only cells that have migrated away from the gel surface into the depth of the gel. Changes of invasion depth in response to changes in gel density and stiffness (see Fig. 3), however, remain qualitatively similar for lower or higher percentiles between 1% and 10%.

2.5. Magnetic tweezer microrheology

Stiffness measurements of collagen gels were performed with a magnetic tweezer setup as described in Ref. [25]. Fibronectin-coated 5 μm superparamagnetic beads were bound on top of collagen gels for 1 h. A staircase-like force step protocol was applied with 20 consecutive steps of 0.5 nN and 1 s duration, up to a maximum force of 10 nN. Bead displacements in response to force steps were measured with a microscope equipped with a CCD camera (Orca ER, Hamamatsu) and a 20 × 0.4 NA objective under bright-field illumination. Bead displacements followed a weak power law at all force steps. The creep compliance was fitted to the equation [25,26]:

$$J(F, t) = J_0(F) \left(\frac{t}{t_0} \right)^{\beta(F)}, \quad (1)$$

where $1/J_0(F)$ is the force-dependent differential creep modulus measured at $t_0 = 1$ s, and $\beta(F)$ is the force-dependent power-law exponent.

2.6. Extensional rheometer

For measuring the stress–strain relationship of collagen under uniaxial stretch, a cylinder of collagen was cast between two parallel plates with holes arranged in a checkerboard pattern (Fig. 2c, inset). The plates were pretreated with Pluronic F-127 (Sigma–Aldrich) to prevent adhesion of the gel. The lower plate was connected to a precision scale (AND GR-200), and the upper plate was mounted to a motorized micromanipulator (Eppendorf Injectman). The gel was vertically stretched at a rate of 10 μm s⁻¹, and the weight change was continuously recorded. In this setup, the stretched gel has two different cross-sections between the plates and in the holes. This geometry corresponds to a serial connection of two mechanical elements with different cross-sections (A) and lengths (l_0). The Young's modulus E was calculated from the weight change ΔF and the change in total extension Δl as:

$$E = \frac{\Delta F}{\Delta l} \left(\frac{l_{0,plates}}{A_{plates}} + 2 \frac{l_{0,holes}}{A_{holes}} \right). \quad (2)$$

The factor of 2 enters because there is an upper and a lower plate, both with the same hole geometry. The force–length relationship ($\frac{\Delta F}{\Delta l}$) of the gel was corrected for the mechanical compliance of the device.

2.7. Pore size

The distribution of pore sizes in collagen gels was determined from confocal reflectance microscopy stacks as described in Ref. [19]. From binarized image stacks, the histogram of the nearest obstacle distance (Fig. 1e) was calculated and fitted to a Rayleigh distribution. The mean value of the Rayleigh distribution r_{mean} was corrected for missing fibers due to the blind spot effect in confocal reflectance microscopy [27]. For a 20× objective with NA = 1.0, the cut-off angle above which fibers are invisible was determined to be $\theta_{cut} = 51^\circ$. r_{mean} was then converted into a more commonly used measure for the diameter of a pore as defined by the covering radius transform (CRT) [19,28,29]:

$$d_{CRT} = 2 \times 1.82 \times r_{mean} \times \sqrt{\cos \theta_{cut}}. \quad (3)$$

Note that in the following we report the pore diameter according to the CRT definition.

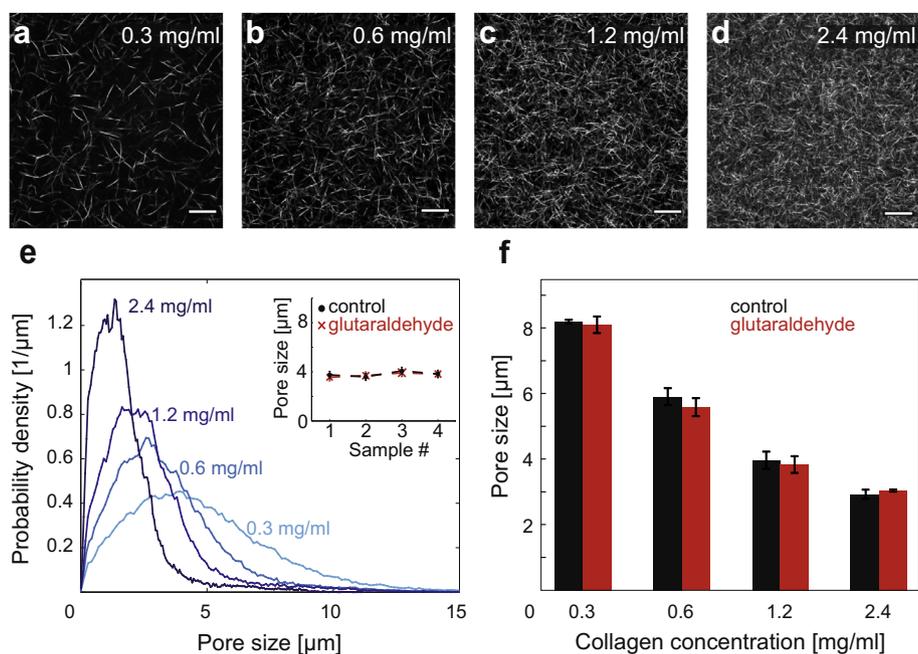


Fig. 1. Morphological properties of collagen networks. (a–d) Optical section (total thickness 0.350 μm) of collagen gels with concentrations of 0.3 mg ml^{-1} (a), 0.6 mg ml^{-1} (b), 1.2 mg ml^{-1} (c) and 2.4 mg ml^{-1} (d) imaged with confocal reflection microscopy. Scale bar is 20 μm . (e) Pore size distributions from the same data sets as in (a–d) followed a Rayleigh distribution. With increasing collagen monomer concentration, the pore sizes became smaller. Inset: characteristic pore size of a 1.2 mg ml^{-1} collagen gel (mean \pm SD from five fields of view of four gels for each condition). Glutaraldehyde treatment did not change the pore size of the gels. (f) Pore sizes vs. collagen concentration (mean \pm SD, from five fields of view of at least three gels for each condition).

2.8. MMP inhibitor treatment

The broad-spectrum matrix metalloproteinase (MMP) inhibitor GM6001 (Merck Millipore) was used to block the activity of cell-secreted MMPs. 25 mM GM6001 in PBS were added directly after seeding the cells on top of the collagen gels.

2.9. Cell shape analysis

Cells were fixed with 4% paraformaldehyde (Thermo Fisher Scientific) in PBS for 20 min, stained with phalloidin TRITC (0.2 $\mu\text{g ml}^{-1}$, Sigma) for 1 h and then washed twice with PBS. Fluorescence image stacks (z-distance = 839.8 nm) of invaded cells were obtained with a confocal microscope (SP5X Leica upright microscope equipped with a 20 \times dip-in water immersion objective with NA = 1.0). After a maximum intensity projection, the cell outline was determined with an edge detection algorithm implemented in Matlab and fitted to an ellipse. Cell eccentricity was computed as the ratio of the distance between the foci of the ellipse and its major axis. Eccentricities close to 0 indicate circular shapes, while values close to 1 indicate highly elongated shapes.

2.10. Statistical analysis

All results are represented as arithmetic mean from at least three independent experiments \pm one standard deviation or standard error of the mean, as indicated.

3. Results

3.1. Morphological and mechanical properties of collagen networks

The pore size of reconstituted collagen networks has been shown to depend on the collagen monomer concentration and polymerization conditions including temperature and pH [13,14,17,19,30]. At the same time, the stiffness of these gels is

expected to increase with higher collagen concentration [13,31]. We polymerized collagen at monomer concentrations ranging from 0.3 to 2.4 mg ml^{-1} at 37 $^{\circ}\text{C}$ and pH 10, and confirmed that the resulting networks became denser with increasing collagen concentration (Fig. 1a–d). Quantification of confocal reflection microscopy image stacks using the nearest obstacle distance revealed a distribution of pore sizes that followed a Rayleigh distribution for all collagen concentrations measured (Fig. 1e). The average pore size decreased from 8.20 μm at the lowest collagen concentration to 2.92 μm at the highest concentration (Fig. 1f). Repeating this experiment on different samples prepared on different days showed highly reproducible results (Fig. 1e inset black line, and Fig. 1f).

To measure the bulk stiffness (Young's modulus) of these gels in the linear regime, we applied a uniaxial strain and measured the resulting force with an extensional rheometer (Fig. 2c, inset). The gel stiffness increased approximately linearly with increasing collagen concentrations from 45 Pa at the lowest concentration to 550 Pa at the highest concentration (Fig. 2c).

To estimate the micromechanical properties of collagen at a force and deformation scale relevant to cells, we used a magnetic tweezer setup (Fig. 2a inset). We applied forces between 1 and 10 nN to 5 μm diameter beads bound to the collagen gel surface, and measured the resulting bead displacements. Bead displacements were on the order of several micrometers except for 0.3 mg ml^{-1} collagen gels, where displacements exceeded 10 μm at the highest force (Fig. 2a, black lines). All gels stiffened with increasing forces, with a more pronounced stiffening for higher concentrated gels (Fig. 2b, black lines). Micromechanical stiffness increased with collagen concentration similar to the bulk stiffness data.

3.2. Crosslinking with GA

Gel stiffness at the highest collagen concentration was below the stiffness reported for soft connective tissue such as brain tissue

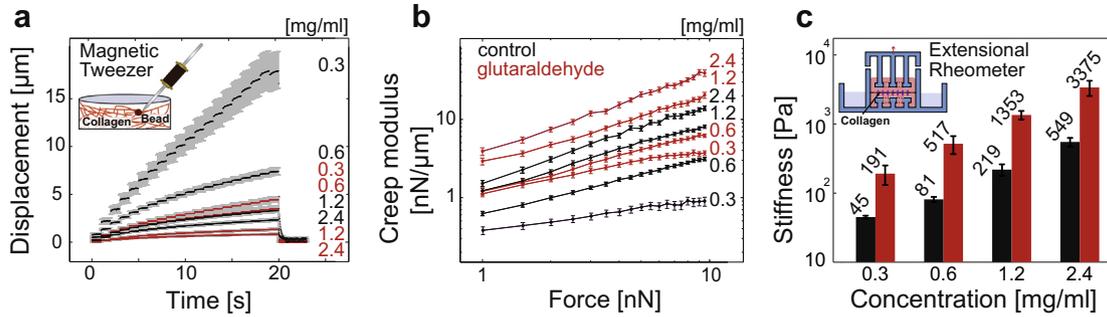


Fig. 2. Mechanical properties of collagen networks. (a) Bead displacement in response to a staircase-like force protocol (from 0.5 nN with 0.5 nN increments every 1 s) applied using magnetic tweezers. With increasing collagen monomer concentration and after glutaraldehyde treatment (red), bead displacements for a given force decreased. Error bars indicate SE around the mean of at least 30 beads per condition measured on at least three different gel samples. Inset: magnetic tweezer setup. (b) Microrheological creep modulus vs. applied force calculated from the data shown in (a). The creep modulus increased with increasing monomer concentration and after glutaraldehyde treatment (red). (c) Stiffness (Young's modulus) from control gels (black) and gels treated with glutaraldehyde (red) measured with an extensional rheometer (inset) (mean \pm SE of at least three different gel samples).

[32]. To increase the stiffness of reconstituted collagen gels without altering their morphology and pore size, we used the crosslinker glutaraldehyde [23]. Confocal imaging showed that the pore size was not affected by crosslinking (Fig. 1e inset and Fig. 1f, red lines and columns). Linear bulk stiffness measured with an extensional rheometer was 6-fold higher compared to

non-crosslinked gels (Fig. 2c). Microrheology measurements with magnetic beads also showed a pronounced stiffening of the crosslinked gels, with a stiffness that was \sim 4-fold higher compared to non-crosslinked gels (Fig. 2b). Gel displacements remained below 3 μ m even at the highest forces (10 nN) and lowest collagen concentration (0.3 mg ml $^{-1}$) (Fig. 2a, red lines).

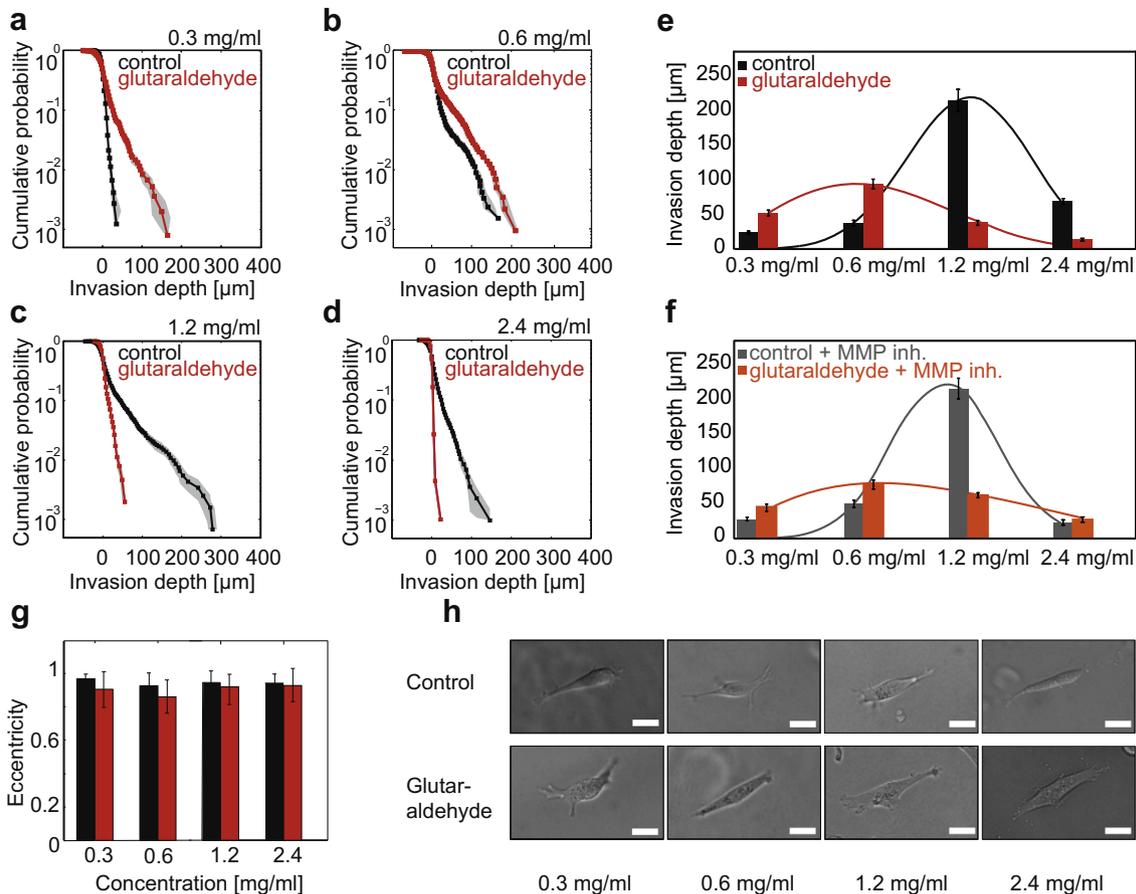


Fig. 3. Cell invasion depends on matrix pore size and stiffness. (a–d) The invasion profile of MDA-MB 231 cells is expressed as the probability of finding a cell at or below a given invasion depth in control gels (black) and glutaraldehyde-treated gels (red). Shaded areas indicate \pm 1 SE around the mean from at least 90 fields of view measured on at least three different gels prepared on different days. (e and f) From the invasion profiles, a characteristic invasion depth was defined as the depth that 5% of the cells reached within 3 days of culture. As a visual guide, a log-normal curve was fitted to the results. (e) Cell invasion showed a biphasic dependence on collagen concentration, with a maximum around 1.2 mg mg $^{-1}$ (black bars). This maximum was shifted towards smaller collagen concentrations around 0.6 mg mg $^{-1}$ in glutaraldehyde-treated gels (red bars). (f) A similar biphasic response of cell invasiveness was observed after cell treatment with the MMP inhibitor GM6001 (25 mM). (g) Bright-field images of invaded cells showed elongated shapes for all conditions. Scale bar is 20 μ m. (h) The eccentricity of invaded cells (mean \pm SE of at least 20 cells) did not change with collagen concentration or glutaraldehyde treatment (red bars).

3.3. Cell invasion depends on mechanical and morphological properties

We next performed an invasion assay to evaluate the ability of tumor cells to migrate through gels with different stiffnesses and pore sizes. MDA-MB 231 breast carcinoma cells were seeded on top of the gels, and after 3 days of incubation, we determined the invasion profile as described in Ref. [33]. Cell invasiveness showed a pronounced biphasic response with collagen concentration: invasion was poor for diluted gels (0.3 mg ml^{-1}), reached a maximum at a collagen concentration of 1.2 mg ml^{-1} , and then decreased at higher collagen concentrations (Fig. 3a–e, black profiles and columns). When the collagen gels were stiffened with glutaraldehyde, a similar biphasic response was observed, but the maximum invasiveness shifted to lower collagen concentrations and larger pore sizes: Invasiveness greatly improved for the more diluted gels (0.3 and 0.6 mg ml^{-1}), started to decrease at intermediate concentrations (1.2 mg ml^{-1}) and stopped nearly completely at the highest gel density of 2.4 mg ml^{-1} (Fig. 3a–e, red profiles and columns). Although the invasion behavior of MDA-MB 231 cells responded strongly to changes in matrix stiffness and pore size, the cell shape did not change and remained highly elongated, with eccentricities close to unity for all conditions (Fig. 3g and h).

3.4. Influence of MMPs on cell invasion

To investigate if cells rely on matrix degradation through secretion of MMPs for invasion [34–36], we repeated the invasion assays in the presence of the broad-band MMP inhibitor GM6001. Cell invasiveness in glutaraldehyde-stabilized gels was not altered by MMP inhibition (Fig. 3f, orange columns). This finding was expected as the glutaraldehyde-treated gels remain stable in the presence of MMPs (Fig. S1). Interestingly, MMP inhibition also had little or no effect in untreated gels (Fig. 3f, grey columns), demonstrating that cell invasiveness in these cells did not depend critically on MMP secretion and matrix degradation. Only at the highest collagen concentration (2.4 mg ml^{-1}) did we find a reduced invasion in the presence of the MMP inhibitor.

4. Discussion

In this study, we analyzed the invasive behavior of a breast carcinoma cell line in collagen gels of different stiffnesses, pore sizes and collagen concentrations. Cell invasiveness followed a biphasic response with a maximum invasiveness in gels at an intermediate collagen concentration, stiffness and pore size. To evaluate the influence of stiffness changes without introducing changes in collagen concentration and pore size, we stiffened the gels by crosslinking with glutaraldehyde. Interestingly, gel stiffening lead to an increase of cell invasiveness in diluted gels with large pores, but to a decrease of cell invasiveness in dense gels with small pores. This resulted in a similar biphasic response as seen in the untreated gels but with a shift of the maximum invasiveness to larger pores (Fig. 3e and f).

We confirmed that glutaraldehyde treatment did not alter the pore size, in line with previous data [24], which is an advantage over crosslinking by non-enzymatic glycation, for example, where the pore sizes are affected [37]. A disadvantage of glutaraldehyde crosslinking, however, is the requirement to remove toxic unbound aldehyde groups from the gels by thorough washing with Tris-buffer for at least 24 h. Moreover, gels after glutaraldehyde treatment are considerably less susceptible to proteolytic degradation by cell-secreted MMPs, as shown by the stability of the reflection signal in focal images recorded over the course of several hours in the presence 2 mg ml^{-1} of collagenase (Fig. S1). We therefore tested the effect of a broad-band metalloproteinase inhibitor on cell invasiveness both in native and in glutaraldehyde-treated

collagen gels. We found no systematic influence of the metalloproteinase inhibitor on MDA-MB 231 cell invasiveness (Fig. 3e and f) and observed only a small effect in 2.4 mg ml^{-1} gels where cells have to migrate through a dense material, which indicates that MMP secretion is not essential for MDA-MB 231 invasion in our gels. Moreover, these data demonstrate that the effect of glutaraldehyde treatment on cell invasion was conferred mainly by stiffness changes of the matrix and not by inhibiting matrix degradation.

To characterize the Young's modulus of the collagen gels, we performed measurements with an extensional rheometer. As expected, collagen stiffness increased with increasing collagen concentration, in line with previous studies [13,38,39]. Here, we used a combination of rat and bovine collagen, which produces gels that are stiffer compared to gels polymerized from pure calf skin or rat tail collagen: Young's moduli of our gels are between 45 Pa (for 0.3 mg ml^{-1} gels) and 550 Pa (for 2.4 mg ml^{-1} gels), compared to pure calf skin collagen gels (1–13 Pa for concentrations ranging from 0.5 to 1.5 mg ml^{-1} [13]) or pure rat-tail collagen gels (5–60 Pa for concentrations ranging from 1 to 4 mg ml^{-1}) [31]. Thus, the stiffness of our gels before glutaraldehyde treatment is in the range of PEG-hydrogels (25–1200 Pa) [12] and ribose-crosslinked 1.5 mg ml^{-1} collagen gels (200–700 Pa) [37] that have been used for similar 3-D cell migration studies. However, the stiffness of our gels is higher compared to that of Matrigel (8–50 Pa) [9].

After glutaraldehyde treatment, the gel stiffness of our samples increased by 4- to 6-fold and reached values from 200 to 3400 Pa, which is in the range of soft polyacrylamide gels used in numerous 2-D traction studies, and of soft connective tissue [32]. To measure the mechanical behavior of collagen gels on a length scale more relevant to cells, we performed microrheology measurements with a magnetic tweezer. Bead displacements in response to a force step increased with time according to a weak power law, with an exponent of ~ 0.12 for control gels, suggesting a predominantly elastic behavior (Fig. S2a). After glutaraldehyde treatment, the power-law exponent decrease to values below 0.05 (Fig. S2b), indicating that crosslinked gels are nearly perfectly elastic, in agreement with previous findings [40]. Micromechanical gel stiffness roughly scaled with the bulk stiffness for the different collagen concentrations, although the increase of the microscale stiffness after glutaraldehyde treatment was somewhat less pronounced (2- to 4-fold) compared to the bulk stiffness. This can be explained by the higher mechanical stress levels in the magnetic tweezer experiments that lead to a gel stiffening (Fig. 2b) and, as shown previously, to a collapse of the differential force–displacement responses for different gels [40].

From the magnetic bead measurements where we apply forces between 0.5 and 10 nN, we estimate that the traction force of a single focal adhesion site, which has been evaluated to be $\sim 5 \text{ nN } \mu\text{m}^{-2}$ [41], cannot deform a dense collagen network by more than a few microns, and even less than $1 \mu\text{m}$ in the case of glutaraldehyde-treated gels. This is in agreement with previous results of a reduced translocation of fibers by cells seeded in dense collagen gels [31]. Given that dense gels of 2.4 mg ml^{-1} have a pore size of $< 3 \mu\text{m}$, the decreased cell invasiveness at high collagen concentrations, in particular after glutaraldehyde treatment, can thus be explained by a strong steric hindrance of the collagen fiber network. Inhibition of matrix metalloproteinases had only minor effects on the invasion behavior of breast carcinoma cells studied here. Our data show that the combination of a small pore size with a high gel stiffness can severely impair cell invasion.

It is less clear why cell invasiveness was also impaired in soft diluted gels with large pore sizes but was increased after glutaraldehyde treatment (Fig. 3e). Our data of reduced 3-D invasion in soft gels is in agreement with recent data showing that the migration speed of cells in compliant microfabricated channels

decreased with decreasing matrix stiffness, mostly due to poor cell polarization [42]. The microfabricated channels with diameters between 10 and 40 μm , however, were as large or larger than the cell diameter, and thus steric hindrance did not play a role in that study. In fact, according to another recent study where cells migrated through porous but stiff membranes of a Boyden chamber, steric hindrance effects emerge only for channel diameters $<5 \mu\text{m}$, with some cell lines being able to migrate through pores with diameters $<1 \mu\text{m}$ [18].

On the one hand, our observation of impaired 3-D invasion in soft gels is in contrast to reports that cells tend to migrate faster on soft planar 2-D substrates [5,7,43]. On the other hand, our data are in line with more recent studies that showed a biphasic response of 2-D cell migration speed to substrate stiffness; cells on soft substrates failed to polarize and therefore did not migrate persistently [42,44]. However, we see a high degree of cell elongation even in untreated dilute gels with low stiffnesses in the range of 50–100 Pa (Fig. 3g and h). Therefore, the impaired invasion in the softest gels was not attributable to impaired cell polarization but may be a sign of cellular mechanotransduction. According to a model for adhesion-independent cell migration [45], channel-like confinements lead to an increase of cell internal hydrostatic pressure, which in turn—by some unknown mechanism—enhances actin polymerization and thus cell protrusions and cell movements. Although cell migration and invasion in collagen networks is adhesion dependent [46], it is plausible that cell internal pressure and actin turnover dynamics may also increase as cells squeeze through narrow pores. We have not tested this hypothesis in our study, but it is consistent with our observation that cell invasion decreases in diluted and soft gels. Finally, it is also possible that cells in soft gels may become durotactically trapped in regions with a higher local stiffness.

5. Conclusion

Our study demonstrates the critical role of matrix stiffness for cell migration and invasiveness in a porous 3-D biopolymer network such as a collagen gel. Cells fail to invade very soft matrices, whereas high matrix stiffness promotes 3-D cell invasion as long as the pore size remains above a critical value. These findings may be important for optimizing the recellularization of soft tissue implants or for the design of 3-D invasion models in cancer research.

Disclosure statement

The authors declare no conflict of interest.

Acknowledgements

This work was supported by grants from the Deutsche Forschungsgemeinschaft, the Emerging Fields Initiative of the University of Erlangen-Nuremberg, the National Institutes of Health, and the European Research Council.

Appendix A. Figures with essential colour discrimination

Certain figures in this article, particularly Figs. 1–3 are difficult to interpret in black and white. The full colour images can be found in the on-line version, at <http://dx.doi.org/10.1016/j.actbio.2014.11.003>.

Appendix B. Supplementary data

Supplementary data associated with this article can be found, in the online version, at <http://dx.doi.org/10.1016/j.actbio.2014.11.003>.

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Supplementary Information

Biphasic response of cell invasion to matrix stiffness in 3-dimensional biopolymer networks

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Collagen degradation after glutaraldehyde treatment

Collagen can be proteolytically degraded through matrix metalloproteinase (MMP) enzymes secreted by cells. The speed of collagen degradation in response to collagenase (2 mg/ml collagenase type IA, Sigma-Aldrich, Germany) was measured in gels that were treated or not treated with glutaraldehyde. A gel volume of $185\mu\text{m} \times 185\mu\text{m} \times 50\mu\text{m}$ (pixel size $361\text{nm} \times 361\text{nm} \times 370\text{nm}$) was continuously imaged after addition of collagenase with confocal reflection microscopy using a 20x water immersion objective with 1.0 NA. The total reflected light intensity integrated over the imaged stack was taken as a measure of collagen fiber density. Our data show that the degradation rate of glutaraldehyde-treated gels is greatly reduced. The total intensity did not fall below 40% of its value before collagenase addition, because the dissolved collagen fibers formed aggregates that contributed to the reflection signal.

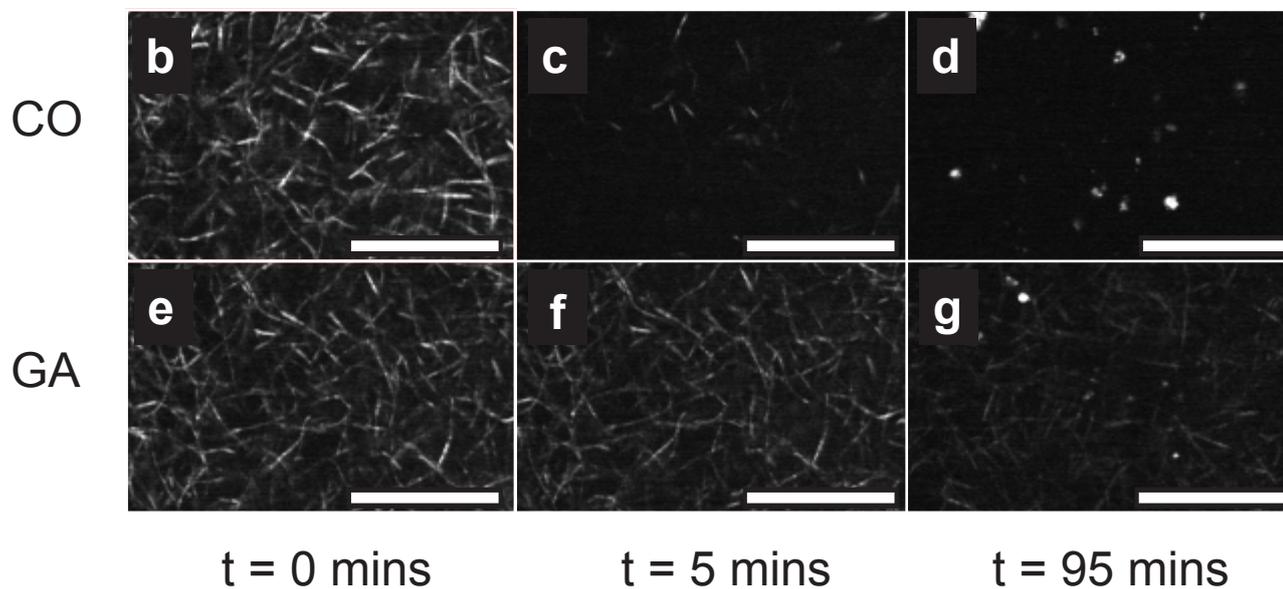
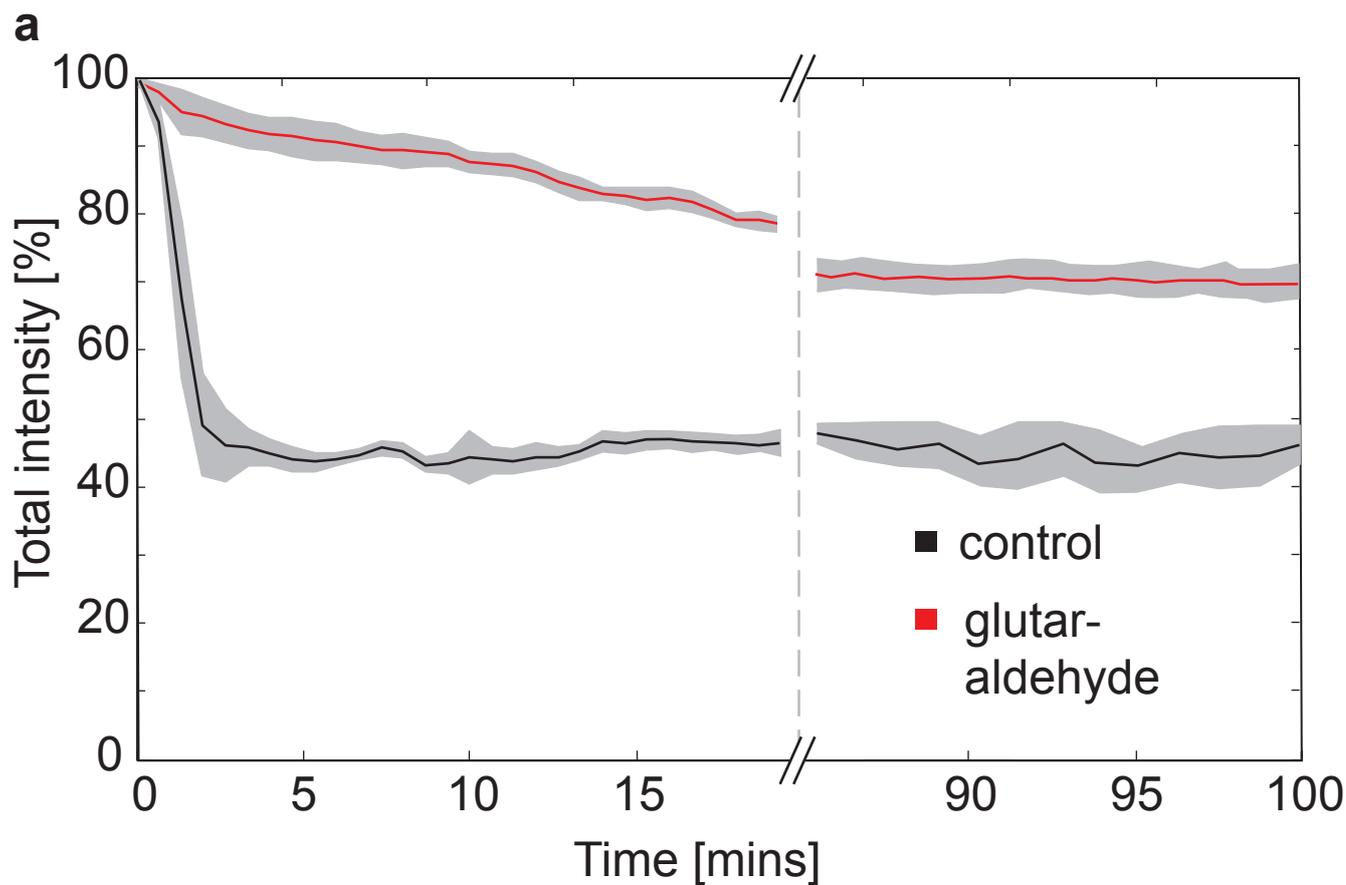


Figure S1 Collagenase digestion of control and glutaraldehyde-treated gels. (a) Integrated reflected light intensity of image stacks versus time (mean \pm se of 3 different gels). At $t=0$, collagenase was added to the gels. Every 40 s, an image stack was recorded over a volume of $185\mu\text{m}\times 185\mu\text{m}\times 50\mu\text{m}$. After collagenase treatment, collagen fibers disappeared faster in control gels (black line) compared to glutaraldehyde-treated gels (red line). (b-g) Confocal reflected microscopy images of control gels (top row) and glutaraldehyde-treated gels (bottom row) at different time points after collagenase addition. Scale bar is $20\mu\text{m}$.

Fluidity of collagen gels from magnetic tweezer measurements

During the application of force steps from 1 to 10nN, the displacement of beads coupled to collagen fibers can be fitted with a power law [1, 2]. The power-law exponent β defines the dissipative properties of the material, where 0 corresponds to an elastic solid and 1 to a viscous fluid. Untreated collagen gels showed predominantly elastic behavior ($\beta \sim 0.1$), which was further enhanced by glutaraldehyde treatment ($\beta < 0.05$).

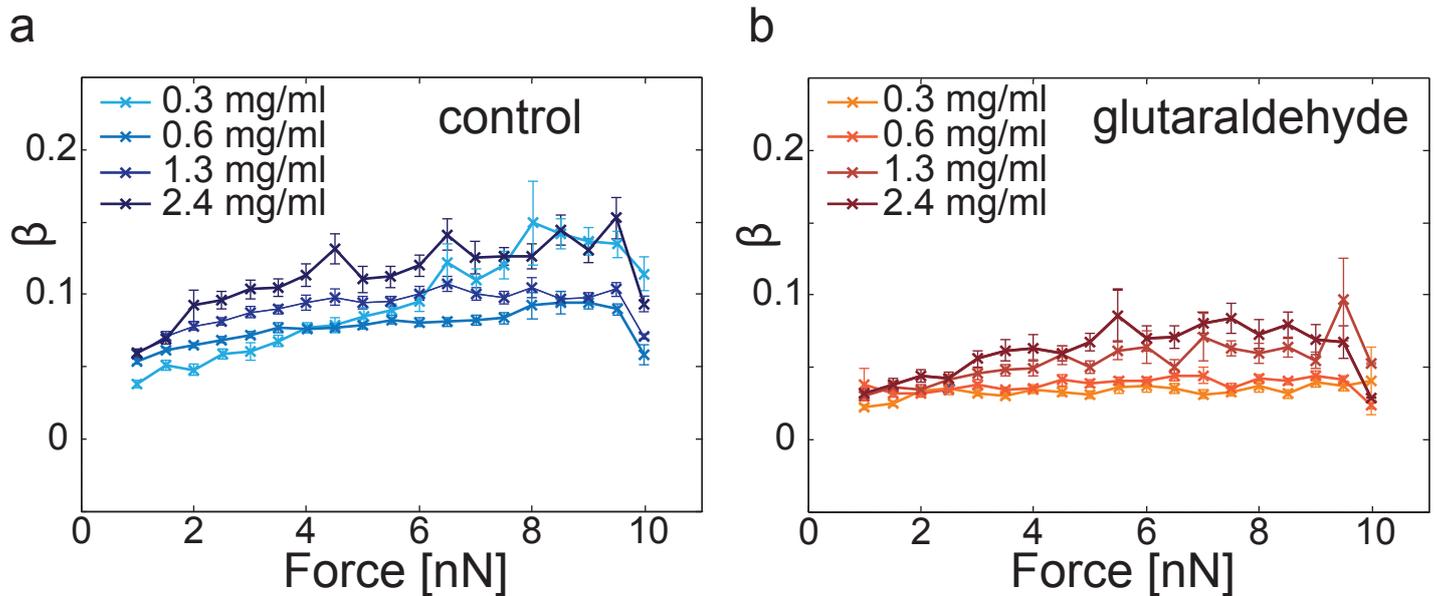


Figure S2 Power-law exponent versus applied force of untreated (a) and glutaraldehyde-treated (b) collagen gels measured from creep-experiments with magnetic tweezers.

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