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Complete List of Authors:	Debnath, Bhanjan; San Diego State University, Mechanical Engineering Narasimhan, Badri Narayanan; University of California San Diego Fraley, Stephanie; University of California San Diego, Bioengineering; University of California San Diego, Rangamani, Padmini; University of California San Diego, Department of Pharmacology

SCHOLARONE™ Manuscripts Page 1 of 37 Soft Matter

Modeling collagen fibril degradation as a function of matrix microarchitecture

Bhanjan **Debnath**¹, Badri Narayanan **Narasimhan**², Stephanie I **Fraley***², and Padmini **Rangamani** *^{1,3}

⁵ Department of Mechanical and Aerospace Engineering, University of California San Diego, ⁶ CA 92093, USA

²Department of Bioengineering, University of California San Diego, CA 92093, USA ³Department of Pharmacology, School of Medicine, University of California San Diego, CA

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10 Abstract

Collagenolytic degradation is a process fundamental to tissue remodeling. The microarchitecture of collagen fibril networks changes during development, aging, and disease. Such changes to microarchitecture are often accompanied by changes in matrix degradability. In a matrix, the pore size and fibril characteristics like length, diameter, number, orientation, and curvature are the major variables that define the microarchitecture. In vitro, collagen matrices of the same concentration but different microarchitectures also vary in degradation rate. How do different microarchitectures affect matrix degradation? To answer this question, we developed a computational model of collagen degradation. We first developed a lattice model that describes collagen degradation at the scale of a single fibril. We then extended this model to investigate the

^{*}To whom correspondence must be addressed: sifraley@ucsd.edu and prangamani@ucsd.edu

role of microarchitecture using Brownian dynamics simulation of enzymes in a multi-fibril three dimensional matrix to predict its degradability. Our simulations predict that the distribution of enzymes around the fibrils is non-uniform and depends on the microarchitecture of the matrix. This non-uniformity in enzyme distribution can lead to different extents of degradability for matrices of different microarchitectures. Our simulations predict that for the same enzyme concentration and collagen concentration, a matrix with thicker fibrils degrades more than that with thinner fibrils. Our model predictions were tested using in vitro experiments with synthesized collagen gels of different microarchitectures. Experiments showed that indeed degradation of collagen depends on the matrix architecture and fibril thickness. In summary, our study shows that the microarchitecture of the collagen matrix is an important determinant of its degradability.

35 1 Introduction

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Collagen is the most abundant protein present in tissues. Enzymatic degradation of collagen is an important process in both physiological and pathological conditions ^{1,2}. 37 For instance, an imbalance between collagen degradation and production can lead to 38 increased collagen accumulation resulting in fibrosis^{3,4}. Such fibrotic environments have been associated with an impaired degradative environment⁴. Studies have shown that the microarchitecture of collagen in the fibrotic extracellular matrix (ECM) is substantially different from the healthy tissues and they show higher resistance to degradation^{5,6}. As another example, cancer-associated fibroblasts in the tumor mi-43 croenvironment secrete collagen and continuously remodel their matrix. This abnormal 44 remodeling can lead to the cancerous microenvironment possessing a higher density of collagen and very different microarchitecture than a healthy ECM⁷. A body of work argues that alterations in collagen degradation can result in metastasis^{8,9}, and suggests possible connections between the matrix microarchitecture and its degradability 10-13.

Page 3 of 37 Soft Matter

However, the role of matrix microarchitecture in determining the degradability at the cellular length scale remains an open question. Here, we used multi-scale modeling and in vitro experiments to investigate possible mechanisms of matrix degradation at this length scale.

Most models of collagen gel degradation use Michaelis-Menten kinetics to model 53 the collagenase activity and show good agreement with experiments in predicting the 54 rate of total mass loss 14-17. These models cannot address the connection between the microarchitecture and degradation because of their continuum structure. Another class of models have treated collagen fibril as a thin filament of negligible thickness 57 (diameter $\sim 10-20$ nm) and proposed a degradation mechanism of one filament based 58 on movements of a few collagenase molecules over the filament surface 18,19. However, 59 many experimental findings have reported that the collagen fibrils in a matrix are significantly thicker (diameter in the range $\sim 0.1-0.5\,\mu\mathrm{m}$) than the value used in these models^{11,20–23}. Therefore, an open challenge in the field is to determine how 62 a filament-scale model can be extended to a fibril-scale model, and subsequently, to 63 a model where multiple fibrils are interacting with many collagenase molecules in a three-dimensional matrix.

In this work, we investigated how matrix microarchitecture can affect its degrad-66 ability. We developed a fibril-scale model using lattice-based approach to predict the 67 degradation of single fibril. To predict degradation of multiple fibrils by many enzyme 68 molecules in a matrix, we used Brownian dynamics to capture the enzyme distribution surrounding the fibrils in a three-dimensional matrix environment. We then combined the fibril-scale model with the enzyme distribution obtained from the Brownian dynamics simulations to predict the degradation of collagen matrices. Our model predicted 72 that differences in the microarchitecture between two matrices of same collagen density 73 can lead to different extents of degradation. Additionally, we predicted that fibril thickness can be an important determinant of degradation. We tested this prediction against in vitro experiments using collagen gels of different architectures, which showed that indeed, fibril degradation depends on the matrix microarchitecture. Thus our study

may provide new insights for understanding matrix alterations associated with disease and may influence the development of matrix targeted therapeutics, biomaterials and controlled drug delivery^{2,24,25}.

$_{\scriptscriptstyle \mathrm{1}}$ 2 Methods

In this section, we describe the details of the single fibril model, Brownian dynamics (BD) simulations, and experimental methods. We elaborate on each step of the model development and justify the assumptions based on previous experimental observations.

The notation and symbols used in this work are shown in Table 1.

⁸⁶ 2.1 Model development for the degradation of single fibril

We consider a single collagen fibril of mean diameter d_f and mean length ℓ_f . This fibril consists of a staggered arrangement of the triple helix tropocollagen units as shown in Fig. 1a^{26–29}. The enzymatic degradation of the fibril occurs in the presence of collagenases such as matrix metalloproteinases (MMP). These collagenases cleave the triple helix at a site that is at a distance ~ 67 nm (approx. 1/4 of the length of the triple helix) from the C-terminal of the tropocollagen unit (Fig. 1a)^{30,31}.

Previous experiments have reported that the collagenolytic degradation is a surface erosion process 14,32,33 . The minimum effective pore size inside a collagen fibril is a few multiples of the diameter of the tropocollagen, which is $d_{\rm TC} \sim 1.5~{\rm nm}^{26}$. This dimension is smaller than the size of the collagenase molecules which is in the range 50-120 kDa with a mean hydrodynamic diameter of $d_E \sim 10-20~{\rm nm}^{34}$. Based on the dimensions and following previous studies 14,32,33 , we assume that the diffusion of MMPs through the pores of the fibril can be ignored, and we model the fibril degradation as a surface erosion process.

We treated the fibril surface as a series of lattice sites to model the surface erosion process. The loss of lattice sites effectively is a measure of degradation. However,

Page 5 of 37 Soft Matter

predicting the size of a degrading fibril from the extent of lattice sites lost during degradation is not straightforward. Here we followed a lumped modeling approach to link the average size of a fibril to the number of lattice sites.

To simulate the surface erosion of the fibril, we developed a lattice-based model. 106 We divided the tropocollagen unit into lattice sites each of length d_m . Based on the 107 number of amino acid residues at the cleavage site region³³, we set $d_m = 8$ nm. As the 108 cleavage site is at a distance 1/4 of the length of the tropocollagen from its C-terminal, 109 we assumed that there is one vulnerable site (V) per tropocollagen unit, and we treat 110 the rest of the lattice sites as regular sites (R) (see Fig. 1a). With these dimensions, we 111 developed a relation between the size of a fibril and the number of lattice sites available 112 at its surface. To obtain the total number of lattice sites on the fibril surface, we next 113 estimate the number of tropocollagen units on that surface. At any given time t, the 114 number of tropocollagen units available for collagenolysis at the fibril surface is

$$N_{\rm TC}^s = \frac{\pi \, d_f \, \ell_f}{d_{\rm TC} \, (\ell_{\rm TC} + 0.54 \, \rm D)},\tag{1}$$

where $\ell_{\rm TC}$ is the length of the tropocollagen unit and (0.54 D) is the gap between two tropocollagen units (D \sim 67 nm) (see Fig. 1a). Thus, the total number of sites N^s at time t exposed at the fibril surface is

$$N^{s} = \frac{\ell_{\rm TC}}{d_{m}} N_{\rm TC}^{s} = \frac{\ell_{\rm TC}}{d_{m}} \frac{\pi \, d_{f} \, \ell_{f}}{d_{\rm TC} \, (\ell_{\rm TC} + 0.54 \, \rm D)}.$$
 (2)

Eqn (2) highlights the relationship between the total number of sites available for degradation and the size of the fibril. The number of vulnerable sites N_V^s exposed at the surface is the same as N_{TC}^s because one tropocollagen unit contains one vulnerable site, i.e., $N_V^s = N_{\text{TC}}^s$. Therefore the remaining $N_R^s = (N^s - N_V^s)$ are regular sites. Using eqn (2), we can estimate either ℓ_f or d_f . As the vulnerable sites are not aligned at the same plane inside the fibril (see Fig. 1a) and the collagenolytic degradation is a surface erosion process, we treat ℓ_f as a constant and predict d_f from eqn (2).

Soft Matter Page 6 of 37

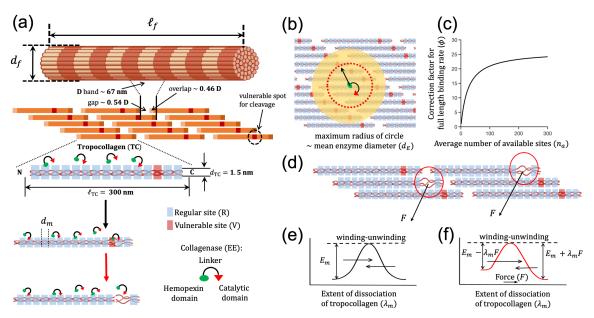


Figure 1: Modeling single fibril degradation. (a) Overview of the hierarchical organization of a collagen fibril and the degradation mechanism. We divide the tropocollagen unit into lattice sites (regular and vulnerable sites). The structure of the collagenase enzymes has two domains. (b) When one domain of the enzyme is bound to one lattice site, the other domain has access to only the neighboring unoccupied sites inside the red-dashed circle, whose radius is equivalent to the hydrodynamic mean diameter (d_E) of the enzyme. (c) To incorporate this effect in the intrinsic rates of the full-length binding (when both domains of an enzyme are bound to the lattice sites)/hopping kinetics, we propose a correction factor (ϕ) as a function of available sites (n_a) . (d) We propose that the enzyme-induced irreversible unwinding of the vulnerable sites induces a force, which affects the unwinding rate of the neighboring regular sites. The symmetric (e) and asymmetric (f) energy barriers for the winding-unwinding process of a lattice site.

As mentioned earlier, using Eqns 1 and 2, we will predict the average diameter of the fibril. It may happen that degradation at all points on a fibril surface do not occur at the same rate. This inhomogeneity can lead to spatial variations in the diameter and the shape of the fibril cross-section along the length of the fibril. These spatial variations cannot be captured using Eqns 1 and 2, as they represent a lumped system.

Page 7 of 37 Soft Matter

Table 1: Notation and list of symbols.

Notation	Description
d_f	mean diameter of a fibril
ℓ_f	mean length of a fibril
$d_{ m TC}$	diameter of the tropocollagen unit
ℓ_{TC}	length of the tropocollagen unit
d_E	mean hydrodynamic diameter of an enzyme
d_m	length of one lattice site
R	regular site
V	vulnerable site
EE	enzyme with two domains
E_*E_* class of symbols	enzyme partially (E_*E) or, fully bound (E_*E_*)
	to regular $(* = R)$ or, vulnerable $(* = V)$ sites
k_*^* class of symbols	different rate constants
N^s	total sites exposed on the fibril surface
N_R^s	number of regular sites exposed on the fibril surface
N_V^s	number of vulnerable sites exposed on the fibril surface
N_{EE}	number of free enzymes
$N_{E_*E_*}^s$ class of symbols	number of enzymes partially (or, fully) bound
	to regular (or, vulnerable) sites
ϕ	correction factor for intrinsic rates of full-length binding kinetics
n_a	number of available lattice sites per enzymes at partially-bound state
E_m	energy required to cross the symmetric energy barrier
λ_m	extent of dissociation at the unwound state
F	average force experienced by the lattice sites
γ	surface energy per unit area
$ au_c$	characteristic time associated with force dependent kinetics
$ au_e$	time for disentanglement of tropocollagen chains
l_p	nominal length scale
N_e^0	number of enzymes surrounding a fibril
$(N_e^0)_{total}$	total number of enzymes in the simulation box
D_e	diffusivity of enzymes
ϕ_f	volume fraction of fibrils
n_f	number of fibrils in the simulation box
A_f^0	initial surface area of a fibril
$(A_f^0)_{total}$	initial total surface area of all fibrils

Development of a reaction scheme to model the loss of lattice sites on a fibril

Previous experimental findings have shown that the MMP class proteinases (for example, MMP1) hydrolyze the peptide bonds at the vulnerable site of the collagen type I^{30,31}. Researchers hypothesized that the enzyme destabilizes the structure of the tropocollagen, and induces local unwinding around the vulnerable site before cleavage ^{30,33,35}. Using the hypotheses of Chung et al. ³⁰ and Perumal et al. ³³, and making the following assumptions, we propose a reaction scheme for enzyme kinetics (see Fig. 1a and the supplementary information (SI) section SI1 (Fig. S1)).

1. There are two types of lattice sites on the collagen surface: regular site (R) and vulnerable site (V). The MMP has two domains: Hemopexin (Hpx) domain and Catalytic (Cat) domain connected by a linker^{36,37}. Manka et al.³⁸ had shown a strict requirement of both domains to be linked together for efficient enzyme-collagen binding and collagenolysis.

- 2. Following Manka et al. 38 , we assume that the collagenase molecule has two domains, denoted by EE. Using these domains, the enzyme binds to the lattice sites via adsorption-desorption mechanism and hops on the sites. For the sake of simplicity, we assume that these two domains are equivalent and are of the same size.
- 3. First, using any one domain, the enzyme binds to a single site, in what is denoted as 'reversible partial binding'. This type of binding can result in two possible reactions.

$$EE + R \stackrel{k_+^1}{\underset{k_-^1}{\rightleftharpoons}} E_R E \qquad EE + V \stackrel{k_+^2}{\underset{k_-^2}{\rightleftharpoons}} E_V E \qquad (3)$$

For the reversible partial binding (eqn (3)), we implement the protein adsorptiondesorption kinetics ^{39,40} (see a short note on adsorption kinetics in section SI2). Page 9 of 37 Soft Matter

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4. When one domain of the enzyme is bound to one site, the other domain can also bind to another site. When both domains of an enzyme are in bound state, we term this state as 'full-length binding'. The enzyme molecule can jump or change track via hopping ^{18,19}. It hops on the regular sites via reversible bindingunbinding of one domain to a regular site while its other domain remains bound to another regular site.

$$E_R E + R \stackrel{k_+^3}{\underset{k_-}{\longleftarrow}} E_R E_R \tag{4}$$

5. Once the enzyme reaches a vulnerable site with both domains in the bound state, hopping stops, and is followed by enzyme-induced unwinding and the formation of product sites. These product sites are no longer available for binding new enzyme molecules.

$$E_V E + R \xrightarrow{k_+^4} E_V E_R \qquad E_R E + V \xrightarrow{k_-^5} E_V E_R \qquad (5)$$

Unwinding: $E_V E_R \xrightarrow{k_+^w} (E_V E_R)^*$ (6)

Product formation:
$$(E_V E_R)^* \xrightarrow{k_+^c} P + EE$$
 (7)

For the cases of full-length binding/hopping represented by eqn (4)-(5), the forward 167 reactions cannot be treated as second order kinetics because once one domain of an 168 enzyme is bound to one site, its other domain does not have accessibility to all available 169 lattice sites on the surface (see Fig. 1b). The unbound domain of the enzyme can find 170 another lattice site for binding within a searching circle whose radius is equivalent to d_E (the mean hydrodynamic diameter of the enzyme). To correct the intrinsic rates 172 of full-length binding kinetics, we multiply the rates with a correction factor ϕ . We 173 propose a phenomenological function for ϕ as (Fig. 1c) 174

$$\phi \approx \frac{\pi (d_E)^2}{d_m d_{\text{TC}}} \frac{n_a}{c_1 + n_a},\tag{8}$$

Soft Matter Page 10 of 37

where n_a is the number of available sites on the fibril surface. See section SI3 for more details of ϕ and section SI4 for the system of ODEs representing eqn (3)-(7). 176

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The enzyme-induced permanent unwinding followed by cleavage happens only at the exposed vulnerable sites in collagenolysis. However, it is not clear how the fibril 178 will lose other exposed regular sites at the surface due to the cleavage events so that the 179 new surfaces can be easily accessible to the enzymes for further degradation 18,19,30,33,41 . 180 Hence, we propose that the enzyme-induced permanent unwinding at the vulnerable 181 sites generates a force which assists the removal of more regular sites exposed at the 182 surface. We use the nonequilibrium rate-process theory of Eyring 42-44 and propose a 183 new rate-term \Re related to the force-dependent kinetics in an ad hoc manner in the 184 system of ODEs. We briefly describe \Re below. 185

As a result of thermal fluctuations, the lattice sites can be in any state between the 186 triple helical and (temporary) unwound configurations³³. If the rates of transition from the triple helical state to the unwound state and vice-versa are equal, there is no net 188 change in the tropocollagen units in absence of enzymes. We hypothesize that enzyme-189 induced permanent unwinding that leads to cleavage generates a local stress (Fig. 1d). 190 This mechanism is similar to the enzyme pulling chew-digest mechanism proposed by 191 Eckhard et al. 45. As a consequence, the other regular sites at the surface experience 192 an external force which affects the kinetics by increasing their net rate of unwinding 193 (Fig. 1e,f). This force can cause the slippage of chains, resulting in detachment from 194 the surface 46,47 . 195

To incorporate the force-dependent kinetics, we add a new term $\Re = k_R N_R^s$ in an ad hoc manner to the system of ODEs (see section SI4 for the system of ODEs). Here k_R is the net rate of flow over the energy barrier towards force assisted unwinding (Fig. 1e,f). We propose the following expression for $k_R^{48,49}$

$$k_R = \frac{k_B T}{h} \left[\exp\left(\frac{-(E_m - \lambda_m F)}{k_B T}\right) - \exp\left(\frac{-(E_m + \lambda_m F)}{k_B T}\right) \right],\tag{9}$$

where h is Planck constant, k_B is the Boltzmann constant, and T is the temperature.

Page 11 of 37 Soft Matter

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Here, E_m is the energy required to cross the symmetric barrier (Fig. 1e), λ_m is the extent of dissociation in unwound state which is chosen as ~ 3.6 Å 33 . Here F is the average force experienced by the remaining lattice sites. This force changes the energy barrier of unwinding to be asymmetric (Fig. 1f). If F = 0, $k_R = 0$. Following a heuristic approach, the average force (per remaining lattice site) is

$$F \sim \frac{1}{N^s} \left(\gamma \, d_m \, k_+^c \, \tau_c \right) \, \left(2 \, k_+^w \, N_{E_V E_R}^s \right) \tau_e,$$
 (10)

where $\gamma \sim \frac{k_B T}{d_m d_{\text{TC}}}$ is the surface energy per unit area^{50,51}, k_+^c and k_+^w are rate constants of cleavage and enzymatic unwinding, respectively, $N_{EVE_R}^s$ is the number of enzymes at fully-bound state (one regular and one vulnerable sites), τ_c and τ_e are, respectively, a characteristic time and time required to form disentangled chains during detachment from the surface. See sections SI5 for more details of F, τ_c and τ_e , section SI6 for the reaction rate constants, and section SI7 for the initial conditions to solve the ODEs. We solved the system of ODEs using ODE23s in MATLAB (Mathworks, Natick, MA).

2.2 Brownian dynamics (BD) to estimate the enzyme distribution around fibrils in a matrix

We next set up a collagen matrix that consists of stationary non-overlapping cylindrical 215 fibrils (Fig. 2a,b) for different fibril fractions. We modeled the enzymes as spheres 216 with a diameter of 10 nm³⁴, and simulated their Brownian motion using overdamped 217 Langevin dynamics⁵². We used MATLAB to set up the simulations. The fibrils and 218 enzymes are inserted in the simulation box such that they do not overlap and are 219 treated as hard particles. The fibrils are randomly inserted 53,54. Periodic boundary 220 conditions are applied in all three directions. For the sake of simplicity, all potential 221 interactions among fibrils and molecules are neglected and the motion of the enzymes 222 through the fibrous gel is simulated using Cichocki-Hinsen algorithm $^{55-57}$. The free diffusivity D_e of the enzyme is set to $74 \times 10^{-12} \text{ m}^2/\text{s}^{58}$. The time step for simulations 224

Soft Matter Page 12 of 37

is chosen $\Delta t_s = 10^{-6}$ s such that it is sufficiently small and the length increment in one time step is $\sqrt{D_e \Delta t_s} \sim O(d_E)$, which is equivalent to the size of the enzyme 226 $d_E \sim 10$ nm. In simulations and model predictions, all length dimensions are scaled by $l_p = 1$ µm, and the dimensions of the simulation box are chosen as $5 l_p \times 5 l_p \times 5 l_p$. 228 The entire codebase used in this work along with a readme file is available at https: 229 //github.com/RangamaniLabUCSD/Collagen_matrix_degradation.git. 230 For a length scale $l_p = 1 \mu m$ and the diffusivity of the enzyme (collagenase) 231 $D_e \sim 10^{-10} \text{ m}^2/\text{s}^{58}$, the time scale is of $O(l_p^2/D_e) \sim O(10^{-2})$ s. Hence the limit of instantaneous diffusion is valid in the long time limit for the chosen simulation box 233 dimensions ¹⁴. Based on this assumption, we proposed a hybrid framework (Fig. 2c). 234 In this framework, we run the simulation for a period of time and then obtain the 235 number of enzymes (N_e^0) surrounding the fibrils based on the shortest distances of en-236 zymes from the fibrils (Fig. 2d). We use the values of N_e^0 to solve the single fibril model 237 where the fibril-scale model considers the binding-unbinding and other types of inter-238 actions among the enzymes and fibrils through a set of reactions. Using this hybrid 239 modeling framework, we predict the degradation of all individual fibrils, effectively the 240 degradation of a matrix. The number of simulation time steps must be such that the enzymes get enough time 242 to distribute themselves inside the pores of the matrix. As the limit of instantaneous 243 diffusion is valid, the time span would be 10^{-2} s to 1 s for a dimension of the simulation 244 box 1 l_p to 10 l_p . Therefore, we chose the number of simulation time steps to obtain 245 enzyme distribution around fibrils as 10^5 to 10^6 , which is 10^{-1} s to 1 s. The enzyme distribution in this short time and in the long time limit would not differ, as BD 247 simulations do not consider the attractive interaction potentials among enzymes and 248 fibrils explicitly. 249 To perform the BD simulations, we chose an enzyme concentration $\sim 2.5 \ \mu g/mL$. 250 For the simulation box volume $5 l_p \times 5 l_p \times 5 l_p = 125 l_p^3$, the weight of enzymes is 312.5×10^{-18} g. The molecular weight (M_w^e) of collagenase varies between 70-130 kDa. We have chosen $M_w^e \sim 120$ kDa⁴⁵. For this chosen value, the estimate of total number

Page 13 of 37 Soft Matter

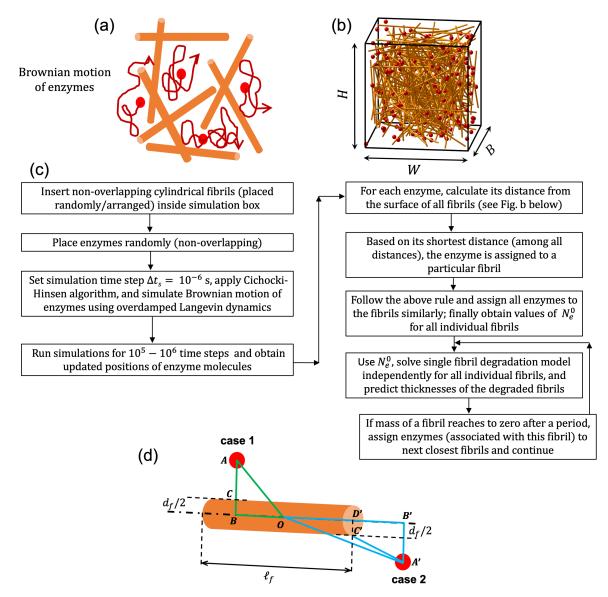


Figure 2: Brownian dynamics and hybrid simulation. (a) Schematic of the Brownian motion of enzymes inside the pores. (b) Configuration of the Brownian dynamics simulation where the cylinders represent collagen fibrils and the red spheres represent the enzyme molecules (not to scale). (c) Flowchart of the hybrid modeling approach. (d) Schematic representing the distance of an enzyme from the surface of a fibril. Based on the position of the enzyme with respect to any fibril surface, two cases are possible. For case 1, the distance chosen is $AC = AB - d_f/2$. Otherwise, $A'C' = \sqrt{(B'D')^2 + (A'B' - d_f/2)^2}$ is the chosen distance for case 2, where $B'D' = \sqrt{(OA')^2 - (A'B')^2} - \ell_f/2$.

Soft Matter Page 14 of 37

of enzymes in simulation volume is $(N_e^0)_{total} \sim 1500$.

We fixed the enzyme concentration and vary the collagen concentration, or equiv-255 alently, the fibril fraction ϕ_f . Here ϕ_f is the ratio of the volume of all fibrils to the 256 volume of the simulation box. See section SI8 for more details on estimation of the 257 fibril fraction ϕ_f from a collagen concentration. By varying fibril diameter d_f , fibril 258 length ℓ_f and number of fibrils n_f , we vary ϕ_f in the range 0.003-0.03, i.e. 0.3-3%259 for organs such as brain, liver, kidney, etc.⁵⁹. These three parameters, d_f , ℓ_f and n_f , 260 are important factors to address different matrix microarchitectures. The orientation 261 and curvature (or, crimping) of the fibrils can be other factors 12, however, we did not 262 consider their roles in the present work. 263

2.3 Experimental methods

Following the experimental methodologies of Ranamukhaarachchi et al. 11 , we used rat 265 tail type I collagen to synthesize the collagen gels. To vary the microarchitecture of the 266 gels, we used polyethylene glycol (PEG) as a macro-molecular crowding agent. After 267 polymerization of collagen using PEG at 37°C, PEG was washed out of the gels by 268 rinsing them with Dulbecco's Modified Eagle Medium (DMEM) solution. We then 269 treated the gels with a bacterial collagenase. To characterize the microarchitectures of the gels pre- and post-degradation, we performed fast green staining and imaging using 271 the confocal fluorescence microscopy and scanning electron microscopy. See section SI9 272 for more details of the experimental methods. 273

$_{\scriptscriptstyle{74}}$ 3 Results

3.1 Single fibril degradation

We first calibrate single fibril model and compare single fibril surface erosion model against previously published experiments of Flynn et al.²¹. In the absence of external loading, our model captured the experimental trend (Fig. 3a). See section SI10 for

Page 15 of 37 Soft Matter

more details. When the fibril is under external loading, perhaps the external tension 279 increases the stability of the triple helices by increasing the energy barrier for enzy-280 matic unwinding^{29,60-64}, which is different from the mechanism for an isolated triple 281 helix under external tension 65,66 . Under low loading of ~ 2 pN per tropocollagen 282 monomer^{21,62}, a small increase in the energy barrier E_m for enzymatic unwinding by 283 $\delta E_m = 0.013 E_m$ explains the experimental trend satisfactorily (Fig. 3a). See section 284 SI10 for the choice of $\delta E_m = 0.013 E_m$. Overall, our model captured the experimental 285 trends for a degrading fibril under different external loading conditions reasonably well. 286 In a surface erosion process, the degradability of a fibril must be proportional to 287 the ratio N_e^0/A_f^0 , where N_e^0 and $A_f^0=(\pi\,d_f^0\,\ell_f)$ are the number of enzymes surrounding 288 a fibril and the initial surface area of the fibril, respectively. For a fibril of fixed 289 initial diameter d_f^0 , an increase in N_e^0 increases the degradability (Fig. 3b). However, 290 for a fixed value of N_e^0 , the degradability decreases with the increase in d_f^0 (Fig. 3c). The quantity $(d_f^0 - d_f)/d_f^0$ represents the relative decrease in the diameter. Its smaller 292 value represents less degradation and vice versa. We provided a few results (Fig. S2) on 293 degradability and the ratio N_e^0/A_f^0 in section SI10. In summary, our model predictions 294 captured the scaling related to a surface erosion process. 295

²⁹⁶ 3.2 Degradation of collagen matrices

Having established that the single fibril model captures experimentally observed degradation rates (Fig. 3a), we next focused on degradation of collagen fibrils in matrices. Before addressing matrix degradation, we define two important dependent parameters: the initial volume fraction of fibrils as $\phi_f = \left(n_f \frac{\pi}{4} \sum_i ((d_f^0)^2 \ell_f)_i\right)/\text{vol.}^{\text{box}}$, and the initial total surface area (scaled) of fibrils as $(A_f^0)_{total} = \left(n_f \pi \sum_i (d_f^0 \ell_f)_i\right)/l_p^2$.

Degradation of matrices with uniform fibrils

We first considered uniform fibrils of same initial diameter d_f^0 and length ℓ_f , and investigated the effect of the number of fibrils n_f , d_f^0 , and ℓ_f on degradation. Using

Soft Matter Page 16 of 37

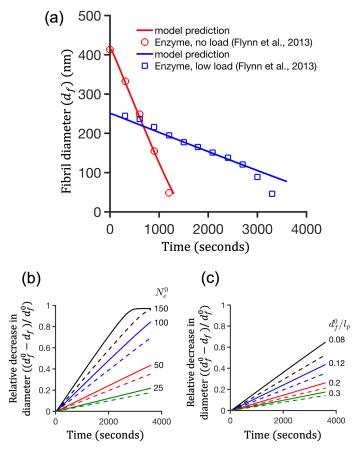


Figure 3: Degradation of single fibril. (a) Validation of the single fibril model with the experimental findings of Flynn et al. ²¹. Relative decrease of fibril diameter $(d_f^0 - d_f)/d_f^0$ (or, the extent of degradation) with time for two cases: (b) fixed initial fibril diameter $d_f^0/l_p = 0.12$ and varying number of enzymes surrounding a fibril (N_e^0) ; (c) Varying d_f^0/l_p and fixed $N_e^0 = 50$. Here $l_p = 1$ µm is a nominal length scale. The length of the fibril is $\ell_f/l_p = 2$ in (b) and (c). The solid and dashed curves in (b) and (c) correspond to $k_+^c = 0.583 \text{ s}^{-167}$ and 0.472 s^{-168} , respectively.

Page 17 of 37 Soft Matter

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the hybrid approach described in Fig. 2b,c, we counted the number of enzymes N_e^0 surrounding every single fibril (Fig. 4a). We used this count of the number of enzymes to obtain a probability density function (PDF) of N_e^0 for a given matrix (Fig. 4b).

We observed that the enzyme distribution was not uniform across the fibrils in a matrix (Fig. 4a,b), suggesting that the organization of the collagen fibrils was a major determinant of the enzyme distribution. There are a few factors that can result in this non-uniform distribution of enzymes around fibrils. First, the cylindrical geometry of fibrils can result in an anisotropy of the diffusive motion of enzymes ^{69,70}. Even if the cylindrical geometries of the fibrils are taken into account, for enzyme distributions in a matrix to be nearly uniform, fibrils should be organized in an equidistant manner with parallel alignment. This organization ensures a uniform pore size around cylindrical fibrils and can result in nearly uniform enzyme distribution (see SI Fig. S3). How-316 ever, the random placement and random orientation of fibrils induces a non-uniform distribution of pore sizes. These factors together can result in a non-uniform enzyme distribution in a fibrillar matrix. Our simulations show that this finding of non-uniform distribution of enzymes holds for different values of fibril diameter, fibril length, and number of fibrils (Fig. 4e).

The enzyme distributions do not differ much between two matrices if we vary only 322 d_f^0 , fixing $\ell_f/l_p=2$ and $n_f=25$ (Fig. 4b). Using the values of the number of enzymes in 323 Fig. 4a, we solved the single fibril model for each of the individual fibrils and calculated 324 the diameters of the fibrils (Fig. 4c). As expected, each fibril degrades to a different 325 extent because of the difference in the number of enzymes surrounding it. Using these 326 single fibril data, we obtained the PDF of the relative decrease in the diameter of the 327 fibril $(d_f^0 - d_f)/d_f^0$ (Fig. 4d). Thus, we find that although the initial fibril diameter 328 is uniform, the degraded fibrils have a distribution of diameters because of the non-329 uniform enzyme distribution. 330

We next investigated the effect of the number of fibrils n_f on the extent of degrada-331 tion. From our simulations, we find that the enzyme distribution is a strong function of n_f (Fig. 4e). For a fixed value of $(N_e^0)_{total}$, we can expect a decrease in the average

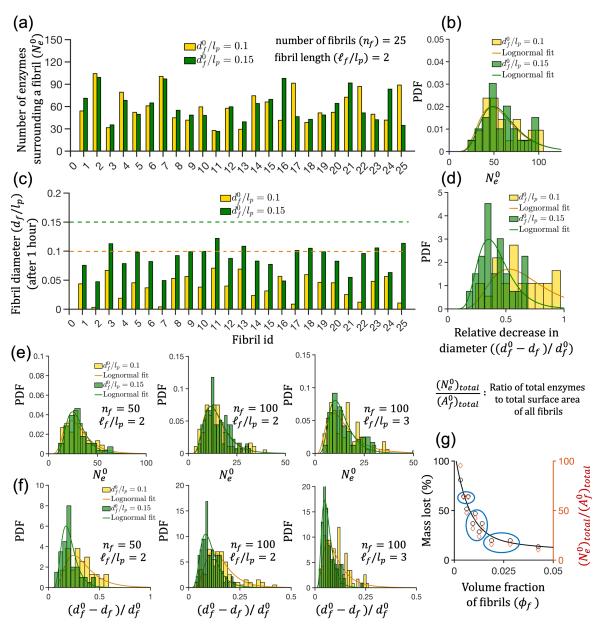


Figure 4: Degradation of collagen matrices. (a) The values of the number of enzymes N_e^0 surrounding the individual fibrils in a matrix for two different matrices of same fibril length ℓ_f and number of fibrils n_f , but for two different values of initial fibril diameter $d_f^0/l_p = 0.1$ and 0.15. (b) The probability density function (PDF) of N_e^0 generated using the data in (a). (c) The predicted diameters of the fibrils after 1 hour of degradation by enzymes for the cases in (a). (d) The PDFs representing the relative decrease in diameter $(d_f^0 - d_f)/d_f^0$ for the data shown in (c). Panels (e) and (f) represent PDFs of N_e^0 and $(d_f^0 - d_f)/d_f^0$ for different values of d_f^0 , n_f and ℓ_f . (g) The percentage of the mass lost (left ordinate) and the ratio $(N_e^0)_{total}/(A_f^0)_{total}$ (right ordinate) with the volume fraction of fibrils ϕ_f . The black curve in (g) represents a fit to the data points corresponding to the left ordinate. The data points inside the blue circles show non-monotonous trends of the mass lost and the ratio $(N_e^0)_{total}/(A_f^0)_{total}$ with respect to ϕ_f .

Page 19 of 37 Soft Matter

357

value of N_e^0 per fibril if n_f increases. When comparing two matrices of the same d_f^0 and ℓ_f , the matrix with higher number of fibrils degrades to a lesser extent than the matrix with fewer fibrils (Fig. 4d,f). We also find that an increase in d_f^0 and ℓ_f decreases the degradability of the matrix for fixed values of n_f and $(N_e^0)_{total}$ (Fig. 4d,f) because of the decrease in the ratio $(N_e^0)_{total}/(A_f^0)_{total}$.

Effect of matrix architecture on fibril degradation

Since we model the single fibril degradation as a surface erosion process, the extent of degradation for a matrix must be proportional to the ratio of the total number of enzymes to the total surface area of the fibrils $(N_e^0)_{total}/(A_f^0)_{total}$. The overall mass lost, defined as

$$\text{mass lost} = \frac{\left[\sum_{id=1}^{n_f} \frac{\pi}{4} (d_f^0)_{id}^2 \ell_f\right] - \left[\sum_{id=1}^{n_f} \frac{\pi}{4} (d_f)_{id}^2 \ell_f\right]}{\sum_{id=1}^{n_f} \frac{\pi}{4} (d_f^0)_{id}^2 \ell_f} \times 100,$$
 (11)

represents a direct estimate of the matrix degradation. In matrices, we considered the lost volume of all fibrils even if a thin fibril is fully digested. We used Eqn 11 to obtain 345 the total mass lost. This equation includes all fibril volumes whether fully digested or 346 not. For all combinations of n_f , d_f^0 and ℓ_f , we find a direct correlation between the mass lost and the ratio $(N_e^0)_{total}/(A_f^0)_{total}$ (Fig. 4g) when they are plotted against the 348 fibril fraction ϕ_f . However, the variation of the mass lost and $(N_e^0)_{total}/(A_f^0)_{total}$ with ϕ_f 349 are not strictly monotonous (blue circles in Fig. 4g), although their trends appear to be 350 monotonically decreasing as ϕ_f increases. The circled data points in Fig. 4g show that 351 for the same enzyme concentration, different extent of degradation can occur between 352 two matrices of same fibril fraction ϕ_f (equivalently, the same collagen concentration) 353 and vice versa. This finding leads to the following question: does the difference in 354 microarchitecture of two matrices of same ϕ impact the extent of degradation? We 355 answer this question by conducting the following simulations. 356

We fix the value of ϕ_f and the enzyme concentration, and consider the matrices with

uniform fibrils. Without varying ℓ_f , different matrices of same ϕ_f can be generated 358 by adjusting the values of n_f and d_f^0 (Fig. 5a). For example, as $\phi_f \propto n_f (d_f^0)^2$, a 359 50% decrease in d_f^0 can increase n_f up to 4 times, resulting in twice the increase of the surface area $((A_f^0)_{total} \propto n_f d_f^0)$. For the case of constant ϕ_f and smaller d_f^0 , n_f increases 361 and shifts the enzyme distribution towards the left (Fig. 5b). Simulations show that 362 a matrix composed of thinner fibrils degrades less than that a matrix composed of 363 thicker fibrils (Fig. 5c). This is an unexpected result and counterintuitive to what 364 we might expect from a single fibril model. In the single fibril degradation model, a 365 thinner fibril degrades more than a thicker fibril if the enzyme concentration is the same 366 (Fig. 3c) because of lesser surface area of a thinner fibril available to larger number of 367 enzymes. In contrast, in a three-dimensional, randomly oriented and randomly placed 368 fibril network, multiple factors affect the enzyme distribution as discussed previously. 369 Thus, this finding highlights the importance of incorporating the three-dimensional spatial considerations including diffusion of enzymes and matrix microarchitectures into 371 the model. The results in Fig. 5d-f show how the number of fibrils changes for different 372 sets of (d_f^0, ℓ_f) when ϕ_f is fixed, which directly influences the ratio $(N_e^0)_{total}/(A_f^0)_{total}$, 373 and the overall mass lost. In summary, our simulations predict that for the same 374 enzyme concentration, uniform fibril diameter, and the same fibril fraction ϕ_f , a matrix 375 with thicker fibrils can degrade more than that with thinner fibrils (Figs. 5d-f). 376

To compare this model prediction on matrix degradability, we performed *in vitro* experiments with synthetic collagen gels and investigated their degradability.

3.3 Experiments reveal that matrix microarchitecture governs degradability

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Ranamukhaarachchi et al. ¹¹ previously showed that the microarchitecture of a collagen gel can be modulated using polyethylene glycol (PEG) as a macro-molecular crowding (MMC) agent. They also reported that the degradability of the gels varies with the matrix microarchitecture. Using this background, to test our model predicPage 21 of 37 Soft Matter

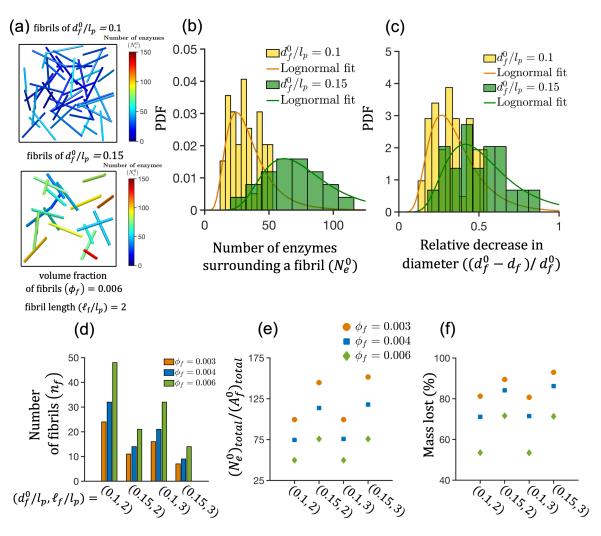


Figure 5: Matrix with thicker fibrils degrades more than that with thinner fibrils. (a) The initial configurations of two matrices having the same fibril fraction $\phi_f = 0.006$. The color bars in (a) represent the number of enzymes (N_e^0) surrounding the fibrils. For the configuration in (a), the PDF of enzyme distribution N_e^0 (b) and the PDF of the extent of degradation of fibrils $(d_f^0 - d_f)/d_f^0$ (c). For matrices having different ϕ_f , the first (d), second (e) and third (f) panels report the number of fibrils in matrices, $(N_e^0)_{total}/(A_f^0)_{total}$ and the percentage mass lost (overall degradation of matrices), respectively. All results correspond to the total number of enzymes $(N_e^0)_{total} = 1500$ and time 60 minutes.

Soft Matter Page 22 of 37

tions, we prepared collagen gels with two different microarchitectures from the same 385 collagen concentration. We used 2.5 mg/ml collagen (final concentration) and two 386 different MMC concentrations: 2 mg/mL PEG designated as P2 and 8 mg/mL PEG 387 denoted as P8 (Fig. 6a). We used a bacterial collagenase concentration of 2.5 µg/mL 388 (final concentration) to perform degradation experiments. Using fast green staining 389 images and scanning electron microscopy (SEM), we quantified the fibril length and 390 thickness distributions respectively before and after degradation. We denote the gels 391 post-degradation as P2x and P8x. 392

Fig. 6b shows the fast green stained images, and the length distributions for P2/P2x 393 (Fig. 6c) and P8/P8x (Fig. 6d). The mean length of the fibrils in P8 ($\sim 3 \pm 0.2 \mu m$) 394 is slightly smaller than that of P2 ($\sim 3.3 \pm 0.4 \mu m$). From Fig. 6b, it is obvious 395 that P2 degrades more than P8 as larger pores are present in P2x. However, there is 396 no significant change in the length distributions before and after degradation in both 397 P2/P2x and P8/P8x (Fig. 6c,d); the decrease in the mean length post-degradation is 398 less than \sim 8%. Hence the assumption of treating the fibril length ℓ_f as a constant 399 in our model is supported by the experimental findings. The green stained images 400 (Fig. 6b) reveal that the number of fibrils is higher in P8 than that in P2 (through 401 visualization). 402

The SEM images (Fig. 6e) and the histograms of the fibril diameters (Fig. 6f,g) 403 show that the fibrils are thicker in P2 than in P8. The mean diameter of the fibrils in 404 P8 ($\sim 0.09 \pm 0.02 \ \mu m$) is $\sim 25\text{--}30\%$ smaller than that of P2 ($\sim 0.13 \pm 0.03 \ \mu m$). After 405 degradation, the decrease in the diameter occurs in both P2x and P8x (Fig. 6f,g). We 406 performed statistical comparisons of the distributions by log normal fits (see section 407 SI11). We did not find significant differences in length distributions, but there are 408 differences in the diameter distributions. Quantification of the diameters of the fibrils 409 show that P2 (Fig. 6f) degrades more than P8 (Fig. 6g). The decrease in the mean 410 diameter is $\sim 30-40\%$ in P2x and $\sim 15\%$ in P8x. Thus, experiments validate our 411 model predictions that a matrix with thicker fibrils can degrade more than one with thinner fibrils for the same collagen and collagenase concentrations. 413

Page 23 of 37 Soft Matter

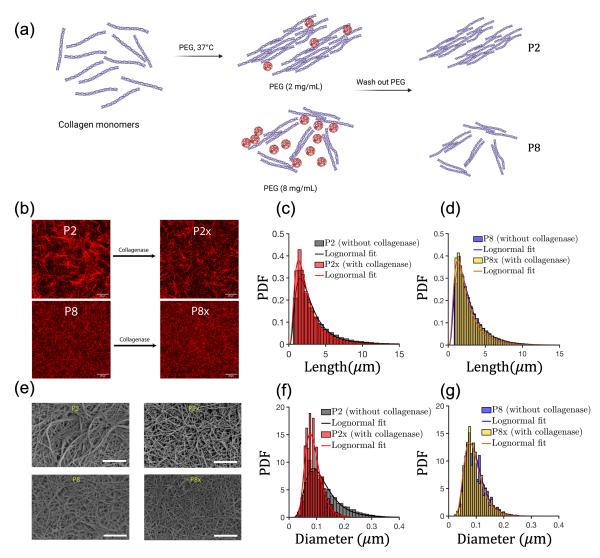


Figure 6: Experimental findings. (a) Preparation of collagen gels. (b) The fast green stained images of the gels (scale bar 20 μ m). The length distributions of (c) P2/P2x and (d) P8/P8x before and after treatment with collagenase from the green stained images. (e) The SEM images of P2/P2x and P8/P8x (scale bar 2 μ m). The histograms of fibril diameters for (f) P2/P2x and (g) P8/P8x.

Soft Matter Page 24 of 37

Model predictions for matrices with non-uniform fibrils highlight the role of microarchitecture in degradation

To further reinforce the role of matrix microarchitecture, we note that the significant 416 differences between the microarchitectures of P2 and P8 are primarily due to the number of fibrils and fibril diameter. In P2, there are less number of fibrils and the fibrils 418 are thicker. However, in P8, there are higher number of fibrils but the fibrils are thin-419 ner, compared to P2 (Fig. 6). Our model predicts higher degradability of a matrix with 420 thicker fibrils than that with thinner fibrils (Figs. 5). Thus, we can qualitatively ex-421 plain why the matrix with the P2 architecture degrades more than the P8 architecture. 422 However, our simulations in Fig. 5 are for fibrils of uniform initial diameter. Because 423 the experimentally synthesized matrices had fibrils with a distribution of diameters, we 424 next simulated the degradation of fibrils in matrices of experimentally-inspired fibril 425 diameter distributions. 426

We generated the fibrils whose diameters matched the experimentally observed 427 diameters of P2 and P8 (Fig. S5 and Fig. S6 in section SI11 for more details). In any 428 matrix (whether P2 or P8), we set the length of the fibrils the same. As the mean length 429 of P8 is approximately 8–10% smaller than that of P2 in experimental findings, we set 430 the mean fibril length of P8 10 % smaller than that of P2 in simulations. We used a fibril 431 fraction of $\phi_f = 0.007$ in both cases as this value is close to the collagen concentration 432 used in the experiments. As a result, in these newly generated matrices, the number of 433 fibrils is higher for P8 $(n_f \sim 75)$ than that in P2 $(n_f \sim 40)$ for the same fibril fraction 434 ϕ_f . We compared the outcomes of degradation in these conditions as shown in Fig. 7. 435 The microarchitectures are different for P2 and P8 (Fig. 7a,b) in terms of the number of fibrils and the diameters. As a result, the enzyme distribution for P8 shifts to the left 437 due to larger number of fibrils (Fig. 7c) and implies less number of enzymes per fibril. 438 The diameter distributions (in the range 0.03-0.2 µm) of P2 and P8 before and after 439 degradation (Fig. 7d,e) and the overall mass lost (Fig. 7f) indicate that P2 degrades 440 more than P8 for the same collagen and enzyme concentrations, in agreement with

Page 25 of 37 Soft Matter

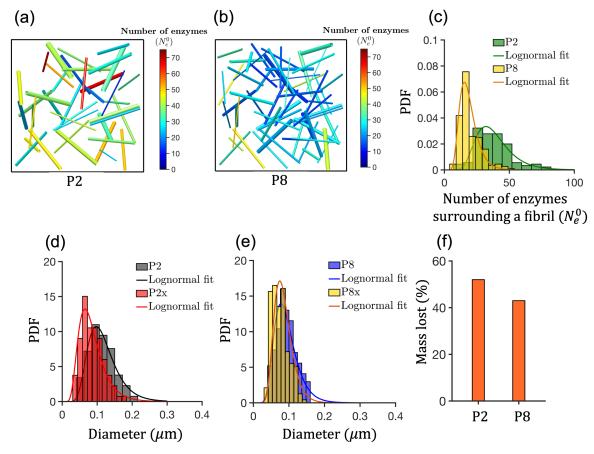


Figure 7: Simulations of matrices with non-uniform fibrils predict that P2 degrades higher than P8. The initial configurations of two matrices, P2 (a) and P8 (b), with the same fibril fraction $\phi_f = 0.007$. The color bars in (a) and (b) represent the number of enzymes (N_e^0) surrounding the fibrils. For the configuration in (a) and (b), the PDF of the enzyme distributions N_e^0 (c), the PDF of the diameters of the fibrils for P2/P2x (d) and P8/P8x (e), and the overall mass lost (f). The results correspond to the total number of enzymes $(N_e^0)_{total} = 1500$ and time 60 minutes.

Soft Matter Page 26 of 37

experiments (Fig. 6e,f). Our simulation results using non-uniform fibril diameter only reinforce our model predictions that the matrices of the same collagen concentration can have very different microarchitectures and the matrices can degrade differently under the same collagenase concentration. In summary, our study reveals that matrix microarchitecture plays an important role in degradation of collagen matrices.

$_{7}$ 4 Discussion

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In this study, using a combination of modeling and experiments, we investigated the 448 collagenolytic degradation of collagen matrices. Unraveling the connection between 449 the matrix microarchitecture and degradation is important to design biomaterials and 450 understand ECM remodeling at cellular length scale. Previous models are either con-451 tinuum or discrete, and thus, they predict either overall rate of degradation or degra-452 dation at the nanoscale 14,15,17,19. The model and framework we developed in this work 453 to investigate the collagen matrix microarchitecture and matrix degradation is novel 454 in the sense that it addresses the connection between the nanoscale degradation and 455 the microscale microarchitecture.

The single fibril component of our model shows the capability to capture experimental trends under different loading conditions. Furthermore, the integration of multiscale model components shows that matrix microarchitecture is a strong determinant of matrix degradability. This relationship emerges because the fibrillar network causes the enzyme distribution in a matrix to be non-uniform, and this enzyme distribution leads to fibrils of distributed diameters even if the fibrils are initially uniform in size. This explains how matrices of the same collagen concentration but different microarchitectures can degrade differently under the same collagenase concentration. These findings are backed by *in vitro* experiments with collagen gels of different microarchitectures.

However, our model has also some drawbacks. The lattice-based single fibril model has a limitation to predict the spatial variations in the size and shape of a degrading fibril. In our simulations, the fibrils are non-stretchable, and we did not explicitly con-

Page 27 of 37 Soft Matter

sider explicitly the potential energy based attractive interactions among the fibrils and 469 enzymes. At present, it is difficult to state a priori whether the potential interactions 470 can affect the temporal evolution of the enzyme distribution which merits further at-471 tention. One of the limitations of our current simulation strategy is that we modelled 472 collagen fibrils as rigid rods, therefore it is not possible to simulate single fibril degra-473 dation under tension using the current simulation framework. One possible way to 474 simulate soft fibrils under tension can be using molecular dynamics simulations. Many 475 researchers performed molecular dynamics at the tropocollagen scale (for example, see Chang et al. ⁶⁰). While molecular dynamics simulations are outside the scope of the 477 present work, we anticipate future advances in this area. 478

Another important opportunity would be predicting matrix degradation under dif-479 ferent external stretching conditions. Some experimental observations 71,72 reported 480 that the degradation rate of a matrix decreases and then increases with an increase in strain, leading to a V-shape profile for degradation rates as a function of loading. 482 Our model is currently able to predict matrix degradation under no external stretching 483 conditions. The presence of fibril connectivity and crosslinks may change the force 484 distribution among the degrading fibrils under tension. Future enhancements to our 485 simulation framework include simulations of soft fibrils with fibril connectivity and 486 crosslinks. Furthermore, the current hybrid model does not consider fibril orientation, 487 the effect of crosslinking and crimping of fibrils. We speculate that the crimping in-488 duced curvature and orientation may influence enzyme distribution and degradability. 489 These topics merit more attention and form a part of future work. 490

In summary, our single fibril model and hybrid modeling framework effectively capture multi-scale effects to predict the degradation of three-dimensional matrices with different microarchitectures. Although relatively simple, this framework sheds light on how collagen matrix degradability is tuned by matrix microarchitecture. Further model developments can also include additional vulnerable sites for making it specific to the bacterial collagenase²⁹. Such modifications will reflect in the changes of the rate constants and initial number of vulnerable sites. However, the mechanism of enzyme induced permanent unwinding will likely remain the same.

This work has important implications for a number of fields, including matrix biol-499 ogy, cell migration, and biomaterials. A recent work 13 showed that matrix degradability can translate into differences in stress relaxation that can be sensed by cells through 501 effects on cell-matrix adhesions. Perhaps related to this phenomenon, another work⁷³ 502 showed that cell invasiveness is upregulated for breast cancer cells inside collagen net-503 works comprised of thick fibrils, whereas the invasiveness decreased substantially for 504 thin fibrils of similar pore diameter and elastic modulus. These observed differences in invasiveness may be linked to the differences in the degradability and resulting mechan-506 ical changes of thick and thin fibrillar architectures. An important future direction is 507 to scale modeling efforts to decellularized ECM and tissues. In the field of biomaterial 508 design, synthetic matrices developed so far focus on recapitulate the biochemical and 509 mechanical features of the ECM. Controlling the degradability by mimicking native collagen architectures 11,12,74 could offer valuable insights into cellular function. 511

512 Conflicts of interest

There are no conflicts to declare.

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Page 29 of 37 Soft Matter

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Soft Matter Page 34 of 37

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Page 35 of 37 Soft Matter

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Page 37 of 37 Soft Matter

Data Availability Statement

Raw data supporting the findings of this study will be made available upon reasonable request. The entire codebase used in this work along with a readme file is available at https://github.com/RangamaniLabUCSD/Collagen_matrix_degradation.git.