Assessment of Articular Cartilage by Second Harmonic Microscopy: Challenges and Opportunities

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Second harmonic microscopy (SHM) has emerged as a powerful non-destructive optical imaging modality that has high potential to perform the advanced structural characterization of intact articular cartilage. This article provides the current status, opportunities, and challenges of SHM for the use in cartilage evaluation. A novel perspective on SHM is being addressed that includes the reason, need and the importance of SHM in the assessment of articular cartilage. By taking the advantage of collagen specificity and high-resolution imaging, SHM can detect the structural and morphological changes in early stage cartilage damage that would otherwise be overlooked by standard clinical imaging methods such as radiography and arthroscopy. The current status of SHM for articular cartilage analysis and the major progress reported in recent literature are briefly described herein. We summarize the status of scientific efforts and the challenges that need to overcome before moving toward clinical applications of SHM in the context of cartilage evaluation.

Keywords: second harmonic microscopy, collagen imaging, articular cartilage, orthopedics, collagen type-II, cartilage degeneration, label-free tissue imaging and diagnostics

INTRODUCTION

Articular cartilage has a multilayered architecture, with three distinct (superficial, middle, and deep) zones of cartilage that can be viewed using high-resolution imaging tools [1, 2]. Collagen type-II is the most abundant structural molecule present in the extracellular matrix (ECM) of articular cartilage, with proteoglycan being the second most abundant molecule. In addition, elastin, hyaluronan, and other types of collagen (such as type-I, IV, V, VI, IX, and XI) are also found in relatively small amounts. The arrangement and interaction between proteoglycan (negatively charged), water and collagen-II makes the tissue capable of withstanding compressive and tensile physiological loading [1].

Accurate assessment of articular cartilage is essential in diagnosis, treatment-planning, and monitoring procedures in various orthopedic diseases. Articular cartilage is a connective tissue that covers the end of a bone in the synovial-joint and facilitates smooth movement by providing a low-friction surface and distributing any applied stress during motion. Articular cartilage lacks blood-vessels and hence associated with a lack of a regular nutrient supply. Therefore, unlike other tissues in the body, its capability to heal itself (regeneration) is very low.

The degradation of articular cartilage is directly associated with the progression of osteoarthritis (OA), which is one of the major causes of disability among elderly people and a rapidly increasing individual and socio-economic burden worldwide [3]. Changes in collagen architecture and organization are extensively associated with the stage of osteoarthritic degradation and age associated degeneration in articular cartilage.
In cartilage tissue engineering, the expression of collagen type-II is one of the most important markers for the quality assessment of articular cartilage constructs. In the treatment of osteochondral defects, regenerated articular cartilage needs to be monitored postoperatively because the repaired cartilage is observed as fibrocartilage (collagen type-I) instead of hyaline cartilage (collagen type-II), which deteriorates over time [4, 5]. Thus, the early evaluation of collagen microstructural alteration, changes in collagen architecture and detection of collagen types within intact articular cartilage are essential current needs of orthopedics that can support accurate assessment of cartilage damage and can facilitate the better treatment procedures.

CARTILAGE ASSESSMENT—THE NEED FOR BETTER TOOL

Non-invasive imaging methods such as radiography and magnetic resonance imaging (MRI) are limited in their use for articular cartilage evaluation since they are not sensitive to the early abnormalities [6, 7]. They are unable to detect early changes on the articular surface mainly because they are limited in resolution (~0.1–0.4 mm) and lack the molecular level specificity. Ultra-structural alterations in collagen are one of the prominent hallmarks to identify early stage cartilage abnormalities. To assess the quality of articular cartilage, non-invasive imaging methods have been tested [6–8]. However, direct assessment methods such as arthroscopy and histology are required for reliable and more precise evaluation of articular cartilage.

Arthroscopic assessment of a synovial-joint provides the magnified and direct visualization of the cartilage surface and currently represents a clinical standard to determine the extent of cartilage damage in several cartilage-disorders including OA, treatment of focal-lesion and, monitoring of “repair and degradation processes” over time. However, due to lack of early feature visibility (e.g., structural alterations in collagen fiber and changes in its integrity, fibrillation, chondrocyte cloning and death, micro-cracks and wrinkle-like pattern on articular surface etc.), the problems such as identification of accurate size of cartilage-lesions and estimation for severity of lesions remain persistent even when cartilage evaluation is performed using an arthroscope [9–13]. In addition, inter-observer variations raise a question mark regarding its reliability, which indicates the need for specialized clinical professionals. In several cases, histopathology is required in addition to arthroscopy for the further evaluation of cartilage. For histopathology, an invasive biopsy of cartilage is performed. Notably, in the long-run an invasive biopsy of articular cartilage can create clinical problems for the synovial-joint. Additionally, the results of a biopsy performed by a pathologist may take hours to days, thus, representing an intensive and time-consuming process.

Therefore, the inherent heterogeneity in cartilage-lesions, lack of early feature visibility, inter-observer variations, unreliability, and the further requirement of invasive biopsy are all major reasons that clearly indicate the need for a better tool to assist orthopedic surgeons. In addition, among the various histologic components, collagen fibers and bundles are the most influential parameters in acute and stress-related injuries of cartilage [14]. A technique that can provide reliable in-situ information about collagen alteration in addition to the surface morphology at the microscopic level without invasive biopsy would be of utmost importance for articular cartilage assessment in both research clinical settings (Figure 1).

SECOND HARMONIC MICROSCOPY FOR CARTILAGE ASSESSMENT

Optical imaging has played a significant role in achieving the fundamental goal of biomedical imaging by retrieving structural and morphological information from tissues and cells with the highest possible diffraction-limited contrast and resolution. Second harmonic microscopy (SHM) is unique in its ability to generate the second harmonic signal from non-centrosymmetric structures (e.g., collagen, myosin, microtubules) when excited by ultra short (femtosecond) laser light. SHM provides highly specific molecular-level imaging by utilizing the endogenous signal to image collagen in cartilage at (sub-)micron level resolution. In addition, polarization-resolved second harmonic microscopy (p-SHM) is one step ahead of commercial state-of-the-art techniques that can differentiate the types of fibrillar collagen present in cartilage. The ability to detect different types of fibrillar collagen can be utilized in differentiating repaired (fibrous) cartilage from the natural (hyaline) articular cartilage in a synovial-joint. Thus, the surface morphology of cartilage, structural alterations in collagen and, the detection of collagen types can be achieved by high-resolution (submicron level) images of intact cartilage, without any need for the sectioning and staining of target tissue. Moreover, chondrocytes can also be imaged by utilizing the two-photon excited autofluorescence signal (Figure 1D, green color), which can be optically separated from the SHM signal. In clinical setting, further enhancement of the fluorescence contrast for cellular imaging can be accomplished by using sodium fluorescein that is an FDA approved clinical dye and can be conveniently used in the synovial-joint during arthroscopy [15].

Seven reasons that indicate why SHM can be useful in the assessment of articular cartilage.

• The first reason is that SHM imaging provides an excellent specificity to fibrillar collagen. The early features of cartilage degeneration are associated with changes in collagen fibers. Due to a lack of molecular specificity, collagen-associated early signs of cartilage degeneration are difficult to visualize—even in arthroscopy. Due to the inherent molecular characteristics, only collagen fibers can produce an SHM signal in cartilage and hence can be easily differentiated from other molecules present in the cartilage matrix, which makes it highly sensitive in detecting structural changes in collagen. Moreover, polarization-resolved SHM can be applied to differentiate collagen type-I and type-II, indicating that it can be utilized to differentiate hyaline cartilage from fibrous cartilage and hence demonstrate its capability for assessment of regenerated cartilage after repair.
The second reason is high-resolution (submicron level) imaging by SHM. Due to a lack of high-resolution imaging, early stage pathological features of cartilage damage (e.g., fibrillation, cleft, fissure, chondrocyte-clustering etc.) are usually not visible in non-invasive clinical imaging methods (e.g., X-ray, CT, Ultrasound, MRI). Moreover, the novel structural features (Figure 2) of cartilage early degeneration, which include (i) architectural changes in the superficial-layer, (ii) microsplits (micron-level cracks) on articular surface, and (iii) the appearance of a wrinkle like pattern due to the loosening of cartilage articular surface cannot be detected using standard clinical imaging methods. Notably, such features can be observed by SHM due to its capability of high-resolution imaging.
• The third reason is real-time optical imaging, which is an essential need for emerging techniques that can potentially be translated to medical applications. Recently, SHM has been demonstrated for real time in-vivo endomicroscopy images with resolution 2.6 µm [16]. The acquired SHM micrographs are capable of detecting microsplits and ultra-structure fibril arrangements of collagen fiber in articular cartilage. Such technical advancements in SHM imaging at the endomicroscopic level are highly valuable for both translational and basic research [16, 17].

• The fourth reason relates to the capability of label-free imaging, which is highly welcomed in clinical use. SHM can be used in collagen imaging to analyze hyaline cartilage, fibrous cartilage, ligament, and tendon. Moreover, by combining two-photon excited fluorescence (TPEF) microscopy with SHM, the simultaneous label-free assessment of collagen alterations and changes in cellular morphology can highly complement the early assessment of cartilage damage [15].

• The fifth reason is the ability to perform optical sectioning and create a 3D image within the limits of penetration-depth (typically 100–200 µm) of laser light [18–20]. Tissue thickness in standard histological sections is normally 3–5 µm, which is very thin. Therefore, in histologically processed tissue, thickness-based morphological information is lost. For example, a normal articular surface is very smooth and firmly attached with underlying subchondral bone. The appearance of a "wrinkles-like" pattern indicates the possibility of cartilage loosening from the underlying bone. This pattern could only be seen via SHM in 3D-images with a thickness in the range of a few tens of microns. Another example is the visualization of changes in 3D cellular morphology, which is possible only if the thickness of tissue sections lie in the range of 10–20 µm. These features, exemplified by wrinkles and 3D cellular morphology, are lost in histological sections but could be observed in 3D-images acquired by SHM microscopy.

• The sixth reason is that the level of information acquired through SHM image bridges the gap between conventional light microscopy and electron microscopy of articular cartilage. Moreover, by exploiting polarization sensitivity, p-SHM is capable of differentiating collagen type-I and type-II, and can detect alterations in the helical pitch angle of collagen fiber in intact tissue that is beyond the diffraction limit.

• The seventh reason is that the use of SHM may reduce the need for invasive biopsy of articular cartilage. In the diagnostic and surgical procedure, articular cartilage biopsy is not frequently indicated. However, the procedure is feasible, and occasionally performed due to diagnostic aid [21] or post-operative assessment [4]. The needle-based invasive biopsy of articular cartilage can be a potential danger for a synovial-joint over the long term. By performing an optical biopsy in intact tissue, SHM could minimize the need for needle-based biopsy followed by histology. This might hold a crucial advantage in clinical and intra-operative procedures.

A comparable technique that can create a cross-sectional optical image of articular cartilage in real-time is optical coherence tomography (OCT) [22–25]. Although OCT shares several advantages with SHM such as label-free, non-destructive, in-situ, and real-time evaluation, it is a white-light interferometric image that provides structural morphology due to changes in tissue scattering properties while SHM is essentially based on the generation of second harmonic signals produced due to inherent non-linear interaction between excitation light and collagen fiber present in the articular cartilage. Therefore, SHM imaging is highly specific to fibrillar collagen and can provide improved contrast in the microscopic image of the articular surface. Thus, the structural and morphological changes associated with collagen fibers in early stage cartilage damage could be visualized in SHM, which might be relatively difficult in OCT due to a lack of collagen specificity. Moreover, differentiation between collagen type-II and type-I can be performed more accurately in p-SHM than in polarized-OCT [26]. However, to date, a comprehensive comparative analysis between SHM and OCT for the evaluation of articular cartilage remains missing from the literature.

**CURRENT STATUS: A SHORT REVIEW OF RECENT ADVANCES**

By comparing the standard clinical methods for cartilage imaging, Bo et al., described that high-resolution measurements of the multilayer ultra-structure of articular cartilage could be highly beneficial for both the research and clinical diagnosis [27]. For example, by imaging the elastin fiber in the articular surface, observing the arrangement of chondrocytes at different loading locations and targeting the transformation between collagen-II to collagen-I in articular cartilage could enhance our understanding of patho-physiology of cartilage disorders, including OA, and could assist in developing the engineered cartilage for repair. Elastin and chondrocytes can be imaged by TPEF while collagen-II and collagen-I can be detected by p-SHM. Alvin et al., assessed the ability of SHM to image ex-vivo bovine articular cartilage and presented (sub-) cellular resolution cartilage images at varying depths without fixing, sectioning, staining, and concluded that the method is sufficiently sensitive to detect pathological changes [28]. By evaluating the cellular pattern in induced cartilage injury, Novakovski et al., demonstrated that the detection of micro-cracks and associated chondrocyte death patterns could be helpful in the assessment of cartilage damage, while subsequent early intervention can assist in the prevention of post-traumatic OA [15]. In the equine model, Mansfield et al., described the distribution of elastin fibers and suggested their role in the mechanical function of articular cartilage [29]. Furthermore, Campagnola et al. performed quantitative measurements of structural changes at both the fiber and fibril assembly level in different cartilage zones to reveal articular cartilage zonal differentiation via SHM [30]. In another study, a step forward, Mansfield et al., recently investigated the microstructural response of articular cartilage zones to mechanical loading and demonstrated that local patterns at the submicron scale organization of collagen fibers could be detected using p-SHM [31]. The same group earlier showed that the polarization sensitivity of SHM may also detect
changes in disrupted patterns of the pericellular area within the matrix of degenerated articular cartilage [32]. In histologically damaged articular cartilage, a study analyzed changes in collagen architecture using SHM and demonstrated that cartilage damage is directly related to the reorganization of collagen fiber [10]. In another associated study, histopathological changes in surgically-induced osteoarthritic cartilage were characterized by SHM followed by image analyses, demonstrating that SHM could be an ideal imaging approach for detecting pathological changes in articular cartilage [11]. Our group has demonstrated the novel features (such as microspits and wrinkle-like patterns) in early stage osteoarthritic human cartilage, which could not otherwise be visualized by standard clinical imaging modalities [12], can be visualized using SHM. The discrimination ability of type-I and type-II collagen by p-SHM further adds to the characterization of articular cartilage, which might be advantageous for the post-operative evaluation of regenerated cartilage in the synovial-joint [26, 33].

An image-processing algorithm that can automatically categorize two-photon autofluorescence images of human articular cartilage into states of OA has previously been demonstrated [34]. In this article, an algorithm based on artificial neuronal network (ANN) in combination with discrete wavelet transformation to determine image features for the classification of OA stage was presented. The validation result shows a sensitivity of 0.88 and a specificity of 0.93. However, these numbers should be treated with caution because the number of patients was not mentioned in the article, and number of cartilage sections was only 31 for all four grades of OA. Inclusion of sufficient interpatient variabilities is an important aspect in such a study. Based on the geometry of cells, Novakofski et al. developed an algorithm to determine the degree of ellipticity to identify the death pattern of chondrocytes after inducing an injury to the articular cartilage [15]. Identification of changes in collagen organization and its inclusion could have been improved the overall cartilage assessments in this study. Moreover, cartilage imaging prior to injury and inclusion of inter-animal variability can enhance the credibility of this work. In another study, recently the Bag of Features (BoF) method based on a statistical texture analysis using the gray-level co-occurrence matrix (GLCM) was explored to extract the image features of cartilage and bone acquired by SHM [35]. Texture features are extracted on individual patches derived from original images to capture the local structural patterns. Using this approach, the discrimination between cartilaginous and osteous tissues with 97.5% accuracy for cartilage images and 94.4% accuracy for bone images were demonstrated. In addition, for discriminating OA pathology, three distinct classes-hyaline, fibrous and bone exposure was detected by BoF algorithm. Hyaline and bone image classifications achieved greater than 90% accuracy while fibrous images only achieved 60–70% accuracy. Cartilage fibrillation on articular surface and collagen microstructure alteration could be early markers of cartilage degeneration. Therefore, detection of such early features with high accuracy will be more important and advantageous for clinical application. In future, a BoF-based algorithm could contribute in this direction.

Notably, SHM images can provide relatively improved morphological features with much higher contrast than two-photon autofluorescence images of articular cartilage [12]. Thus, an image-processing algorithm for SHM images could provide improved results for the automatic categorization of damaged cartilage. Lilledahl et al., has highlighted that extracted quantitative parameters from Fourier image analysis of SHM images may describe the 3D orientation of collagen fibers in cartilage [36].

As a recent breakthrough in technological advancement, SHM images acquired using a flexible fiber-optic-based probe head possess a quality level comparable to images captured by large bench-top laser-scanning microscopes was demonstrated by Liang et al., that shows a promising potential of SHM for in-vivo arthroscopic applications [17]. In another study Stephen et al., recently demonstrated the pre-clinical translation of SHM using a microendoscope and a prototype of a SHM-based arthroscope for the in-vivo assessment of articular cartilage [16]. A summary of major recent advancements in articular cartilage assessments by SHM are included in Table 1.

**CHALLENGES TO SHM FOR CARTILAGE ASSESSMENT**

The advantages of SHM can be utilized for in-situ and in-vivo assessments of intact articular cartilage. The major limitation of SHM imaging relates to penetration depth, which is typically limited to hundreds of micrometers. This can be further improved by the application of tissue clearing [45] and adaptive optics [46]. However, SHM cannot achieve full-depth images of articular cartilage, which typically vary between 2 and 4 mm thickness in human knee articular cartilage. The technique is rather useful for surface analysis, and it would be highly interesting to determine whether the articular surface features represent disease progression in the full depth of cartilage. This issue is currently being addressed in our ongoing study associated with OA analysis [47]. A clinically relevant SHM scoring system to represent articular cartilage degradation and aging degeneration would also be highly useful. An initial effort has been undertaken by Hayley et al., which demonstrated that cartilage damage is associated with collagen redistribution, and collagen disorganization could be assigned an independent score [10]. A similar effort associated with SHM scoring system for the assessment of tissue-engineered cartilage has been also reported by Islam et al. [48].

The application of SHM to in-vivo imaging of articular cartilage could be highly complementary and useful for orthopedic surgeon, because a SHM-based arthroscope can provide new information associated with collagen alterations in addition to visual and tactile information acquired through standard arthroscope. An optical-fiber-based SHM probe can be integrated with existing modern clinical arthroscopy, while a miniaturized fiber-optics-based probe head can be designed as a long and thin tube, with several optics inside the tube [17]. The laser light emerging from the probe head can illuminate the cartilage, and the back-scattered light (second harmonic signal)
TABLE 1 | Cartilage assessment by second harmonic microscopy: a summary of major recent advancements within the past 10 years only.

| Publication year | Main focus | Technique | Model | Author |
|------------------|------------|-----------|-------|--------|
| 2019             | Pre-clinical translation of SHM-based arthroscopy for in-vivo assessment of articular cartilage. | Development of a pre-clinical prototype (PALOMINO) system. | Animal (porcine) | Baskey et al. [16] |
| 2019             | Detection of collagen reorganization at different layers due to applied mechanical loading (strain) on articular cartilage. | p-SHM | Animal (bovine)/human | Mansfield et al. [31] |
| 2018             | The study was explored to discriminate cartilaginous and osseous tissues. The proposed approach could be applied to detecting collagen remodeling in articular cartilage. | BoF method using GLCM analysis | Animal (mice) | Saitou et al. [35] |
| 2018             | Changes in collagen architecture were detected using SHM in histologically damaged articular cartilage. Collagen disorganization was assigned an independent quantitative score for potential enhancement in histological grading. | Qualitative SHM imaging | Human | Moody et al. [10] |
| 2017, 2010       | A flexible fiber-optic-based endoscopic probe was developed, which shows promising potential for in-vivo arthroscopic applications. | Development of a fiber-optic based two-photon endomicroscope | Animal (mouse) | Liang et al. [17]; Bao et al. [37] |
| 2015             | Novel structural features in early stage human osteoarthritic cartilage were demonstrated. | Morphological SHM imaging | Human | Kumar et al. [12] |
| 2015             | The discrimination ability of type-I and type-II collagen by p-SHM was demonstrated to characterize human articular cartilage. | Development of p-SHM system (susceptibility based imaging) | Human | Kumar et al. [26, 33] |
| 2015             | The contribution of collagen-fibril relative polarity to second harmonic signal intensity was demonstrated by interferometric SHM imaging of articular cartilage. The role of fibril polarity in cell-signalling and mechanical properties of cartilage matrix was also speculated. | Interferometric and p-SHM (phase image and anisotropy analysis) | Animal (foal) | Couture et al. [38] |
| 2015             | The zonal differentiation of articular cartilage was demonstrated via SHM. | SHM forward-backward response | Animal (bovine) | Chaudhary et al. [30] |
| 2015             | An increase in forward/backward intensity ratio in SHM images from the articular surface to the bone indicated the evolution of collagen fibril diameter and spatial organization as a function of depth within cartilage | SHM intensity dependence on polarization and forward-backward response | Human | Houle et al. [39] |
| 2015             | Histopathological changes in a surgically-induced osteoarthritic model was observed by SHM imaging. Therefore, SHM could be an ideal tool for the assessment of pathological changes in live articular cartilage. | SHM signal intensity and hierarchical cluster analysis | Animal (mice) | Kiyomatsu et al. [11] |
| 2014             | By applying external damage to articular cartilage, an evaluation of cartilage injury in live tissue was performed based on changes in cell morphology. | SHM and fluorescence imaging | Animal (equine) | Novakofski et al. [15] |
| 2014             | High-resolution cartilage images could benefit both research and the clinical diagnosis of early to late stages of cartilage disorders. | SHM and fluorescence imaging | Animal (kangaroo) | He et al. [27] |
| 2013             | The discrimination of collagen type-I and II was demonstrated in engineered cartilage constructs (in-vitro). | p-SHM (susceptibility based imaging) | Engineered cartilage/Animal (rat) | Su et al. [40] |
| 2013             | An image-processing algorithm can automatically categorize cartilage images into states of OA. | ANN in combination with discrete wavelet transformation on TPEF images | Human | Bergmann et al. [34] |
| 2012             | Collagen meshwork architecture at the articular surface in OA lesions was analyzed. It was observed that minor weakening of the collagen meshwork under normal loading leads to the bundling of fibrils, which is an irreversible step in the progression of cartilage damage. | SHM imaging in combination with spring-mass network model | Animal (bovine) | Brown et al. [41] |
| 2011             | A Fourier analysis-based image-processing technique was used on an SHM image for the quantitative extraction of parameters, which may describe the 3D orientation and dispersion of collagen in articular cartilage. | Finite element (FE) constitutive model in combination with Fourier image analysis | Animal (chicken) | Lilledahl et al. [36] |
| 2010, 2008       | The modification on the extracellular matrix of articular cartilage due to mechanical constraint (compression) and biochemical action (collagenase digestion) can be detected by SHM/TPEF image. In combination with fluorescence lifetime imaging (FLIM), multiphoton microscopy can be a potential diagnostic tool for characterizing the disorganization of collagen. | Textural analysis of SHM images (Haralick’s method), TPEF, FLIM, and spectral analysis. | Human | Werkmeister et al. [42, 43] |

(Continued)
can be collected through the same probe head and guided by fiber-optics to the detector. The first and foremost challenge is the development of a compact, long-wavelength pulsed laser complete with an effective cooling mechanism. The second major challenge lies in maintaining the high peak power of the laser pulse through the propagation of optical fiber, as laser pulses distort due to dispersion along the propagation through the optical fiber. Minimizing the dispersion of femtosecond pulses by introducing the prechirping of pulses prior to launching into fiber-optics-based endoscopic probe could represent one solution. As another solution, adaptive optics can be utilized to enhance peak intensity by shaping the spatial, temporal, and spectral characteristics of the laser pulse [49]. The specialized optical fiber must be designed to maintain the characteristics of the laser pulse as the pulse travels throughout the excitation and collection path. Moreover, the maintenance of polarization states of the laser beam during propagation through the optical-fiber represents another challenge in performing endoscopic p-SHM. However, it has also been demonstrated that the core of double-clad fiber can maintain the polarization state of excitation laser beam [37]. The third major challenge is related to the integration of the SHM probe to an existing arthroscope for orthopedic applications. The optics related to excitation and emission wavelength should be designed and placed in such a manner that they do not affect the existing visual performance of standard arthroscope, which currently utilizes white light. Additionally, providing the choice to change the magnification in order to obtain sub-micron level information and, inclusion of polarization-optics for the detection of collagen types are certainly beneficial, but it further complicates the technical design [50, 51]. Depending on the biomarker or morphological feature, it is expected that a rapid and accurate decision can be made via the direct visualization of SHM images.

The inclusion of an automated image analysis algorithm to categorize the structural pattern and biomarker, as well as its relation to cartilage degeneration stage, can be more helpful [15, 34]. Automated detection and categorizations of those features which couldn’t be detected by arthroscope are highly desirable. It could minimize the need of an invasive biopsy of articular cartilage during intra-operative diagnosis. The validation of automated image analysis process for a clinical application needs to follow a robust and rigorous procedure. Although morphology dependent (e.g., Fourier transform, Curvelets, GLCM, Textons) and morphology independent (e.g., p-SHM and SHM directionality) image analysis tools have been used for collagen analysis in tumor, ovary and liver tissues, the progress on assessments of articular cartilage using these tools is slow and needs more attention [52–54]. It would highly interesting to apply these tools for cartilage assessments, especially in human models to explore its clinical relevancy. The pros and cons of these tools are described by Tilbury and Campagnola [55].

### SUMMARY AND OUTLOOK

Traditionally, the majority of data regarding collagen alterations stems from histological analyses. During cartilage degradation or degeneration, a redistribution of collagen fibers occurs that eventually appears as a disorganization on the articular surface of cartilage by wide-field microscopy. The early alteration in collagen structure, arrangement, and architecture could be a significant pathological marker. Thus, an improved understanding of collagen organization in intact articular cartilage using SHM would be highly significant for research, pre-clinical, and clinical studies. The aforementioned reasons for applying SHM to articular cartilage assessment demonstrate that SHM has a strong potential to reveal microstructural features associated with collagen fibers that could assist researchers and orthopedic surgeons to improve the quality assessment of articular cartilage.

The feasibility of SHM for the assessment of articular cartilage in animals [11, 28, 30, 56], humans [12, 33], and tissue-engineered [44, 48, 57, 58] cartilage constructs have been demonstrated several times. SHM can provide a wealth of information at several levels, including, but not limited to, micron-level surface morphology, changes in collagen architecture, detection of collagen types in regenerated cartilage, label-free analysis, and 3D imaging capability (optical biopsy) within the limit of laser penetration depth. The structural and morphological features acquired by SHM may serve as endogenous biomarkers for the early damage of articular cartilage. The conventional visual and tactile information acquired using a standard arthroscope could be complemented by in-vivo SHM images; therefore, the integration of SHM could ultimately be useful in managing joint-disorders more efficiently. In addition to cartilage evaluation, a SHM-based arthroscope could be a highly rewarding tool for ligament evaluation and repair surgeries by assisting surgeons in the evaluation of correct ligament tension, thus stabilizing the joint and improving the long-term success of anterior cruciate ligament repair. 3D optical biopsy by SHM could not only be utilized for diagnostic and surgical purposes, but also for treatment planning and evaluation procedures. Furthermore, SHM is also emerging as a powerful

| Publication year | Main focus | Technique | Model | Author |
|------------------|------------|-----------|-------|--------|
| 2010             | The measurements of collagen and cell nucleus can enable us to quantitatively analyze the collagen volume and a spatial arrangement of cell-collagen-scaffold systems. | SHM and TPEF imaging | Engineered cartilage | Filova et al. [44] |
| 2009             | The distribution of and relationships between the elastin and collagen network were explored in equine cartilage matrix. | SHM and TPEF imaging | Animal (equine) | Mansfield et al. [29] |

TABLE 1 | Continued
imaging tool in cartilage tissue engineering. Label-free in-situ detection of collagen expression, collagen types, and associated submicron level structural information could also be highly useful in optimizing the fabrication procedures of bioprinted regenerative articular cartilage [59].

Clinical implementation can only occur if current technological challenges can be overcome through close collaboration between physicists, biologists, engineers, and orthopedic professionals working together to achieve the common goal. The combination of a miniaturized arthroscopic fiber-optics-based probe and image-processing algorithm for the automated categorization of cartilage states will open the opportunity for paradigm-shifting application of SHM in orthopedics for both research and clinical applications. New and bold approaches, such as the addition of SHM into the existing pool of arthroscopy, can be complementary to the standard clinical method and can further assist in fulfilling current orthopedic needs for the ultimate benefit of patients. The growing interest supported by progress in endoscopic probe development is anticipated to continue for the future establishment of SHM for the assessment of articular cartilage.

AUTHOR CONTRIBUTIONS

RK was the major contributor for this article. RK and AK were involved during the design, drafting, and revision of the manuscript. They have both read and approved the final version of the manuscript for submission.

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Conflict of Interest: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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