CHAPTER 19

OUT OF MANY, ONE: MODELING SCHEMES FOR BIOPOLYMER AND BIOFIBRIL NETWORKS

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Abstract: Tissues are structurally and compositionally complex materials that must function in a coordinated fashion at multiple length scales. Many of the structural proteins in soft tissues and in cells form biopolymer networks that provide mechanical benefits and coordinate cell-directed physiological activities. Complicated phenomena operate at multiple scales and are governed to varying degrees by the properties of networks; thus, mechanical models are a necessary tool to unravel the relationships among individual network components and to determine the aggregate properties and functions of cells and tissues. In this work, we review major biopolymers, their function, and the general mechanical behavior of biopolymer gels. We then discuss some network imaging techniques and methods for constructing and modeling networks /in silico/ – including multi-scale methods. Finally, we return to the specific biopolymers, including actin, microtubules, intermediate filaments, spectrin, collagen I and IV, laminin, fibronectin, and fibrin, and discuss what has been learned from the different models. Biopolymer network models, especially when combined with ever-improving experimental methods, have the potential to answer many fundamental questions in mechanobiology

Keywords: Collagen, Actin, Multi-scale

19.1. INTRODUCTION

Tissues are complex materials composed of cells and extracellular matrix (ECM) proteins that must function in a coordinated fashion at multiple length scales. Biopolymer networks that form the ECM vary in composition and organization in a manner that confers suitable mechanical properties to the tissue and allows tissues to function in their physiological capacity. Mechanical loads and constraints applied to the whole tissue are transmitted down through the matrix and into the cells. The cells, which are stabilized and detect mechanical forces through the cytoskeleton – an intracellular network – then respond through a variety of dynamic activities that can lead to growth, remodeling, and adaptation.

The network architecture provides many beneficial properties to cells and tissues. Networks produce strong and stable structures with a minimum investment in materials. Their open configuration enables various transport processes (e.g. nutrient diffusion) to occur with less hindrance, and permits cell locomotion when appropriate (e.g. white blood cells). Also intrinsic to networks is the ability to communicate signals rapidly and at a distance. In terms of mechanical signaling, such a system may provide a means to coordinate cell behavior within tissues [\[1,](#page-34-0) [2\]](#page-34-1).

With many complicated phenomena operating at multiple scales and governed to varying degrees by the properties of networks, mechanical models become a necessary tool for unraveling the relationships between individual network components and the aggregate properties and function of cells and tissues. *A sampling of the kinds of questions about cell and tissue function that mechanical models can provide answers to includes:*

- How do tissue material parameters depend on the biopolymers and networks structure, e.g. what components and deformations contribute to the elastic response and where does time-dependent viscous behavior come from?
- How does the ECM microstructure reorganize to accommodate macroscopic strain? Do fibers rotate, stretch, bend, or buckle?
- What do those rearrangements mean in terms of mechanical signals that can be sensed by cells?
- How does a cell sense mechanical force and translate that into a decision to act in a certain way? For example, how do stimuli cause synthesis or degradation?
- How do mechanical changes in the ECM lead to different diseases, and how might they be prevented?
- What components and what structural arrangements are necessary to produce a functional engineered-tissue?

The questions listed above are all inherently *multiscale*, with the tissue scale $(\sim 10^{-3}$ m), cell scale ($\sim 10^{-5}$ m), ECM fiber scale ($\sim 10^{-7}$ m), biomacromolecular scale (\sim 10⁻⁹–10⁻⁸ m), and atomic scale (\sim 10⁻¹⁰ m). Although not all scales necessarily need to be studied to answer every question, any approach to understanding mechanobiology and biomechanics from a structural standpoint must respect their scale-spanning nature.

In this work, which emphasizes network mechanics, we focus on the transitions from biopolymer to cell (as in the cytoskeleton), biopolymer to tissue (as in basement membrane), and fiber to tissue (as in ECM or bioartificial tissues). In each case, the network consists of long, thin units connected in a structured or unstructured manner.

In the next section, we briefly review the major biopolymers and their function, followed by some general mechanical properties of biopolymer gels. We then discuss various methods to analyze images of networks and construct computer models there of. Next, we discuss the current approaches to network modeling in the general case and different methods that have emerged. Finally, we return to the specific biopolymers and discuss what has been learned from the different models.

19.2. BIOPOLYMERS OF INTEREST

Cells interact with the physical world, and that interaction depends on networks inside and outside the cell. Inside the cell, a network of actin filaments, microtubules, intermediate filaments, and other proteins come together to form the cytoskeleton. This ensemble of intracellular proteins stabilizes the cell structure and plays a role in many cellular phenomena, including changes in cell shape and cell division. In addition, the cytoskeleton appears to play a prominent role in translating environmental cues, both mechanical and chemical, into a cellular response, which may take the form of biosynthetic activity [\[3–](#page-34-2)[6\]](#page-34-3) or even programmed cell death (apoptosis) [\[7,](#page-34-4) [8\]](#page-34-5).

Outside the cell, a network of proteins, most commonly with collagen as the backbone, forms the extracellular matrix. The ECM composition and organization confers functionality to a tissue and provides a conduit for mechanical signals to alter cellular response. In many tissues, the ECM is in a constant state of turnover. The cells in the host tissue respond to changes in the microenvironment by degrading and synthesizing ECM proteins. Such changes can lead to growth and adaptation, e.g. tissue growth with exercise [\[9\]](#page-34-6), or can lead to disease, for example glaucomatous damage to the optic nerve head [\[10\]](#page-35-0) or hypertensive arterial wall thickening [\[11\]](#page-35-1). Other-ECM related diseases are congenital and result in impaired tissue function with devastating consequences. In Alport's syndrome, for example, the genes encoding for a crucial component of the basement membrane malfunction [\[12\]](#page-35-2). The basement membrane structure is altered, which greatly impairs the molecular sieve structure of the kidney glomerulus, making it vulnerable to high pressures and more susceptible to proteolytic attack. Consequently, understanding the interplay between molecular interactions and macroscopic tissue mechanics is crucial to understanding many pathologies.

In this section, we introduce and briefly describe some of the monomers that form key intracellular and extracellular networks. The interested reader should consult the references listed in Table [19-1](#page-3-0) for a more comprehensive review on each protein.

19.2.1. Intracellular Networks

19.2.1.1. Actin

Actin filaments (F-actin) are composed of a linear chain of G-actin subunits that are constantly and dynamically added to or removed from the ends of F-actin in a manner dependent on the local G-actin concentration. This process enables the cell to reorganize the cytoskeleton, migrate, attach to a substrate, and respond to signaling [\[13](#page-35-3)[–17\]](#page-35-4). The G-actin subunits, which are approximately 2–3 nm in diameter [\[18\]](#page-35-5) form semiflexible F-actin filaments that are approximately 5–7 nm in diameter and can ultimately assemble into hierarchical bundles and networks that span the interior of the cell. For a single actin filament, the stretching stiffness is K_s = 4.4×10^{-8} N [\[19\]](#page-35-6), the bending stiffness is $K_b = 7.3 \times 10^{-26}$ Nm², and the persistence length (defined later) is $l_p = 17$ mm [\[20\]](#page-35-7). Actin molecules associate readily with divalent cations (Mg^{2+} and Ca^{2+} in particular) giving the molecule the capacity to

Type	Approximate dimensions	Macromolecular structure	Mechanical function	Reference
Intracellular				
Actin	5 nm dia, $10-20 \mu m$ length	Bundles and networks	Cytoskeletal tension component	[14]
Microtubules	25 nm dia, $10-20 \mu m$ length	Hollow tubes emanating from MTOC ^a	Cytoskeletal compression component	[231]
Intermediate filaments	Variable, between 5 and 25 nm dia	Filaments coupled to cytoskeletal junctions	Cytoskeletal junctional component	[28]
Spectrin	200 nm long head-to-tail tetramers	Intertriangulated network with Actin	Cytoskeletal compression component	[232]
Extracellular				
Collagen I	\sim 300 nm long, 1.5 nm dia ^b , assembles into higher order fiber structures	Fibers	Extracellular matrix component	$\left[33\right]$
Collagen IV	800 nm long hexameric units	Polygonal network	Extracellular matrix component	[12]
Laminin	Cruciform, 75 nm wide, 115 nm long	Ionically cross-linked network	Extracellular matrix component	[50]
Fibronectin	2-3 nm dia, 60-70 nm length	Fibrillar network	Extra-to intracellular mechano- transduction	$[52]$
Fibrin	Fibrinogen monomer 5-7 nm dia, 45 nm length, assembles into larger fibrin fibers upto hundreds of nm in dia	Branched network	Clot formation	[56, 233]

Table 19-1 Intracellular and extracellular biopolymers

aMTOC (microtubule organizing center).

bTropocollagen.

complex with ADP and ATP. The conversion of ATP to ADP via hydrolysis through the ATPase myosin results in a conformational change in the F-actin molecule. This mechanochemical phenomenon driven by myosin has led to the colloquial reference of myosin as a motor protein and gives F-actin the capability to induce mechanical forces within the interior of a cell [\[21–](#page-35-10)[23\]](#page-35-11). Furthermore, the protein ARP23 causes branching of actin filaments, contributing to the network structure [\[24\]](#page-35-12).

19.2.1.2. Microtubules

Microtubules are another major cytoskeletal component critical to cell function. They are created when tubulin, a heterodimer of α -tubulin and β-tubulin, polymerizes to form stiff hollow tubes ∼25 nm in diameter. Microtubules are also controlled by the polymerization/depolymerization of their subunits. Microtubules are involved in a number of cellular processes including vesicle transport and cell division [\[25\]](#page-35-13). Their rigidity helps support organelles and maintain cell shape. Microtubules may also oppose the tensile forces generated by F-actin [\[26,](#page-35-14) [27\]](#page-35-15).

19.2.1.3. Intermediate Filaments

Intermediate filaments (IFs) comprise a third classification of cytoskeletal components that are more stable structures than F-actin and microtubules [\[28\]](#page-35-9). IFs, which are ∼10 nm in diameter, are "intermediate" in size when compared to F-actin and microtubules. Intermediate filaments can be found at the transcellular junctions (e.g. gap junctions, tight junctions, desmosomes and adherens junctions) as well as at anchoring plaques to the extracellular matrix (e.g. focal adhesions and hemidesmosomes). IFs are also linked to F-actin on the interior of a cell creating a pathway for the mechanotransduction of extracellular mechanical phenomena.

19.2.1.4. Spectrin

Spectrin, a cytoskeletal component specific to the red blood cell, is composed of a dimer of either α-spectrin or β-spectrin, both of which are ∼250 kDa. The dimers arrange in an anti-parallel arrangement forming tetramers that associate with short actin filaments (∼15 subunits) creating an inter-triangulated actin-spectrin network conferring mechanical stability and enabling a blood cell to compress and subsequently expand [\[29,](#page-35-16) [30\]](#page-35-17). The spectrin-actin network is intrinsically important to the transport of erythrocytes, allowing the erythrocyte to modulate shape as it passes through narrow capillaries [\[31\]](#page-36-2).

19.2.2. Extracellular Networks

The ECM functions as a support and anchoring structure for cells and as a means of tissue compartmentalization. The following components represent the major network-forming ECM molecules, and include type I collagen, type IV collagen, laminin, fibrin and fibronectin.

19.2.2.1. Collagen I

Collagen – the most abundant protein in the body – refers to a family of structurally and functionally related proteins that consist of three helically wrapped polypeptide chains [\[32,](#page-36-3) [33\]](#page-36-0). Type I collagen is a fibrillar collagen and accounts for 90% of all collagen (other fibrillar collagens include types II, III, V, IX). The fundamental unit of collagen, tropocollagen, is 280 nm in length and 1.5 nm in diameter [\[34\]](#page-36-4). Tropocollagen is composed of three polypeptide chains, or α -chains, that wrap around each other to form a right-handed triple helix. Tropocollagen is secreted into the ECM where it is modified enzymatically, assembled into quarter-staggered subfibrils, and covalently cross-linked [\[35\]](#page-36-5). Subfibrils associate laterally into fibrils and fibers, a distinction based mainly on size. Fibril diameters range from 10 nm to several hundred nm. They can organize into higher-order fibril bundles or fibers that

can be hundreds of nanometers in diameter [\[36\]](#page-36-6) and hundreds of micrometers in length [\[37\]](#page-36-7). For collagen-I, the properties of the triple helical monomer have been measured to be $K_s = 5.08 \times 10^{-10}$ N, $K_b = 3.36 \times 10^{-37}$ N-m², and a persistence length $l_p = 14.5$ nm [\[38\]](#page-36-8). In aqueous conditions, collagen fibers have been reported to have Young's Moduli ranging from 32 to 900 MPa [\[39–](#page-36-9)[42\]](#page-36-10). The bending stiffness for native collagen fibers ranges from 3×10^{-15} N-m² to 6×10^{-15} N-m² [\[43\]](#page-36-11). Many collagen fibers are heterotypic, meaning they are composed of more than one type of collagen [\[44\]](#page-36-12). Due to the complexity of native tissues, reconstituted collagen gels have served as simple but important in vitro tissue models [\[45](#page-36-13)[–47\]](#page-36-14).

19.2.2.2. Collagen IV

Unlike the fibrillar collagens, type IV collagen assembles into a mesh-like network that serves as the scaffolding for basement membranes. Basement membranes anchor and support endothelial and epithelial cells to connective tissue and provide physical barriers that allow for tissue compartmentalization. Collagen IV is comprised of three polypeptide chains associated as a triple helix and measuring approximately 400 nm in length [\[12,](#page-35-2) [48\]](#page-36-15). Six genetically distinct type IV collagen chains exist and are denoted as $\alpha_1-\alpha_6$. The chains assemble specifically forming three heterotrimers $[\alpha_1(IV)]_2$, $\alpha_2(IV)$, $\alpha_3(IV)$, $\alpha_4(IV)$, $\alpha_5(IV)$, and $\alpha_5(IV)]_2$, $\alpha_6(IV)$]. The relative concentration of each heterotrimer is dependent upon the tissue and the functional requirements of the collagen IV network. Type IV collagen interacts cooperatively with a variety of proteins and glycoproteins in forming the membrane [\[49\]](#page-36-16). Additionally, collagen IV can be reconstituted in vitro [\[49\]](#page-36-16).

19.2.2.3. Laminin

Laminin has many functional roles in the ECM that relate primarily to cell attachment, including induction and maintenance of cell polarity, establishment of tissue barriers and compartments, organization of cells into tissues, and prohibition of attachment-induced cell death [\[50\]](#page-36-1). Laminin is a cross-shaped heterotrimer of glycoproteins comprised of several combinations of α , β , and γ subunits resulting in 15 distinct heterotrimers. In general, the molecule is comprised of three short arms of ∼37 nm and a long arm of ∼77 nm. All ends of the molecule have a globular domain providing functionality. In vitro, laminin can aggregate into networks in a concentration-dependent and thermally-reversible manner in the presence of divalent ions such as Ca^{2+} and Mg^{2+} [\[48\]](#page-36-15).

19.2.2.4. Fibronectin

Fibronectin (FN) is a cell-secreted, soluble dimer, which polymerizes into an insoluble fibrillar network that facilitates cell attachment to the ECM (collagen types I–III and V, in particular) [\[51\]](#page-36-17). The fibronectin subunit, a dimer of polypeptide subunits 60–70 nm in length and 2–3 nm in diameter, associate into dimers that interact directly with integrins on a cell surface [\[22,](#page-35-18) [52\]](#page-37-0). Cytoskeletal tension created across the integrin stretches the FN dimer and exposes FN-FN binding sites to other

interstitial FN dimers, resulting in FN fibril and network formation. Because FN directly attaches to the cytoskeleton, and the FN network is assembled by mechanical mediation, it is thought that FN plays an important role in influencing cell shape, organization, and locomotion. Additionally, FN deposition is observed in a wide variety of wound healing processes, usually preceding the deposition of a more permanent collagen matrix [\[53\]](#page-37-2).

19.2.2.5. Fibrin

Fibrin networks form during blood clotting as part of the wound healing process. Fibrin is formed from the assembly of fibrinogen, a trinodular ∼340 kDa protein present in plasma that is 45 nm in total length [\[54\]](#page-37-3). Polymerization is catalyzed by thrombin, which enzymatically cleaves the N-termini of the α and β chains creating the "A" and "B" polymerization sites, respectively. The fibrin monomers arrange in a half-staggered arrangement aligning complimentary bonding sites creating oligomers that arrange in pairs creating dual-stranded protofibrils. Protofibrils associate laterally-forming fibers which ultimately aggregate, constrained by the ionic conditions, into bundles with a paracrystalline structure and distinctive banded pattern [\[55\]](#page-37-4). The bundles undergo branching creating a three-dimensional network that is covalently cross-linked by factor VIIIa concomitantly with the release of fibrinopeptide B [\[56\]](#page-37-1). In addition to its in vivo function, fibrin has also emerged as an attractive scaffold for tissue engineering [\[57,](#page-37-5) [58\]](#page-37-6).

19.2.3. The Mechanical Behavior of Biopolymers

The biopolymers above can be examined in their native state, but frequently are purified and reconstituted in gel form. The in vitro gel is a much simpler system than cells and tissues, while still providing many of the rich mechanical properties observed in the in vivo systems. The bulk properties of gels are frequently measured with a rheometer. A common test performed involves casting a biopolymer gel between two surfaces, often parallel plates, and oscillating one plate back and forth at frequency ω while the other is held fixed. In the small strain limit of a linear viscoelastic material, the stress-strain response is given by

$$
\sigma(\omega,t) = G'(\omega)\gamma(\omega t) + G''(\omega)\frac{\dot{\gamma}(\omega t)}{\omega},\tag{19-1}
$$

where σ denotes the stress, γ denotes the strain, *G'* denotes the elastic modulus and G'' denotes the loss modulus. For a perfectly elastic material $G'' = 0$, and for a perfectly viscous material $G' = 0$. For typical biopolymers such as actin and collagen, the elastic character of the gel dominates at low frequencies (less than 100 Hz) – *G'* is an order of magnitude greater than G'' [\[59,](#page-37-7) [60\]](#page-37-8) – thus making it possible to measure the elastic properties of the network with these tests. The viscoelastic character of the gels stems from molecular-level rearrangements and fluid-solid interactions (poroelasticity). The viscoelastic behavior is important but will not be discussed here. For more information see [\[47,](#page-36-14) [61–](#page-37-9)[65\]](#page-37-10).

The gel's elastic character depends on the biopolymer concentration *c* and the cross-links formed. One typically observes power-law scaling of the form $G' \sim c^x$, where for actin $x = 1.4$ when no cross-linker is present [\[66\]](#page-37-11), and $x = 2.5$ in the presence of very strong and stiff cross-linkers [\[60\]](#page-37-8). Another parameter of significance is the ratio of cross-linker to polymer concentration, *R*. Again, there is typically power-law scaling of the form *G* ∼*Ry*, but a transition point exists, where at small R , $y = 0.1$, whereas at larger R , y may range from 0.4 [\[67\]](#page-37-12) to 2.0 [\[68\]](#page-37-13), depending on the stiffness of the cross-linker. Recently, it has also been observed that when sheared, these materials tend to compress and pull the shear plates together [\[69\]](#page-37-14).

At small strains, typically less than 10%, it is reasonable to treat biopolymer gels as linear viscoelastic materials. At larger strains, however, they typically stiffen, with a modulus that can increase by 2–3 orders of magnitude [\[70\]](#page-37-15). A number of models give alternative explanation for this stiffening. At very large strains, the material breaks, undergoing irreversible deformation. Some materials, including actin, fail earlier at increasing densities [\[60\]](#page-37-8) while other materials, like collagen, break at the same strain regardless of the density [\[71\]](#page-38-0). These mechanical properties are summarized in Figures [19-1,](#page-7-0) [19-2](#page-8-0) and [19-3.](#page-8-1)

In addition to shear, extension and compression tests have also been conducted on biopolymer networks (mostly collagen) – for a review see [\[47\]](#page-36-14). In uniaxial extension, unconstrained network fibers rotate and align with the displacement axis before the network stiffens due to fiber resistance to axial

Figure 19-1. G^{\prime} Properties of actin from. The elastic modulus (*G*^{\prime}) and maximum strain (γ _{max}) for actin networks cross-linked with scurin, as a function of actin concentration (c_A) and cross-linker/actin ratio (*R*). From [\[204\]](#page-44-0) with permission

Figure 19-2. Strain stiffening properties of biopolymers. From [\[70\]](#page-37-15) with permission

stretch [\[72–](#page-38-1)[75\]](#page-38-2) thereby producing the characteristic J-shaped stress-strain curve observed in soft tissues [\[71,](#page-38-0) [76,](#page-38-3) [77\]](#page-38-4). The rapidity of stiffening is dependent on network properties and constraints. For example, a more cross-linked network stiffens faster at a lower extension, as does a network that is constrained

Figure 19-3. Nonaffine-affine transition in mechanical beam networks. G' scaling with L/λ , where $\lambda = \frac{1}{c} (\frac{l_c}{l_b})^{1/3}$. Note that when the spacing between cross-links is large, the network is much less stiff than the nonaffine network. (Reprinted with permission from Head et al. [\[143\]](#page-41-0). Copyright (2003) by the American Physical Society. http://prola.aps.org/abstract/PRE/v68/i6/e061907)

transversely from contracting inward when stretched. Soft tissues and collagen gels exhibit a reduction in the peak stress and the amount of hysteresis between the loading/unloading curves that converges to a stable value when the stretch protocol is repeated at the same rate and to the same extent (preconditioning). It has been suggested that this behavior is due to microstructural rearrangements, although the specific cause remains unknown. One possibility is that non-covalent interactions between fibers continue to break as a result of the cyclic stretch until a stable configuration is reached.

The gel response to compression testing is more complicated, and the dissipation mechanisms involve molecular interactions and interstitial flow. Gels are often confined laterally in a chamber and compressed with a porous piston to allow fluid flow out of the gel [\[65,](#page-37-10) [78\]](#page-38-5), an experiment inspired by the articular cartilage community [\[79,](#page-38-6) [80\]](#page-38-7). In collagen gels, the network response was found dependent on the time scale of the deformation, with step and ramp tests resulting in fiber collapse near the piston or fiber bending that induced network restructuring throughout the gel [\[62\]](#page-37-16).

Higher collagen concentration generally translates to better mechanical properties, but again it is unclear whether the underlying cause is more cross-links, larger fibers, or other changes to the network architecture. It is well known that collagen fiber and network architecture is highly dependent on the gelation conditions, including pH, temperature, and ionic concentration [\[71,](#page-38-0) [81,](#page-38-8) [82\]](#page-38-9). In the absence of cross-linker, it has been found that the storage modulus scales with collagen density c_c by $G' \sim c_c^{(2.45 \pm 0.25)}$ [\[83,](#page-38-10) [84\]](#page-38-11). This is markedly different from the $G' \sim c_a^{1.4}$ for uncrosslinked actin, which suggests that even in the absence of chemical crosslinkers, the fibers naturally cross-link, a conclusion in agreement with macroscale observations as well [\[62\]](#page-37-16).

As already noted, tissues are compositionally and architecturally more complex than single-phase biopolymer networks. As a result, other ECM components, including proteoglycans, elastin, laminin, and fibronectin, have been added to collagen gels in order to assess their impact on tissue mechanics [\[85,](#page-38-12) [86\]](#page-38-13). In general, the changes in G' and G'' were concentration dependent with the additives either aggregating collagen fibers together, as was the case with the proteoglycans studied, or thickening the fibers by coating them. Regardless of the macromolecule added, interpreting the results of such experiments is difficult because it is not known how the proteins affect network assembly or how the resulting structure compares to native tissues.

Nevertheless, these studies are relevant to understanding how tissues are built, particularly skin and cartilage, which share similar structural arrangements. Tissues like tendons, on the other hand, are highly organized and cross-linked into a hierarchical structure designed to resist high tensile load and store energy and do not behave like collagen gels. A discussion on the mechanical properties of soft tissues is quite involved and beyond the scope of this review. The interested reader is referred to the works of Fung [\[76\]](#page-38-3) and Humphrey [\[87\]](#page-38-14) for more information.

19.3. NETWORK IMAGING, EXTRACTION, AND GENERATION

19.3.1. Imaging

19.3.1.1. Fiber-Level Imaging

To produce an accurate representation of a biopolymer network, one must first obtain images of the microstructure. The difficulties involved are many, and each imaging technique has its advantages and disadvantages. The most common means for obtaining microstructural information relies on light level histology techniques [\[34\]](#page-36-4). Different colored dyes or stains are applied to thin, fixed sections of tissue to visualize the different matrix components. Histology is relatively inexpensive and easy to do, and it can provide spatial information for multiple species. Histology's main detractions are that it is labor intensive and only moderate in resolution (submicron). In addition, the information obtained is two-dimensional and prone to artifact, which can arise during fixation, dehydration, sectioning, or staining. More specific staining can be achieved, often through the use of fluorescent antibodies that bind specifically to the target molecule. When the sample is illuminated with a specific bandwidth of light, only the tagged molecules are imaged. Serial sections through a sample can be reconstructed into 3d datasets of the tissue's microstructure [\[88,](#page-38-15) [89\]](#page-38-16), or to obtain fiber orientation [\[90\]](#page-38-17). These methods are again labor intensive and often produce artifacts, and the 3D reconstructions are computationally demanding. More importantly, the real-time microstructural response to macroscopic loads is not accessible.

More advanced imaging technologies have emerged, which are also capable of providing 3D data sets. Magnetic resonance imaging (MRI) [\[91\]](#page-39-0), computed tomography (CT) and micro CT (μ CT) [\[92–](#page-39-1)[94\]](#page-39-2), and optical coherence tomography (OCT) [\[95](#page-39-3)[–98\]](#page-39-4) have all been applied to tissues, most notably bone. These techniques allow 3-D imaging of living tissues, but are limited in their ability to identify differences in soft tissues and do not provide sufficient resolution to image at the scale of the microstructure [\[99\]](#page-39-5).

In the case of purified gels, confocal microscopy [\[75,](#page-38-2) [100](#page-39-6)[–102\]](#page-39-7), and multiphoton microscopy [\[82\]](#page-38-9) can be used obtain 3-D images of the networks without destroying their network architecture. Typically, the point spread function of the system is on the order of 500 nm, whereas for collagen, the fiber radius is often less than 100 nm [\[83\]](#page-38-10). Thus while fibers of small diameters are visible, the precise radii of the fibers and details of the fibril architecture cannot be resolved.

Electron microscopy (EM) provides a range of techniques useful for visualizing the microstructure in detail because resolution is on the nm scale. EM has been used to directly observe a variety of biomolecules, including type IV collagen [\[103\]](#page-39-8), laminin [\[104\]](#page-39-9), and spectrin [\[105\]](#page-39-10). Scanning electron microscopy (SEM) is often used because of its superior depth of field, which also has the disadvantage that quantification of fiber dimensions is difficult without resorting to stereoscopic techniques. Transmission electron microscopy (TEM) is much more suited to quantitative measurements because the sample is sectioned into thin slices. TEM can also be combined with other preparatory techniques, such as quick-freeze/deep etch, where a replica coating of the sample is imaged instead of the sample itself [\[106,](#page-39-11) [107\]](#page-39-12). Sample preparation in EM is also difficult and sample artifacts similar to those that occur in light level techniques are also present. Because of the higher resolution, however, artifacts are magnified and present greater difficulties in extracting the true microstructure. Cryo-(SEM) presents a more pristine picture than conventional SEM because water-associated structures are not dehydrated. In this technique, the sample is rapidly frozen so that the water vitrifies [\[108,](#page-39-13) [109\]](#page-40-0). 3-D reconstructions are also possible using electron tomography, which has been used to reconstruct cell structures [\[110\]](#page-40-1) and single molecules, including collagen and fibrillin [\[111\]](#page-40-2).

19.3.1.2. Indirect (Population-Level) Imaging

Non-invasive, indirect measurements of the fiber microstructure are possible by probing the sample's optical properties. Techniques, such as small-angle light scattering (SALS) [\[112\]](#page-40-3) and polarimetric fiber alignment imaging (PFAI) [\[72,](#page-38-1) [113\]](#page-40-4) do not image the fibers directly, but instead make quantitative measurements of the fiber population based on the optical properties of submicroscopic fiber networks. In SALS, the pattern of scattered laser light transmitted through a sample provides a local fiber orientation distribution, which can be used to generate dynamic alignment maps during mechanical testing of tissues [\[114\]](#page-40-5). PFAI exploits the birefringent properties of the fiber and the difference in refractive index between fiber and solution to assess principal fiber direction and degree of alignment by measuring the change in amplitude and phase of the elliptically polarized light transmitted through the sample. Consequently, it can only be employed if the biopolymer network is birefringent, as is the case with collagen and fibrin. PFAI has been used extensively to generate 2-D network alignment maps in a variety of static [\[72,](#page-38-1) [115,](#page-40-6) [116\]](#page-40-7) and dynamic [\[62,](#page-37-16) [117,](#page-40-8) [118\]](#page-40-9) bioartificial tissue systems. Indirect techniques do not have the resolution that confocal methods have but they are easier to implement and can survey whole tissue samples under a variety of loading schemes. One limitation, however, is that the samples must be sufficiently transparent (i.e. thin enough). Otherwise sample sectioning or optically clearing the tissue with a hyperosmotic solution may be required [\[114\]](#page-40-5). Another issue is that neither method can discriminate between different fiber populations. For example, a fiber orientation distribution obtained from a remodeled fibrin gel cannot distinguish fibrin fibers from newly formed collagen fibers. Regardless of the real-time imaging method used, gaps between scales still exist which can only be addressed with multi-scale computational models and a cohort of imaging techniques.

19.3.2. Network Extraction

Another issue is how to describe the microstructure once an image or representation of the microstructure is obtained. Morphometric and stereologic methods have often been employed to describe tissue microstructure [\[119,](#page-40-10) [120\]](#page-40-11). These descriptors can provide exact quantities, such as volume fraction and number of objects, or

distributions, such as fiber length, width, and orientation angle. Several tensor representations have been employed to describe material anisotropy and micro-structural alignment [\[121,](#page-40-12) [123\]](#page-40-13). They can be constructed from image-based measurements, such as mean intercept length [\[119,](#page-40-10) [124\]](#page-40-14) or from Fourier transform methods (FTM) [\[125\]](#page-40-15), and are convenient for capturing the principal direction and strength of fiber alignment.

Other image processing techniques have also been used to extract fiber and network features, as well as to map myocardial fiber orientation [\[126\]](#page-40-16) and to quantify cytoskeletal reorganization in response to shear [\[127\]](#page-40-17), stretch [\[128\]](#page-40-18), and wound healing [\[129\]](#page-40-19). Some of these methods involve first thresholding the intensity image into a binary image. Additional processing might include the use of filters for edge detection and gradient calculation [\[126\]](#page-40-16), or skeletonization and tracking [\[130\]](#page-41-1) to determine fiber orientation and magnitude, or to reconstruct the network [\[83,](#page-38-10) [131,](#page-41-2) [132\]](#page-41-3). In addition, Fourier methods [\[125,](#page-40-15) [129,](#page-40-19) [133,](#page-41-4) [134\]](#page-41-5) and the Hough transform [\[135,](#page-41-6) [136\]](#page-41-7) have proven useful for obtaining fiber distributions. The majority of these methods have been developed for 2-D images, and some have been extended to 3-D [\[83,](#page-38-10) [131,](#page-41-2) [132,](#page-41-3) [137\]](#page-41-8) For more information on image processing techniques see Gonzalez et al. [\[138\]](#page-41-9).

19.3.3. Model Network Generation

A variety of methods have been implemented to create networks, not all based on measurements of the microstructure. The simplest network model assumes an idealized geometry representative of the material, such as a hexagonal cellular solid unit cell [\[139\]](#page-41-10). Another possibility is to use an established algorithm, such as Voronoi tessellation or Delauney triangulation, to subdivide a region into a mesh. Methods of this type are useful but generate more ordered, cellular-solid-like networks, which only share some features with fibrous networks [\[140,](#page-41-11) [141\]](#page-41-12). Consequently, one should consider whether the material to be modeled is more appropriately described as a cellular solid or fiber network when creating the network geometry (Figure [19-4\)](#page-13-0).

The generation of random 2-D straight-fiber networks, known as a Mikado model, involves randomly selecting network properties from a distribution function (e.g. uniform, von Mises, etc.). Typically, fiber position and angle are selected randomly, and locations where fibers intersect are made into cross-links [\[141–](#page-41-12)[144\]](#page-41-13). Other distributed networks properties can be used to shape the network including fiber length and aspect ratio [\[145,](#page-41-14) [146\]](#page-41-15). In some cases the networks created are periodic, meaning that fibers that overlap the box boundaries are made to wrap back around to the other side [\[145,](#page-41-14) [147\]](#page-41-16). Periodic boundaries are generally used to remove end effects and to more easily impose network properties, such as total fiber length and network volume fraction [\[145\]](#page-41-14).

These techniques can be extended to generate 3-D networks but an additional angle (ranging from 0 to π) must be included. Automatic 3-D skeletonization algorithms have been developed for extracting the network structure [\[83,](#page-38-10) [131,](#page-41-2) [132\]](#page-41-3) from

Figure 19-4. Cellular vs. Fibrous Networks. (**a**) A random cellular network produced via Voronoi tessellation using random points. (**b**) A random fiber network created from a random growth algorithm. See Huessinger [\[139\]](#page-41-10) for details on the differences

images and recently, Stein et al. [\[83\]](#page-38-10) have validated that the architectures extracted by these algorithms have realistic geometric and mechanical properties.

Most of our work has focused on the mechanics of biopolymer gels and tissue equivalents [\[74,](#page-38-18) [117,](#page-40-8) [148](#page-41-17)[–150\]](#page-41-18). In these studies, 3-D fiber networks were created in a stochastic process that resembles the process of collagen fiber formation in gels. First, a number of seed points are generated inside of a box. A fiber grows bidirectionally from each seed point until intersecting the boundary or another fiber. We have recently set up the method to generate statistically equivalent networks to those obtained from polarized light imaging by adjusting the random direction distribution and checking to match the observed structure [\[117\]](#page-40-8).

19.3.4. Network Generation via Energy Minimization

Networks can also be generated through energy minimization techniques such as the Metropolis-Hastings (MH) importance sampling algorithm [\[151,](#page-42-0) [152\]](#page-42-1) (a Monte Carlo technique). MH is used to generate the structure and interactions of dynamic chemical systems from time-independent and stochastic rules [\[153–](#page-42-2)[155\]](#page-42-3). If the rules of the simulation are posed adequately, two differing and commensurate sequences of random numbers should generate statistically equivalent results (i.e. the results will agree to within a small "statistical error"). Consequently, the MH algorithm is a powerful tool to bridge how nanoscale chemical energetics yield macroscopic networks with determinable mechanical properties.

The underlying principle of the MH algorithm is to calculate a thermodynamic minimal average energy $\langle U \rangle$, of an ensemble of *m* molecules, $\{n_1,...,n_m\}$, at a given temperature, *T*, using the following equations:

$$
\langle U \rangle = \frac{1}{Q} \int U(n_1, ..., n_m) \exp \left[-U(n_1, ..., n_m) / kT \right] dn_1 ... dn_m, \tag{19-2}
$$

$$
Q = \int \exp\left[-U(n_1,...,n_m)/kT\right]dn_1...dn_m,
$$
 (19-3)

where k is the Boltzmann constant. The difficulty in performing such a calculation is that the normalizing quotient, *Q*, is generally not known for complex systems such as molecular biofibril networks. To circumvent the lack of knowledge of the normalizing quotient, instead an estimate of $\langle U \rangle$ can be made based upon a series of *K* unique configurations of molecules, Γ_i { $n_1,...,n_m$ } for $j=1,...,J$, such that

$$
\langle U \rangle = \frac{1}{J} \sum_{j=1}^{J} U\left(\Gamma_j\right). \tag{19-4}
$$

As K becomes large, the estimate of $\langle U \rangle$ approaches the expected minimum value of the internal energy of an ensemble of molecules. The simulation space must be initially seeded with molecules in a way that precludes infinite energy interactions (e.g. interactions that violate volume exclusion). After initially seeding of the simulation space, an initial energy is calculated based on the thermal properties of the system, the interaction potentials, and distances of the interaction sites. Next a molecule is chosen randomly and displaced a random distance generating a new configuration. The energy of the new configuration is calculated. As long as the quotient of thermodynamic probability of the new configuration is less than a random number ζ , generated on the interval of (0,1), the new configuration and associated energy are accepted. Otherwise, the molecule is returned to the starting position. The acceptance criteria is explicitly demonstrated by

$$
\zeta \le \exp\left[-\left(U'_j - U(j)\right)/kT\right],\tag{19-5}
$$

where $U(j)$ denotes the baseline energy prior to reconfiguration and U'_{j} is the energy of the new system following the displacement of the randomly chosen molecule.

Figure 19-5. Collagen IV Network Generated with MH algorithm. The network is initialized as a collection of α₁α₁α₂ (∼80%) and α₃α₄α₅ (∼20%) monomers randomly selected in the simulation space. System energy is decreased as 7S domains are brought within bonding proximity of other 7S domains (\sim 3 nm). Over the course of 5×10^6 Metropolis steps, the system begins to converge upon the global energy minimum of the system. (**a**) Initial network before energy minimization and (**b**) network following energy minimization via the Metropolis-Hastings algorithm. Notice the increase in heterogeneity

As the algorithm proceeds, the result is convergence to the minimal energy configuration of a network comprised of the initial fiber set. The algorithm is designed to prohibit convergence upon local energy minima and is sensitive to the level of correlation between random numbers. Consequently, a high-quality pseudo-random-number-generating algorithm is critical to ensure that results are statistically valid (see [\[153,](#page-42-2) [154\]](#page-42-4) for a more thorough discussion on this topic). This application of the MH algorithm is thus a means to generate a network from the associated fundamental subunits using an energy minimization approach. An example of a collagen IV network generated using the MH algorithm is demonstrated in Figure [19-5.](#page-14-0)

19.4. GENERAL MODELING APPROACHES FOR BIOPOLYMER NETWORKS

19.4.1. Definitions

In the following, we define a biopolymer network to be a collection of interconnected fibers. Depending on the biopolymer of interest, a fiber may consist of a true fiber, a fibril, a filament, or a bundle of filaments, which themselves are composed of monomers, depending on the network of interest. Where two fibers interact, we define there to be a node. There are two major types of nodes: entanglements and cross-links. An entanglement is a point at which two or more fibers are in close proximity, such that the possibility of contact alters the deformation properties of the network. A cross-link is defined to be a point where two fibers are chemically linked together. A segment of length *ls* is defined to be a piece of the fiber between two neighboring nodes.

We also define various types of polymer networks based on the flexibility of the fibers that make up the network. Flexibility is determined by the persistence length *lp* of a fiber, which gives the typical length over which a fiber remains straight. For a fiber of length *L* parameterized by *s*, *lp* is given by

$$
\langle \cos \left[\theta(s) - \theta(0) \right] \rangle = \exp \left[-s/l_p \right],\tag{19-6}
$$

where $\theta(s)$ is the tangent angle of the fiber with respect to its main axis [\[156\]](#page-42-5) and $\langle x \rangle$ is the expected value of *x*. It can also be shown that $l_p = K_b / kT$, where K_b is the bending stiffness, *k* is the Boltzmann constant, and *T* is the temperature [\[156\]](#page-42-5). The bending stiffness is a function of the fiber's Young's modulus and the moment of inertia of the cross-sectional area. A flexible network, like rubber, is one where $l_p \ll l_s$. Such networks are dominated by the entropic stiffness of the segments [\[157\]](#page-42-6). For a semi-flexible polymer network, such as actin, $l_p \approx l_s$ [\[63,](#page-37-17) [64,](#page-37-18) [158\]](#page-42-7). These networks are considerably more complex because both mechanical and entropic properties of the fibers play a role in the network dynamics. On the other extreme are mechanical networks, such as collagen-I gels where $l_p \gg l_s$, and the fibers have very long thermal persistence lengths and the entropic effects are negligible [\[84\]](#page-38-11).

19.4.2. Affine Theory

A variety of approaches exist for modeling biopolymer networks. One common assumption employed is that the network deformation can be described as an affine transformation. An affine transformation preserves the collinearity of points and the ratio between distances. A typical example is that of simple shear, which maps the point (x,y) to $(x+y \, y, y)$.

Affine theories have been used to describe the properties of flexible gels, such as rubber [\[157\]](#page-42-6), where the persistence length is much shorter than the distance between nodes. Here, it has been found that the elastic modulus, *G* , scales with the cube of the mesh size, ξ . Mesh size is defined as the average of sphere diameter that fits inside the network without touching the fibers. For semiflexible biopolymer networks, the persistence length is on the same order of the mesh size, and the entanglement length l_e is used to describe the network. MacKintosh et al. [\[158\]](#page-42-7) and Morse [\[63,](#page-37-17) [64\]](#page-37-18) have developed an affine deformation theory for semiflexible biopolymer networks. By treating the polymer as an entropic worm-like-chain, they derive a force-displacement curve for an individual polymer chain to be:

$$
F \sim \frac{K_b^2}{kT} \frac{dl}{l_e^4},\tag{19-7}
$$

where *dl* is the length change of a segment. The force-displacement curve is related to the modulus of the material by assuming there are ξ^2 fibers per area, and that $dl = \gamma l_e$, where γ is the shear strain. This gives

$$
G' \sim \frac{K_b^2}{kT} \frac{dl}{\xi^2 l_e^3}.\tag{19-8}
$$

To relate G' to the polymer concentration, one must first determine the dependency of K_b , ξ , and l_e on concentration. MacKintosh et al. [\[158\]](#page-42-7), assume the fibers do not bundle and thus K_b is independent of *c*. Previous experiments [\[66\]](#page-37-11) indicate that for non-cross-linked actin, $\xi \sim c^{-1/2}$. For l_e , various relationships have been used. For a densely cross-linked gel, $l_e \sim \xi$, and $G' \sim c^{2.5}$. However, the precise relationship between *le* and ξ may be more complex. On the other hand, modeling the chain as a fluctuating rod gives $l_e \sim \xi^{4/5}$ [\[158\]](#page-42-7), whereas if one also assumes that the bending stiffness of the polymer depends on the polymer length, as is the case when polymer bending is dominated by shear (discussed below), then $l_e \sim \xi^{4/3}$. The affine theory has also been used to explain strain stiffening of biopolymer gels [\[70\]](#page-37-15) as well as the negative normal stresses observed during shear [\[69\]](#page-37-14). Affine-deformation models have also been used to simulate the mechanical response of fibrillar tissues [\[159\]](#page-42-8), including heart valve [\[160\]](#page-42-9), cornea [\[161\]](#page-42-10), skin [\[162\]](#page-42-11), and articular cartilage [\[163\]](#page-42-12), accounting for multiple co-existing networks or non-fibrillar tissue components as needed.

While the affine model predicts behavior in line with what has been observed experimentally, it is not clear that the assumption of affine deformation is valid at

the length scale of the fibers. The nonaffinity of a deformation can be measured in a number of ways [\[164\]](#page-42-13) and is typically done by looking at the difference in length, angle, or vector difference between the observed deformation and that predicted for a purely affine deformation. Nonaffine deformations have been observed in practice [\[72,](#page-38-1) [102,](#page-39-7) [114,](#page-40-5) [117,](#page-40-8) [165,](#page-42-14) [166\]](#page-42-15) but disagreement still exists on the applicability of the affine assumption for biopolymer networks [\[167,](#page-42-16) [168\]](#page-42-17).

One difficulty with the affine assumption is that the network segments deform independently, and thus the details of network interactions are lost. Such an assumption allows a simpler material description that in some applications may be sufficient for the problem. Within this framework, however, there is no obvious way to account for fiber synthesis or degradation, nor does it allow one to model failure at the crosslinks or in individual network fibers. The need for more detailed understanding of networks has led to the development of various non-afifne models, described in the next section.

19.4.3. Nonaffine Models

In modeling non-affine networks, there are three main choices the modeler must make: (1) the constitutive model for the individual fiber segments, (2) the properties of the nodal interactions, and (3) the network organization of the segments. The choice, in part, depends on what type of questions the modeler intends to answer. The individual segments may be treated as linear or nonlinear springs, which only stretch, or as beams or worm-like-chains, which also resist bending and torsion. Additional relationships may be needed to account properly for the bending stiffness if the segment is composed of a bundle of interacting filaments.

Nodes can be treated either as cross-links or entanglements. While macroscopic scaling theories account for both (discussed later), with the exception of Rodney et al. [\[169\]](#page-42-18), all microstructural models presented here assume that fibers are chemically cross-linked, or sufficiently entangled that on the time scale of interest they are and unable to slip at the nodes. In addition, the analysis is greatly simplified by neglecting steric interactions between fibers, which may contribute to the mechanical response. Nodes may be treated as freely rotating pin joints, welded joints of fixed angle, or linear or torsional springs.

19.4.3.1. Spring Model

We begin by exploring networks of randomly oriented springs, studied by Kellomaki et al. [\[144\]](#page-41-13). In this model, each segment acts as a linear spring, and the springs are connected at freely rotating pin joints. Kellomaki et al. [\[144\]](#page-41-13) showed that under small deformations, such a network is floppy and has zero shear modulus. That is, under small deformations, the network is able to rearrange itself without changing the length of any of the springs. The floppiness of the network can be explained in two ways. One is that for a network cluster to be rigid, it must be composed of triangles that share a common side. Such a structure requires the existence of points where three fibers overlap. In a randomly generated Mikado network, the probability of three fibers intersecting at a single point is almost surely zero, so it is impossible for a stiff cluster of fibers to percolate the network. An alternative framework for analyzing network properties is based on Maxwell counting [\[170\]](#page-42-19). Consider a *d* dimensional space composed of N_v vertices connected by N_c segments. The condition number is defined to be the average number of segments that connect to a single node and is given by $z = 2N_c/N_v$. The total number of degrees of freedom in the network (ignoring rigid motions) is given by $N_f = N_{vd} - N_c$, where *d* is the spatial dimensionality. For a rigid network $N_f = 0$, giving $N_c = N_{vd}$, and requiring $z = 2d$, where d is the spatial dimensionalty. For a network of Mikado model structure, even if the free ends are removed (of condition number 1), we are left with vertices that are connected by 2–4 springs. Because the condition number is less than four the network is floppy. An important implication of this model is that the assumptions associated with the affine model discussed above are inconsistent. If a biopolymer gel is modeled as a network of randomly oriented springs, even if the springs are nonlinear, the network cannot resist shear at infinitesimal deformation. In contrast, springs in the affine model stretch immediately. Furthermore, the spring network does not deform affinely because it is able to rearrange itself under small deformations without changing the length of its springs.

Chandran and Barocas [\[73\]](#page-38-19) have also studied random spring networks with the goal of modeling collagen gels. They studied networks generated by an artificial polymerization algorithm, described above, and these networks also have a condition number that is less than 4. Similar to Kellomaki et al. [\[144\]](#page-41-13), they find that the network deformations are significantly different from affine and in particular, fibers are likely to reorient rather than stretch, thus leading to smaller stretch ratios than would be seen in the affine case even though the fiber orientation averaged over the entire population remained close to the affine value.

The Mikado and polymerization models are attractive in that the network architecture is reminiscent of biopolymer networks, but their main problem is that networks of zero modulus at small strains are unrealistic. To study rigid spring networks, Wyart et al. [\[171\]](#page-42-20) explore the strain stiffening properties of networks formed by an alternative algorithm, in which the space is seeded with a number of nodes and then a condition number is imposed by connecting vertices that are close. Buxton and Clarke [\[172\]](#page-43-0) have also studied beam networks formed in this way. This method allows one to explore the transition from floppy to rigid networks as the condition number increases. However, because this network architecture is not representative of most biopolymer networks, we do not discuss its properties further.

A fourth architecture for modeling biopolymers is the Arruda-Boyce eight-chain network model, used by Palmer and Boyce [\[173\]](#page-43-1) for modeling actin networks. The model represents the network as a unit cell containing eight segments, each connecting a corner of the box to the center. Incompressibility is imposed on the cell such that even though the network alone is floppy, the network in combination with the incompressibility constraint is stiff. These models have the advantage of being easy to solve, but like the random networks of Wyart et al. above, they are not representative of true biopolymer networks. Nevertheless, by tuning the segment parameters, one can match experimental data for skin [\[174\]](#page-43-2) and actin networks [\[173\]](#page-43-1). In modeling actin, Palmer and Boyce [173] based their force-displacement curves on the theory of MacKintosh [\[158\]](#page-42-7), described above. This modeling framework allows consideration of prestress, but unfortunately, gives no way to predict it in the network, so the prestress must be fit to each data set individually.

19.4.3.2. Beam Models

In light of the above the result that realistic, spring networks have $G' = 0$, it is necessary to account for the bending energy of the segments as well, or, at a minimum, to introduce torsional springs at the nodes [\[74\]](#page-38-18). Explicitly accounting for fiber bending is typically accomplished by treating each segment as a worm-like-chain (WLC) that contains both stretching and bending energy. Numerically, segment bending can be implemented either by using a discrete WLC model [\[175\]](#page-43-3) or a finite element algorithm [\[145,](#page-41-14) 176], where the segments are represented as beams having both a stretching stiffness K_s , and a bending stiffness K_b . Often, the segments are treated as elastic rods using Euler-Bernoulli beam theory, and thus the mechanical stretching stiffness is given by $K_s = EA$ and $K_b = EI$, where *E* is the Young's modulus of an individual fiber, $A = \pi R^2$ is the cross-sectional area, R is the rod radius, and I is the area moment of inertia of the rod. The total energy in a filament is given by,

$$
H = \frac{1}{2} K_b \int_0^L (\nabla^2 u)^2 dl + \frac{1}{2} K_s \int_0^L \varepsilon^2 dl,
$$
 (19-9)

where the segment is of length L , the transverse displacement is given by u , the curvature is given by $\nabla^2 u$, and the axial strain given by ε . From the above expressions, one can also define a spring stiffness for a segment. The mechanical stretching stiffness for a cylindrical fiber segment is given by $k_s = K_s / l_c$, while the bending stiffness is $k_b = K_b / l_c^3$, where l_c is the mean spacing between nodes.

If the segment consists only of a single isotropic, linear elastic filament of radius *r*, then $I = I_{\text{fil}} = \pi r^4 / 4$. However, in many biopolymer networks, including actin and collagen, the segment is in fact a bundle of fibers. If the bundles are tightly coupled together by a stiff and rigid cross-linker, as is the case for actin cross-linked by scurin [\[177\]](#page-43-4), then a similar formula applies, $I = \pi R^4/4$, with *R* the radius of the bundle. In the case of loose intrasegment coupling, we instead have $I = N_{\text{fil}}I_{\text{fil}} = R^2/r^2I_{\text{fil}} = \pi (Rr)^2/4$. In this case, the bundle is much more flexible as $I \sim R^2 r^2$ instead of R^4 . There also exists a third, intermediate regime, determined by the nondimensional parameter $\alpha = k_x L^2 / (E A \delta)$ [\[178,](#page-43-5) [179\]](#page-43-6), in which k_x is the cross-link stiffness at a node, L is the segment length, and δ is the mean spacing between nodes. For small α , the coupling is weak and $K_b \sim E (Rr)^2$. For very large α, the coupling is strong and $K_b \sim ER^4$. For intermediate values of α, the formula for K_b is more complicated, depending upon *L*, δ , and k_x [\[178\]](#page-43-5). In the case of actin bundles, three regimes have been observed, depending upon the cross-linker used [\[179\]](#page-43-6).

The first step in understanding the mechanical properties of these networks is to explore the G' behavior as a function of the network density. For the Mikado model,

we define two densities: a nondimensional density $q = NL^2/A$, and a dimensional density $\rho = NL/A$, where *N* is the number of fibers of length *L* (possibly containing multiple segments) in a box of area *A*, and ρ has units of [1/length]. In two dimensions, it is possible to link l_c directly to *N*, *L*, and *A* and at large *q*, it is given by $l_c = 2/q\pi$ [\[180\]](#page-43-7). The mechanical properties of these networks have been shown to depend critically on *q* [\[181\]](#page-43-8), and also on the average number of nodes per segment L/l_c [\[143\]](#page-41-0). Here, we choose to describe the network mechanics in terms of L/l_c , though the two choices are equivalent [\[180\]](#page-43-7). For low L/l_c , the system is made up of isolated rods and small, unconnected clusters. In such a system, there is no connected path from one side to the other and $G' = 0$. At $L/l_c = 5.42$ [\[143\]](#page-41-0), conductivity percolation occurs, meaning that a path exists connecting two opposite sides of the network. In the case that the nodes can resist rotation (e.g. welded joints), the system has also achieved rigidity percolation, and the connected component can resist deformation. In the case that the nodes are treated as freely rotating pin joints, rigidity percolation does not occur until $L/l_c = 5.93$ [\[143\]](#page-41-0).

Above rigidity percolation, there are two mechanical regimes, based on whether the deformations are affine or nonaffine. In the case of $k_b \ll k_s$, the fibers are long and thin, and the spacing between cross-links is large. Since the bending stiffness is relatively low, the network responds to deformation by the bending of its fibers, which is inherently non-affine. For freely rotating cross-links, it has been shown both through simulation and through a self consistent analysis of the floppy modes of the system that $G' \sim k_b \left(L/l_c \right)^{3.67} \sim K_b \rho^{6.67} L^{3.67}$ [\[141\]](#page-41-12), exhibiting an extreme sensitivity to the network density. The system behaves fundamentally differently when k_s >> k_b . In this regime, deformations are affine and $G' \sim k_s \sim EA \rho$, and the modulus depends only linearly on density. The critical length at which the transition occurs is given by $l_{\text{crit}} = L[(\rho - \rho_f)L]^{-2.84}$. Thus far, this scaling transition has not been fully explored in three-dimensional simulations. However, Huisman et al. [\[182\]](#page-43-9) have studied artificially generated networks designed to be similar to actin, and Stein et al. [\[84\]](#page-38-11) have studied collagen networks of realistic architecture. Both have found that at small deformations, the primary mode of energy storage is in bending, and at small strains the deformations are highly non-affine. This result lends further support to the idea that the affine assumption is erroneous for most biopolymer networks.

As discussed in more detail below, cross-linked biopolymer networks typically scale by $G' \sim c^{2-3}$, where *c* is the polymer concentration. This is quite different than either scaling regime for the Mikado model. Thus the importance of the above results is not in the specific scaling laws derived, but in the observation that there are two distinct mechanical regimes, one dominated by affine stretching and another dominated by nonaffine bending.

19.4.3.3. Entropic Beam Model

An additional level of detail that can be added to the model is the entropic component of the stretching stiffness of an individual filament. In this framework, the stretching stiffness k_s of a segment is modeled as two springs connected in series:

an elastic element $k_{el} = EA/l_c$, and an entropic element given by $k_{en} = K_b^2 / kT l_c^4$. The total stretching stiffness is given by $k_s^{-1} = k_{el}^{-1} + k_{en}^{-1}$ and is dominated by the more compliant of the two elements. In the case that the entropic stiffness is weakest, we have $k_s \sim l_c^{-4}$, which is markedly different from $k_s \sim l_c^{-1}$ for purely mechanical networks. Fibrous networks exhibit G' scaling that is very sensitive to the cross-link behavior. For rigid cross-links, $G' \sim Ak_s + Bk_b$, where rather than acting in series, the stretching elements now act in parallel, with the stronger of the two dominating the elastic response. For flexible cross-links, however, in the case of inextensible fibers ($k_{el} \rightarrow \infty$), $k_b^{0.5} k_s^{0.5}$. For these systems too, it is found that there is a critical average segment length l_{crit} , such that for networks with $l_c < l_{\text{crit}}$, the deformations are affine and when $l_c > l_{\text{crit}}$, the deformations are nonaffine. Thus including the entropic properties of the network gives qualitatively different scaling laws for *G* , but the nonaffine/affine transition is still present.

19.4.4. Finite Strain

19.4.4.1. Strain Stiffening

The above section focused on the small-strain behavior of networks. Soft tissues, in particular, routinely deform beyond the small strain limit, ranging anywhere from 2% to over 40% strain depending on the tissue [\[76\]](#page-38-3). The typical load-deformation response of cells and soft tissues in uniaxial tension is non-linear, starting with a long, extensible toe region, followed by a linear and then exponential increase in the force. The stiffening observed at high strains is universal, but the cause of strain stiffening is unclear; the proposed mechanisms underlying it are dependent on the type of model used, and the mechanisms may be different for different biopolymers.

Storm et al. [\[70\]](#page-37-15) have used the affine theory developed by MacKintosh [\[158\]](#page-42-7) to show that the strain stiffening of a large number of polymers could qualitatively be explained by an affine deformation of a network of strain stiffening filaments. Similar behavior can also be produced by network reorganizations in which fibers are free to rotate with the deformation, both in spring [\[74,](#page-38-18) [149\]](#page-41-19) and beam models [\[84,](#page-38-11) [146,](#page-41-15) [147,](#page-41-16) [182,](#page-43-9) [183\]](#page-43-10). It is likely that the precise nature of strain stiffening depends upon the specific properties of the biopolymers, as well as the manner in which they are organized. Tissues are denser and more cross-linked than gels, and their strain stiffening response may derive from both molecular entropic effects and ECM geometry. In some instances, the scale of a problem involving tissues may warrant the use of affine theories [\[166\]](#page-42-15), although experiments show that at least some tissue fiber deformations are not affine [\[114,](#page-40-5) [166,](#page-42-15) [184\]](#page-43-11).

19.4.5. Bridging Scales – Multiscale Behavior of Networks

19.4.5.1. Representative Volume Element

A common approach used in relating the macroscopic behavior of a material to its microstructure is to find a region in which the microstructure is structurally typical to the entire sample [\[185\]](#page-43-12). Such a region is referred to as a representative volume

element (RVE). RVEs possess a characteristic length scale that is at least an order of magnitude larger (and preferably larger) than the length scale of heterogeneity in the microstructure. As a result, the whole material can be subdivided into a repeating array of RVEs, joined at their boundaries. Because the RVE is periodic and it is similar mechanically to the whole material, analysis can be conducted on the RVE alone.

Once an RVE has been selected, the analysis that follows assumes that the microstructure deforms continuously with the macroscopic strain field (the affine assumption). Such is the approach taken with cellular solid models [\[139,](#page-41-10) [186\]](#page-43-13), which have been used to study a variety of materials, including metals and plastics [\[139\]](#page-41-10), bone [\[187–](#page-43-14)[189\]](#page-43-15), and connective tissue in the optic nerve head [\[190\]](#page-43-16). Cellular networks can be setup with idealized, regular geometries that permit analytical solutions, or they can be created with irregular structures and probed with the finite element method [\[141,](#page-41-12) [191\]](#page-43-17). Either way, the bulk properties of the material can be related to the microstructure.

The analysis, however, is not limited to the behavior of one archetypal RVE. The RVE mechanical response can vary spatially, as in homogenization theory, where RVEs in the material develop different levels of strain to accommodate the inhomogeneous macroscopic displacement field [\[192–](#page-43-18)[194\]](#page-44-1). The strategies to link scales in soft tissues are more challenging because large deformations are possible; hence, techniques based on a small strain assumption, such as many forms of homogenization, will fail. More importantly, linking strategies that rely on periodicity cannot incorporate macroscopic heterogeneity.

Our group has developed a multi-scale computational model that relies on the method of volume averaging [\[195\]](#page-44-2) to link the macroscopic level to the microscopic level [\[74,](#page-38-18) [117,](#page-40-8) [149\]](#page-41-19). Because a material average volume is formulated (i.e. a volume that deforms with the material) large deformations are easily addressed. Furthermore, macroscopic heterogeneity, manifested as regional differences in the local ECM microstructure, can be accommodated naturally by employing different RVE network structures, provided that the regional differences are larger than the scale of the RVE. To clarify, the RVE domain should be bigger than the scale of microscopic gradients but smaller than that of macroscopic gradients [\[196\]](#page-44-3). As a result, the model provides a means to study the dependency of macroscopic tissue mechanics on the underlying ECM microstructure, which for our purposes is typically represented as a network of collagen fibers contained within an RVE [\[74,](#page-38-18) [117,](#page-40-8) [149,](#page-41-19) [150\]](#page-41-18). Consequently, the remainder of this discussion applies to collagen fiber networks, but other networks (e.g. electrospun fibers [\[195\]](#page-44-2)) can also be examined with the method provided their attributes are accounted for in the fiber constitutive equation and volume averaging equation detailed below.

19.4.5.2. Volume Averaging

In the model, the macroscopic domain is represented with a Galerkin finite element (FE) model (Figure [19-6\)](#page-23-0). However, in place of a macroscopic constitutive equation, the stress needed for the FE solution is obtained by solving the force balance on the

Figure 19-6. Multiscale modeling with volume averaging. The multiscale model relies on volume averaging theory to link scales. The macroscopic problem is represented using the Galerkin finite element method. RVEs containing fiber networks are centered at the integration points in the element, and the RVE boundaries are deformed with the macroscopic deformation field. Fiber forces in the network are volume averaged and the resulting macroscopic stress tensor is used in the macroscopic stress balance to solve for the new macroscopic displacement field. This process iterates going back and forth between scales until convergence is achieved

fiber network contained within an RVE. The RVEs are centered at the FE integration points, and their boundaries are displaced based on the macroscopic deformation field. Boundary displacements produce forces in the fibers that are transmitted via fiber crosslinks, with the result that the fibers in the network reorganize to achieve force equilibrium. The network fiber stress is averaged over the RVE to obtain the macroscopic average Cauchy stress tensor, which is then used in the macroscopic stress balance to determine the new macroscopic deformation field, and the process iterates until convergence is achieved.

The method utilizes three basic equations: (1) a constitutive equation to relate fiber stress to fiber strain (2) an equation that relates the average macroscopic stress to the volume average of the local fiber stresses (3) and an equation for the force balance at the macroscopic level. A fourth expression to incorporate rotational stiffness at the nodes can also be used [\[74\]](#page-38-18). A number of constitutive equations have been proposed for collagen fibers [\[160,](#page-42-9) [193,](#page-43-19) [198\]](#page-44-4) that represent the fiber as strong in tension and weak in compression. In previous work [\[73,](#page-38-19) [149\]](#page-41-19), we have found that the fiber constitutive equation used only has a minor influence on the macroscopic behavior. For convenience, we employ an exponential constitutive equation [\[160\]](#page-42-9) to relate the fiber force, *F*, as

$$
F = \frac{E_f A_f}{B} \left[\exp\left(B \varepsilon_f\right) - 1 \right],\tag{19-10}
$$

where E_f and *B* are constitutive constants, and A_f is the fiber cross-sectional area. The Green's strain of the fiber, ε_f , is given in terms of the fiber stretch ratio, λ_f , as $\varepsilon_f = 0.5 \left(\lambda_f^2 - 1 \right)$. Equation (19-10), at the low-strain limit, reduces to a linear model with elastic modulus E*f*.

In volume averaging [\[195,](#page-44-2) [199\]](#page-44-5), the macroscopic Cauchy stress tensor, S_{ii} , is determined by averaging the microscopic stress field, *sij*, over the RVE volume, *V*,

$$
S_{ij} = \frac{1}{V} \int\limits_{V} s_{ij} dV. \tag{19-11}
$$

Here we use index notation with uppercase and lowercase letters to refer to macroscopic and microscopic variables, respectively. The microscopic stress can be rewritten as $s_{ij} = s_{ki}\delta_{ik}$, where δ_{ik} is the Kronecker delta. Because the gradient of the direction vector, *x*, is equivalent to δ_{ik} ($\nabla x = x_{i,j} = \delta_{ij}$), Eq. (19-11) can be rewritten as

$$
S_{ij} = \frac{1}{V} \int_{V} s_{kj} x_{i,k} dV = \frac{1}{V} \int_{V} (s_{kj} x_{i}),_{k} dV - \frac{1}{V} \int_{V} s_{kj,k} x_{i} dV.
$$
 (19-12)

The second term on the RHS vanishes because microscopic equilibrium requires that $s_{k,i,k} = 0$. Applying the divergence theorem allows the macroscopic stress to be calculated as integral of the RVE surface tractions, t_i , over the RVE surface,

$$
S_{ij} = \frac{1}{V} \oint_{\partial V} n_k s_{kj} x_i dA = \frac{1}{V} \oint_{\partial V} x_i t_j dA.
$$
 (19-13)

The tractions occur at the locations where network segments intersect the RVE boundary (cross-links). For thin segments, *x* varies little over the segment-boundary intersection. Thus, $\int n_k s_{kj}x_i dA \approx x_i \int n_k s_{kj} dA = x_i F_j$, and the components of S_{ij} are given in terms of the crosslink positions, *x*, and forces, *F*, as

$$
S_{ij} = \frac{1}{V} \sum_{\text{boundary nodes}} x_i F_j,
$$
 (19-14)

The final equation needed is the macroscopic stress balance. Since the averaging volume is material and changes with the macroscopic displacement, additional terms must be incorporated (see Chandran [\[74\]](#page-38-18)). The advantages of material description are (1) it is consistent with how the microstructure deforms, (2) it satisfies the mass balance implicitly, and (3) the macroscopic gradients are naturally applied as the boundary conditions of the RVE [\[74\]](#page-38-18).

The macroscopic stress balance is given as

$$
S_{ij,i} = \frac{1}{V} \oint_{\partial V} \left(s_{ij} - S_{ij} \right) u_{k,i} n_k dA, \qquad (19-15)
$$

where *u* is RVE boundary displacement and *n* is the unit normal vector. The right hand side of Eq. (19-8) arises from the correlation between inhomogeneous displacement of the RVE boundary and local inhomogeneities in the stress field. In the case of a fixed RVE, the RHS would be zero.

19.5. APPLICATIONS TO BIOPOLYMERS

Now that the general methods used to model biopolymer networks have been discussed, we examine the application of network models to specific problems.

19.5.1. Actin

Actin is a popular choice for microstructural analysis due to its critical role in a number of cellular events and biological processes, including cell motility [\[179\]](#page-43-6). Of particular interest is the wide spectrum of actin cross-linkers, whose effect on network formation and mechanics has important implications for normal cell function. When no cross-linker is present, the networks are extremely compliant $(G' < 0.5 \text{ Pa})$ and elasticity scales with concentration as $G' \sim c_a^{7/5}$ [\[200\]](#page-44-6). The addition of a cross-linker can bring the modulus to 100 Pa or larger, clearly demonstrating their importance in network formation. Cross-linkers, however, can serve two functions. First, they can group individual filaments into a larger bundle, which can strongly influence the bending stiffness [\[179,](#page-43-6) [201\]](#page-44-7). Second, they can connect filaments and bundles together to form a network. Cross-linkers vary in length with shorter molecules, such as scurin and fascin, forming relatively tight bundles whereas longer molecules, such as filamin and α-actinin form looser bundles. Heavy meromyosin cross-links while forming no bundles at all. The effect that various cross-linkers have on the actin networks is summarized in Table [19-2.](#page-25-0) Remarkably, scurin [\[60,](#page-37-8) [68\]](#page-37-13), fascin [\[202\]](#page-44-8), and HMM [\[203\]](#page-44-9) all have similar effects in terms of the scaling of G' with respect to the actin concentration and cross-linker ratio, with

Cross-linker	None	Filamin [67]	HMM [201]	Fascin [61]	Scurin [60, 68]
Bundle formation	None	Loose	None	Tight	Tight
G' (Pa)	$0.1 - 0.5$	$1 - 10$	$0.1 - 100$	$0.1 - 100$	$0.1 - 100$
$G' \sim c_A{}^x$	1.4		2.2	2.4	2.5
$G' \sim R^x$ (large R)	N/A	0.4	1.2	1.5	
$G' \sim \gamma_{\rm crit}^x$	N/A		-1.0	-0.4	-0.6

Table 19-2. Effect of cross-linkers on actin network properties

 $G' \sim c_a^{(2.35\pm0.15)} R^{(1.6\pm0.4)}$. An additional parameter that is tracked is the critical strain $\gamma_{\text{crit}} \sim R^{(-0.7 \pm 0.3)}$, which indicates the onset of strain stiffening, and again is relatively similar for the three different cross-linkers.

Many models exist that have been used to explain some of these data, including the affine stretching model of worm-like chains [\[68,](#page-37-13) [158\]](#page-42-7), the nonaffine 8-chain model [\[173\]](#page-43-1), and the nonaffine bending model [\[167,](#page-42-16) [202\]](#page-44-8). All three models have also been able to explain the strain stiffening behavior of biopolymers [\[70,](#page-37-15) [147,](#page-41-16) [173\]](#page-43-1). In vivo, turnover of the actin network may contribute to its apparent viscosity. That is, a stressed fiber may disassemble and be replaced by new, unstressed fibers. The significance of this phenomenon varies with cell type, phenotype, and activity. While non-affinity has been directly observed at short length scales in scurin-crosslinked actin networks [\[102\]](#page-39-7), the community does not yet agree upon whether such nonaffinity is sufficient to invalidate the affine theory [\[168\]](#page-42-17). The 8-chain model of Palmer and Boyce [\[173\]](#page-43-1) requires one to refit the network prestress at each actin density. Thus their model makes the prediction that lower density networks have higher degrees of prestress, but such a prediction has yet to be validated.

Finally, it has been observed that the maximum strain that a gel can withstand decreases with increasing density [\[204\]](#page-44-0). This is hypothesized to be due to a shortening of the space between cross-links, which according to entropic stiffening hypothesis, means that the fibers reach their maximum state of strain sooner [\[158\]](#page-42-7).

19.5.2. Microtubules, IFs, and the Cytoskeleton

Microtubules and IFs have been cast into gels and subjected to rheology tests to determine their individual mechanical characteristics [\[205,](#page-44-10) [206\]](#page-44-11). However, the networks were formed in vitro from purified monomer and may differ substantially from those formed inside a cell. It is important to understand the individual properties of these proteins, but how they integrate with actin to form the cytoskeleton is the ultimate goal, and much remains to be learned.

Wang and Stamenovic explore the contribution of IFs to cellular mechanics by measuring cell stiffness to applied stress in adherent wild-type and vimentindeficient fibroblasts through magnetic twisting cytometry [\[207\]](#page-44-12). At high applied stress ($>$ 10 dynes/cm²), the stiffness of the vimentin-deficient fibroblasts is much smaller than the wild-type fibroblasts, while at a stress of 10 dynes/cm², the stiffness is comparable. A six-strut tensegrity model (discussed below) was able to replicate the stiffening that resulted from cytoskeletal fiber realignment.

Microtubules and IFs are integrated into the cytoskeleton, and therefore can affect the properties of the whole cell. One perspective on the structure-function relationship between the cell, its cytoskeleton, and the extracellular matrix is the hypothesis that the cell is a tensegrity (tensional integrity) structure [\[26,](#page-35-14) [208,](#page-44-13) [209\]](#page-44-14). In this model, the stability of the cytoskeleton is derived from a balance between a continuous filament network (actin and intermediate filaments) under tension and isolated compression-resistant elements (microtubules and thick actin bundles). Without internal tension, or "prestress", which can be generated through the cell's contractile machinery, the cytoskeleton would collapse. External forces, which are

transmitted from the ECM to the cytoskeleton through focal adhesions, cause the cytoskeleton to reorganize and stabilize until equilibrium is achieved. Support for this view appears to be based largely on its intuitive appeal and model predictions that match cell stiffening behavior with increasing tension and surface attachments [\[210,](#page-44-15) [211\]](#page-44-16). The non-linear behavior observed derives from geometric changes in the network, a behavior also observable in random fiber networks without compression elements. Although the concept of tensegrity is attractive, and experimental evidence shows that microtubules can buckle under cellular loading [\[212\]](#page-44-17), the exact nature of the complex interactions that define cytoskeletal mechanics remains poorly understood.

19.5.3. Spectrin

Spectrin has been studied as triangulated networks of Hookean springs of non-zero force-free length and finite maximum length [\[212\]](#page-44-17). Triangulated networks are generated from infinitely thin hard rods with six-fold vertices. Under compression, the six-fold symmetric structures undergo a phase transition to two-fold network symmetry as studied analytically at zero temperature or through Monte Carlo simulation with a non-zero temperature [\[212\]](#page-44-17). In subsequent studies, a six-fold symmetric network of polymer chains, representing the actin-spectrin cytoskeleton of the erythrocyte, is generated and the geometrical and elastic properties are determined [\[214\]](#page-44-18) and found to be in agreement with the shear modulus, of 6.6×10^{-3} dynes/cm at 25◦C, for the erythrocyte cytoskeleton as determined from micromechanical techniques [\[215\]](#page-45-3).

With respect to modeling the macroscopic erythrocyte structure, an intertriangulated network of chains becomes unwieldy. Consequently, Boey, et al., represented the spectrin chains using a worm-like chain potential providing a tractable and more physically realistic representation of an intertriangulated spectrin network than the original Hookean spring representation [\[214\]](#page-44-18). An ensemble-averaging technique was applied to non-axisymmetrical deformed shapes, analogous to an erythrocyte undergoing micropipette aspiration, demonstrating how the triangulated mesh of the spectrin-actin cytoskeleton imposes the macroscopic geometry of the erythrocyte [\[216\]](#page-45-4). Discher and colleagues' simulation results from three structural models of the spectrin network attached to a bilayer suggest that the network exists in a prestressed condition of compression balanced through tension created by the lipid bilayer [\[216\]](#page-45-4). Lee et al. later confirmed that the prestressed erythryocyte membrane is capable of sustaining large anisotropic strains using fluorescently-patterned photobleaching of a rhodamine phalloidin-labeled spectrin-actin cytoskeleton [\[214,](#page-44-18) [217\]](#page-45-5).

Additionally, the equilibrium shape of the human erythrocyte has been investigated using spectrin-level energetics [\[218\]](#page-45-6). Li and colleagues populated spherical and biconcave structures with spectrin networks capable of 2,3,...,9 element junctions. After the initial shape was populated, cytosol was removed allowing the shape to deflate with fixed spectrin connectivities. Coarse-grained molecular dynamics

was employed to find the equilibrium shape of the deflated RBC employing a wormlike chain free energy model for the spectrin tetramer links. As a consequence of the hypothesis that spectrin networks are constantly undergoing remodeling at some sufficiently small characteristic time scale, Li *et al.*, employed a liquefied network structure evolution algorithm to relax the in-plane shear elastic energy of the macroscopic network shape which permits the evolution to discocyte and stomacyte shapes based on the approach of Discher and colleagues [\[213,](#page-44-19) [214,](#page-44-18) [216,](#page-45-4) [217\]](#page-45-5).

19.5.4. Collagen I

Similarly to actin, collagen I has been modeled extensively due to its abundance and central structural role in many tissues. For this review, we focus on network models, where the fibers are modeled as tension resisting springs [\[73\]](#page-38-19) or tension and moment resisting beams [\[84\]](#page-38-11). As with the networks applied to actin, these models show that significant matrix restructuring occurs in a highly non-affine manner. In addition, uniaxial deformations applied to random networks result in nonlinear stiffening, which arises from fiber rotations that gradually lead to fiber stretch. In the small-strain limit, most of the energy in the network is stored in fiber and crosslink bending (when bending is accounted for). At large strains the primary energy storage mode is fiber stretching, and thus the large strain modulus scales linearly with density [\[84\]](#page-38-11).

Our multiscale model was originally developed for collagen gels, which appear smooth and continuous on the macroscopic scale but are in fact composed of discrete fibers. The model was applied to collagen gels [\[74,](#page-38-18) [149\]](#page-41-19) and extended to complex geometries [\[219\]](#page-45-7) by means of a sophisticated computational environment. A representative example can be seen in Figure [19-7,](#page-28-0) which shows the stretching of a

Figure 19-7. Heterogeneous test sample. A model system was constructed with a highly aligned central "wound" region and a more isotropic surrounding region. The sample was stretched uniaxially to 30% strain. The highly aligned central region deformed less than the surrounding isotropic region. Images are 2-D projections of a 3-D result

A fnN1 Deformation 0.00 mm Deformation 1.00 mn Deformation 2.00 mn В $\frac{2}{100}$ $tion 2.00r$ ation 1.00 mm

Figure 19-8. Image based multiscale modeling. One quadrant of a cell-seeded, compacted collagen gel was tested mechanically while microstructural orientation and strength of alignment was measured using polarized light. A unique 3-D, interconnected fiber network was generated for each finite element to match the average experimental values in the corresponding location in the experiment. (**a**) The model predictions (*red*) are overlaid on the experiment in white. For an off-axis hold test, in which the horizontal axis remained stationary while the vertical axis was displaced to a stretch ratio of 1.3, the model reasonably captured the local kinematics with some obvious differences. (**b**) The networks underwent significant restructuring in a location dependent manner. The network near the top right corner started off with moderate alignment in the horizontal direction. Fibers were free to rotate towards the vertical and stretch to accommodate the strain created by movement of the vertical grip. (**c**) This network, which was already aligned in the vertical direction increased in alignment with the stretch

sample with inhomogeneous structure. The model was also applied to electrospun synthetic polymer networks [\[197\]](#page-44-20), demonstrating its generality.

As noted earlier, an important challenge in such modeling is acquiring structural information, and as the sophistication of the model increases, so too does its need for structural specification. Sander et al. [\[117\]](#page-40-8) have recently shown that the multiscale scheme can be specified based on polarized-light imaging, with each finite element in the model set at the average orientation measured for it in a sample. The sample was subsequently stretched in an off-axis hold test, which was concurrently simulated. The force and strain results were compared between the model and experiment, and agreement was good with fitting parameters based only on the constitutive equation for the fibers (an example of this kind of simulation is presented in Figure [19-8\)](#page-29-0).

Because many tissues contain multiple components, a rule-of-mixtures model was applied to arterial wall mechanics [\[150\]](#page-41-18), with a network phase representing the collagen fibrils in the vessel wall and an incompressible continuous phase representing the non-collagenous tissue (Figure [19-9](#page-30-0) **s**hows typical simulation results and comparison to Experiment). The model agreed well with experimental data on decellularized porcine carotid artery [\[220\]](#page-45-8) and contained an important result: it was predicted that the non-collagenous material is in compression even when the vessel is inflated. That is, the role of the non-collagenous material in the model is to prevent vessel wall and/or lumen collapse, not solely to provide elastic recoil.

In some tissues, it has been observed that collagen fibrils/fibers/bundles are undulated and possess "crimp", and it has been hypothesized that their nonlinear stress-strain response is in part the result of collagen fibers straightening out [\[221\]](#page-45-9). When undulations were incorporated into a network model, the effect was to delay the stiffening response [\[147\]](#page-41-16).

Affine theories for collagen have also fit well to some experimental data when fiber-level properties are not required to match fiber level measurements [\[160,](#page-42-9) [222,](#page-45-10) [223\]](#page-45-11).

Figure 19-9. Simulated inflation of a decellularized artery [\[150\]](#page-41-18). (**a**) The simulation involves four steps: an initial open artery is constructed, it is closed to produce a prestressed artery, the artery is stretched longitudinally, and finally it is inflated. (**b**) Pressure-diameter curve for the simulation (*line*) and experiment (*dots*, [\[220\]](#page-45-8)) are in good agreement with only two fitting parameters, the fiber stiffness and the matrix stiffness

19.5.5. Type IV Collagen

In spite of the importance of basement membrane, structural modeling has lagged behind that of collagen I or actin. A notable exception is the recent work of Burd [\[224\]](#page-45-12). Burd examined two phenomenological models (a linear elastic model and a Fung-type hyperelastic model), concluding neither model correlates satisfactorily with the mechanical properties of the collagen IV network present in the human lens capsule. Instead, a regular hexagonal lattice of pin-jointed bars was created and subsequently perturbed randomly to create an irregular polygonal structure, as used by Cavalcante et al. [\[225\]](#page-45-13) for collagen-elastin networks. Representing the lens capsule as an irregular lattice of collagen IV embedded in a hyperelastic sheet correlated well with published data.

19.5.6. Fibronectin, Laminin, and the ECM

DiMilla and colleagues studied cell migration through a mathematical model elucidating the dependence of migration velocity on cellular mechanics and surface receptors binding with complementary ligands present in the extracellular substratum such as fibronectin and laminin [\[226\]](#page-45-14). They conclude that cytoskeletal force generation, cellular polarity, and adhesion dynamics are required for persistent cell motility. The model predicts how cell speed varies with a variety of phenomena including cytoplasmic rheology, intracellular contractile force, receptor/ligand densities and kinetics [\[226\]](#page-45-14). Ingber and Wang explored how the mechanical tension and the extracellular matrix through adhesion to the ligand fibronectin influence cytoskeletal mechanics [\[227\]](#page-45-15). Magnetic beads were coated with fibronectin of varying density, and a mechanical tension was applied to adherent endothelial cells through a magnetic twisting device. Ingber and Wang find that the cytoskeletal stiffness increases proportionally with the applied stress controlled by the magnetic twisting device and fibronectin density. A model is presented coupling cell mechanics to the applied stress [\[227\]](#page-45-15). Bischofs et al. developed a tension-elasticity model to correlate cell morphology as a consequence of adhesion to fibronectin-patterned substrates [\[227\]](#page-45-15). Bischofs derived a modified Laplace law from analytical results and computer simulation to describe filamentous network mechanics and contractility [\[227\]](#page-45-15). Such results demonstrate the coupling of extracellular adhesion influences cytoskeletal organization and cell shape.

19.6. SUMMARY

Two major challenges, in our opinion, remain for the community. The first is describing the segments and nodes in the network. Much work is now being done at the molecular scale [\[229\]](#page-45-16), but we do not yet have network-level models that can incorporate molecular-level information. A similar rise in single-molecule and single-fiber experimental methods [\[19,](#page-35-6) [20,](#page-35-7) [41,](#page-36-18) [230\]](#page-45-17) has not yet resulted in better fiber models in networks, which are still largely restricted to simple descriptions (springs, beams, or worm-like chains, none of which truly captures the full range of behaviors seen at the molecular/fiber level). The challenge is even greater when nodes are considered. Pin joints, rigid crosses, and moment springs are all idealizations that do not capture the complex molecular interactions that characterize the junction between two fibers, and they are assuredly different for different biopolymers. It is expected that future scientists, armed with improved computer hardware and software, will incorporate our new knowledge of molecular detail as it arises.

The other major challenge, as suggested by our choice of title, is understanding how a network of many components can be interpreted in terms the one continuous material it appears to be on the macroscopic scale. We have seen in this paper how numerous researchers have explored the relationship between fibers and how the network properties vary with, for example, fiber or cross-link density, but a vast majority of the work has focused on these phenomena from a physical or material standpoint, working on the assumption of macroscopic homogeneity and often emphasizing a single component. While these studies represent a critical first step in any analysis, we need methods to incorporate multiple components and, as often occurs in biological systems, heterogeneity at all length scales. Only when these phenomena are understood will we truly be able to understand the behavior of the one tissue in terms of its many components.

19.7. NOMENCLATURE

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