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## Characterizing the compression-dependent viscoelastic properties of human hepatic pathologies using dynamic compression testing

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# Characterizing the compression-dependent viscoelastic properties of human hepatic pathologies using dynamic compression testing

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## Abstract

Recent advances in elastography have provided several imaging modalities capable of quantifying the elasticity of tissue, an intrinsic tissue property. This information is useful for determining tumour margins and may also be useful for diagnosing specific tumour types. In this study, we used dynamic compression testing to quantify the viscoelastic properties of 16 human hepatic primary and secondary malignancies and their corresponding background tissue obtained following surgical resection. Two additional backgrounds were also tested. An analysis of the background tissue showed that *F4*-graded fibrotic liver tissue was significantly stiffer than *F0*-graded tissue, with a modulus contrast of 4:1. Steatotic liver tissue was slightly stiffer than normal liver tissue, but not significantly so. The tumour-to-background storage modulus contrast of hepatocellular carcinomas, a primary tumour, was approximately 1:1, and the contrast decreased with increasing fibrosis grade of the background tissue. Ramp testing showed that the background stiffness increased faster than the malignant tissue. Conversely, secondary tumours were typically much stiffer than the surrounding background, with a tumour-to-background contrast of 10:1 for colon metastases and 10:1 for cholangiocarcinomas. Ramp testing showed that colon metastases stiffened faster than their corresponding backgrounds. These data have provided insights into the mechanical properties of specific tumour types, which may prove beneficial as the use of quantitative stiffness imaging increases.

(Some figures may appear in colour only in the online journal)

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## 1. Introduction

Pathological changes to tissue are often accompanied by structural changes that lead to an increase in tissue stiffness (Fung 1993). For example, breast or prostate tumours often exhibit increased stiffness with respect to the surrounding tissue. Physicians often exploit this stiffness differential to locate tumours using manual palpation. This phenomenon is also observed in the liver. Inflammation caused by liver disease results in a progressive replacement of normal tissue with fibrous scar tissue (Bruix *et al* 2001), leading to an increase in tissue stiffness (Salameh *et al* 2009). Hepatic malignancies may also be stiff with respect to the surrounding tissue. However, these tumours are difficult to detect with manual palpation alone because of overlying fat and tissue layers.

Elastography is a form of virtual palpation used to differentiate tissue with differing stiffness and has been used to image lesions that cannot be detected with manual palpation alone, such as stiffer masses in the liver. For example, sonoelastography has delineated stiff thermal ablations *ex vivo* (Zhang *et al* 2008). Strain imaging has been used to demarcate radiofrequency ablations *ex vivo* and *in vivo*, using the ablation electrode as the compression device (Bharat *et al* 2008, Rubert *et al* 2010, Liu *et al* 2006). Recently, acoustic radiation force imaging (ARFI) has been used to determine hepatic malignancy margins by ‘pushing’ the tissue with an acoustic pulse and measuring the resulting displacements. The stiffer malignant tissue displaces less than the softer background (Fahey *et al* 2008a, 2008b).

Boundary delineation of hepatic malignancies is important, but assessing the pathological state of tumour and background tissue is just as critical. Strain imaging and displacement imaging provide margin information but do not provide information on the intrinsic stiffness of the tumour and surrounding background. Tissue elasticity (i.e. Young’s modulus) provides quantitative information, and several new imaging modalities have been developed to estimate this parameter. Magnetic resonance elastography (MRE) has successfully been used to quantify Young’s modulus in a variety of cancer types (Venkatesh *et al* 2008), as well as stage fibrosis (Huwart *et al* 2006, Asbach *et al* 2008). ARFI shear wave tracking has obtained quantitative estimates of the shear wave velocity, which is proportional to Young’s modulus, within regions of interest (ROI) in hepatic malignancies and in healthy tissue (Kapoor *et al* 2011, Palmeri *et al* 2008). Supersonic shear imaging (SSI) and two-dimensional transient elastography have successfully been used to quantify Young’s modulus in breast malignancies (Bercoff *et al* 2003, Tanter *et al* 2008) and in healthy liver tissue (Muller *et al* 2009), and electrode vibration elastography has quantified shear wave velocity within radiofrequency ablations (DeWall *et al* 2011). These techniques are exciting advances in elastography and could aid in diagnosing hepatic malignancies.

Imaging studies have been promising in quantifying the elasticity in hepatic malignancies, but mechanical testing will help corroborate results. Many studies have investigated the mechanical properties of normal liver tissue in animal models. The strain-rate-dependent behaviour of bovine liver tissue has been investigated (Pervin *et al* 2011, Roan and Vemaganti 2011). In a porcine model, the effects of perfusion on liver tissue mechanics have been studied (Kerdok *et al* 2006), and one-dimensional transient elastography stiffness estimates have been compared to DMA (Chatelin *et al* 2011). Dynamic compression testing has also been used to quantify the viscoelastic properties of normal and ablated canine hepatic tissue (Kiss *et al* 2004, 2009).

However, few studies have estimated the mechanical properties of human liver tissue via mechanical testing. An aspiration device has been developed to quantify liver stiffness on the liver surface during open surgery (Mazza *et al* 2007). Other studies have quantified the stiffness of the human liver based on the fibrosis score (Kusaka *et al* 2000, Yeh *et al* 2002), as well as

**Table 1.** Liver pathologies mechanically tested.

Pathology lesion	N	Fibrosis score					Fatty liver steatosis
		F0	F1	F2	F3	F4	
Colon metastases	6	5	0	1	0	0	2
Hepatocellular carcinoma	4	2	0	1	0	1	1
Cholangiocarcinoma	3	3	0	0	0	0	1
Gastrointestinal stromal metastases	1	1	0	0	0	0	0
Neuroendocrine metastases	1	1	0	0	0	0	1
Adenoma	1	1	0	0	0	0	0
Total:	16	13	0	2	0	1	5
Additional backgrounds:	–	1	0	0	0	1	1
Cumulative total:	16	14	0	2	0	2	6

the stiffness of cancers, namely a cholangiocarcinoma and a focal nodular hyperplasia (Yeh *et al* 2002). However, only these two human hepatic lesions were tested, and only simple cyclic testing was performed. The viscoelastic properties of hepatic malignancies have been poorly studied via mechanical testing, and few different types of cancers have been investigated.

To gain insights into possible correlations between the mechanical properties of human hepatic malignancies and cancer type, more work is necessary. In this study, we quantify the mechanical properties of human primary and secondary malignancies and their corresponding background tissue using dynamic compression testing through a range of precompressional loads and testing frequencies. In addition, we investigate the effects of strain-hardening on hepatic malignancies and background tissue through a broad compression range using ramp testing. Background tissue samples are compared based on fibrosis grade or steatosis to determine differences in the viscoelastic properties based on the pathological state of the tissue.

## 2. Methods

### 2.1. Experiment

Malignant and background hepatic tissue samples from 18 patients were obtained from the University of Wisconsin Pathology Laboratory. Each sample came from a patient who underwent a surgical resection, and all surgeries were performed at the University of Wisconsin Hospital and Clinics (Madison, WI). Following surgery, the liver section was brought to the Surgical Pathology Laboratory. Approximately, 1 cm<sup>3</sup> of the lesion and 1 cm<sup>3</sup> of the background were removed, placed in saline and transported to our laboratory for dynamic compression testing. For two of the cases, only background tissue was obtained and tested (i.e. 16 lesions and 18 backgrounds were tested). Pathology types are listed in table 1. Samples were typically tested within 2 h of acquisition and were refrigerated until testing. Before testing, samples were raised to room temperature. If necessary, samples were further shaped to make them square. The dimensions of all sides were measured multiple times and averaged. All protocols and procedures for this study were approved by the University of Wisconsin Institutional Review Board for studies on excised tissue specimens.

### 2.2. Dynamic compression testing

To quantify the viscoelastic properties of the benign, malignant and background tissue, dynamic compression tests were performed. This testing has been previously described (Kiss

*et al* 2006, DeWall *et al* 2010). Briefly, an acrylic platen induces a sinusoidal displacement, or strain, on the tissue sample, resulting in a sinusoidal force, or stress, phase shifted by an angle  $\delta$ . The complex modulus ( $E^*$ ) is the ratio of the stress to the strain, which can be divided into the energy stored per cycle, or storage modulus ( $E'$ ), and the energy lost per cycle, or loss modulus ( $E''$ ). The ratio of these two quantities is often referred to as  $\tan \delta$ , or viscous damping (Lakes 1999):

$$\tan \delta = \frac{E''}{E'}. \quad (1)$$

All samples were dynamically tested using an EnduraTEC ELF 3220 (Bose Corporation, EnduraTEC Systems Group; Minnetonka, MN). The samples and testing platens were coated with a thin layer of mineral oil to minimize tissue desiccation and friction at the contact surfaces. The upper platen was lowered until just touching the upper surface of the tissue sample. After contact was established, the sample was dynamically tested with sinusoidal compressions over a range of compressions and frequencies.

The system was controlled using the ElectroForce (ELF) DMA software. Each sample was tested from 1% to 6% precompression with a compression amplitude of 2%. For example, a sample tested at 1% precompression was sinusoidally tested from 1% to 3% compression with a mean compression of 2%. For each precompression level, samples were dynamically tested at 1, 10, 20 and 30 Hz. In order to precondition the tissue (Fung 1993), several compression cycles occurred before data collection. There was a 15 s hold between testing frequencies. During this time, the sample was held at the mean strain value (e.g. 2% for 1%–3% compression test). For each testing frequency, the DMA software measured the force amplitude, displacement amplitude and phase lag at the peak frequency and output  $|E^*|$ ,  $E'$ ,  $E''$  and  $\tan \delta$ . The DMA software assumes that the area of the sample faces remains the same. Because tissue is nearly incompressible, a correction factor was applied to account for the changes in sample face size with compression.

During the course of this study, it was observed that the tumour-to-background contrast changed little in the 1%–6% precompression range. Simple ramp testing was added to the protocol to investigate strain-hardening at higher levels of compression. After dynamic testing, samples were compressed up to 20% precompression at a strain rate of  $0.1\% \text{ s}^{-1}$ . Three cycles of data were collected to precondition the tissue (Fung 1993). The sample face area changes because the tissue is nearly incompressible. This must be accounted for in the calculation of stress and strain. Material stretch is defined as

$$\lambda = \frac{h}{h_0}. \quad (2)$$

The Cauchy stress is

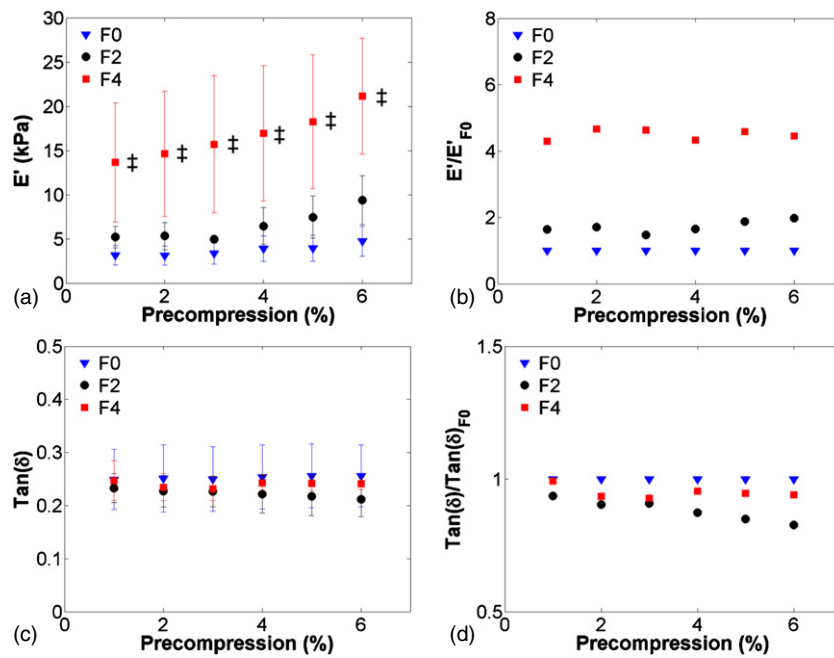
$$\sigma = \frac{F}{A_0} \lambda \quad (3)$$

and the Almansi strain is

$$\varepsilon = \frac{1}{2} \left( 1 - \frac{1}{\lambda^2} \right). \quad (4)$$

### 2.3. Statistics

The significance of the overall changes in  $E'$ ,  $E''$  and  $\tan \delta$  over the precompression range and the frequency range was assessed using a one-way analysis of variance (ANOVA;  $p < 0.001$ ). Tukey multiple comparisons were used to compare  $E'$ ,  $E''$  and  $\tan \delta$  at each precompression level or frequency to  $E'$ ,  $E''$ , and  $\tan \delta$  at 1% precompression or 1 Hz frequency, respectively



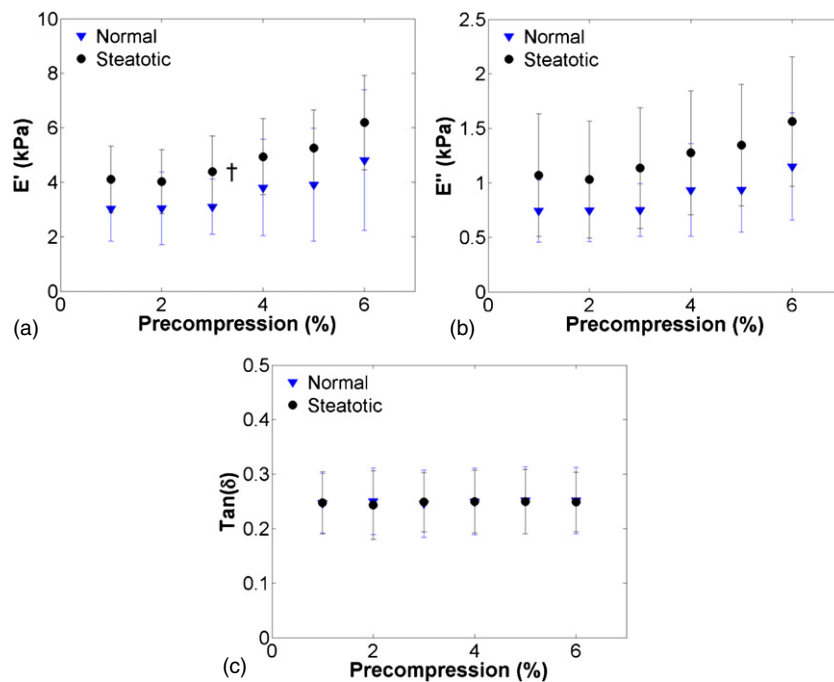
**Figure 1.** Viscoelastic properties of background tissue based on fibrosis score. The storage modulus (a) increased with increasing fibrosis score. The storage modulus normalized to  $F0$  grade (b) was roughly four times higher in  $F4$  cases.  $\tan \delta$  (c) remained relatively constant regardless of fibrosis grade. There was little difference among fibrosis grades when  $\tan \delta$  was normalized to  $F0$  (d).

(\*,  $p < 0.05$ ; \*\*,  $p < 0.001$ ). Significance between groups (e.g. malignant versus background tissue) at each precompression level or frequency was also tested ( $\dagger$ ,  $p < 0.05$ ;  $\ddagger$ ,  $p < 0.001$ ). All results are presented as mean  $\pm$  standard deviation.

### 3. Results

Background tissue stiffness was compared by grouping samples based on fibrosis grade or steatosis. Figure 1 shows background tissue broken down into  $F0$  ( $n = 14$ ),  $F2$  ( $n = 2$ ) and  $F4$  ( $n = 2$ ) fibrosis grades. The  $F4$ -graded liver tissue storage modulus was significantly higher than that of  $F0$  tissue, with a ratio of approximately 4:1. In figure 2, samples were grouped as steatotic or normal, excluding the cirrhotic ( $F4$ -graded) samples. Steatotic tissue exhibited an elevated storage modulus with respect to normal tissue, but was not significantly so, except for the 3% compression level. The loss modulus was also elevated but was not significantly so.

The effect of precompression on hepatic tissue viscoelastic properties was investigated in benign and malignant lesions and the surrounding background tissue. Figure 3 shows dynamic compression testing data from hepatocellular carcinomas (HCCs,  $n = 4$ ), a primary cancer. There was a trend of increasing stiffness with increasing precompression in figure 3(a). The storage modulus of the background was more variable than that of the HCCs tested. The tumour-to-background contrast was broken down by fibrosis grade in figure 3(b) and decreased from 1.5:1 at  $F0$  to 0.5:1 at  $F4$ .  $\tan \delta$  changed little with increasing precompression. In figure 4, the storage modulus of colon metastases ( $n = 6$ ), a secondary cancer, was significantly higher than the background tissue and was more variable. The tumour-to-background contrast

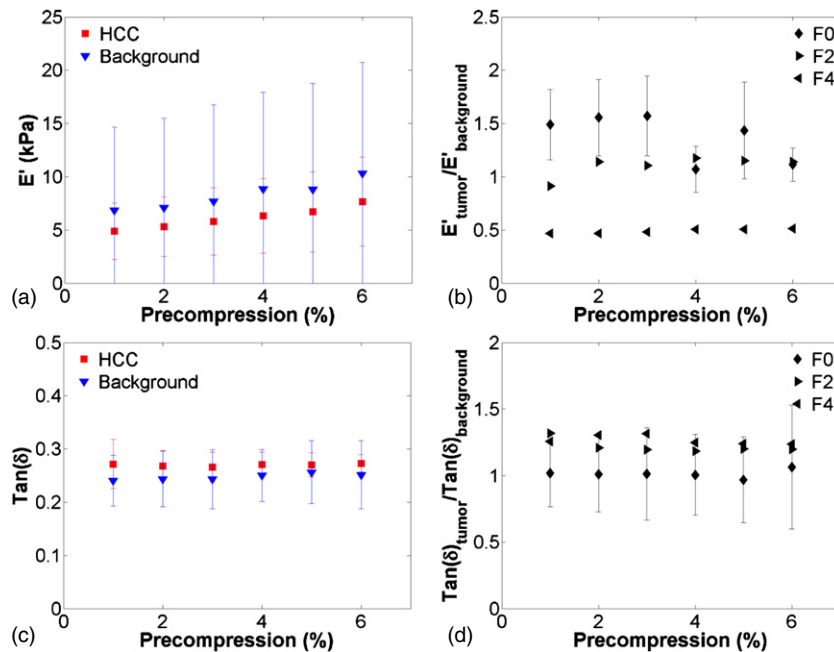


**Figure 2.** Effects of precompression on normal ( $n = 10$ ) and steatotic ( $n = 6$ ) liver tissue. The storage modulus (a) of steatotic liver was not significantly higher than normal tissue for all compression levels but 3% (†,  $p < 0.05$ ; ‡,  $p < 0.001$ ), although the mean stiffness was slightly elevated with respect to normal. The loss modulus (b) in steatotic tissue was elevated with respect to normal tissue but not significantly so. The  $\tan \delta$  of steatotic or normal tissue (c) was relatively constant with increasing precompression.

was relatively constant at 10:1 for the  $F0$  background and was approximately 1.25:1 for the one  $F2$  background that was tested. As with HCCs,  $\tan \delta$  changed little with precompression. In figure 5, the storage modulus of cholangiocarcinomas ( $n = 3$ ), another secondary cancer, was highly variable, but not so in the background tissue. The tumour-to-background contrast was approximately 10:1, and  $\tan \delta$  was relatively constant. A benign adenoma ( $n = 1$ ), gastrointestinal stromal metastasis ( $n = 1$ ) and neuro-endocrine metastasis ( $n = 1$ ) are presented in figure 6. All exhibited an increase in stiffness with increasing precompression and the tumour-to-background contrast ranged from 1.5 to 2.5 for all lesions.

Malignant and background liver tissue also exhibited frequency-dependent behaviour. Figure 7 presents the storage modulus and  $\tan \delta$  in HCCs and their corresponding background for the 1%–3% and 6%–8% compression levels. The storage modulus in HCCs and background tissue increased with precompression, although not significantly.  $\tan \delta$  increased significantly with increasing frequency in both the background and malignant tissues. The storage modulus contrast and  $\tan \delta$  contrast remained relatively constant across frequencies. In figure 8, the stiffness of colon metastases was significantly higher than the background tissue for all frequencies at the 1%–3% and 6%–8% compression levels. The storage modulus tended to increase with increasing frequency, although not significantly so.  $\tan \delta$  significantly increased with increasing frequency in the background tissue. As with HCCs, the tumour-to-background contrast was relatively constant.





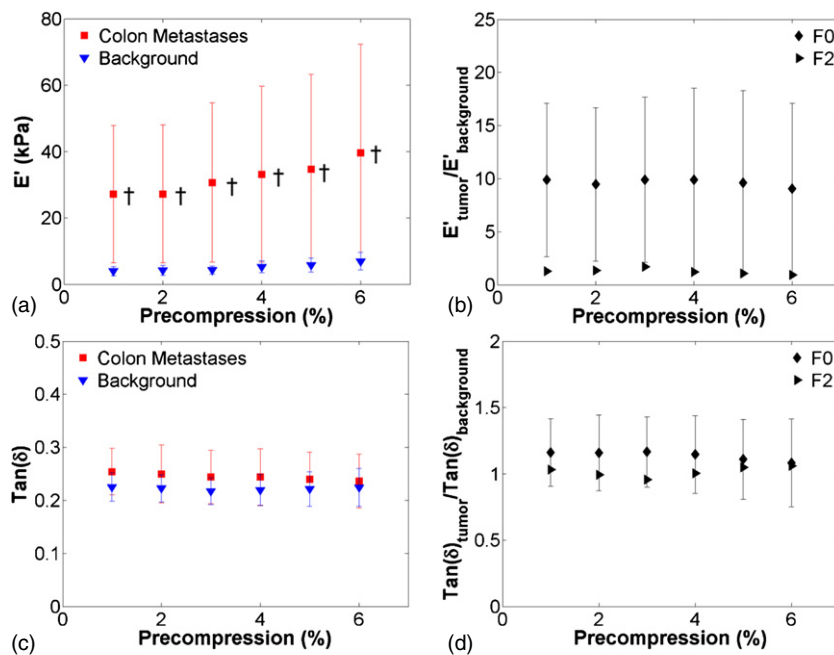
**Figure 3.** Viscoelastic properties of hepatocellular carcinomas (HCCs) and surrounding background tissue ( $n = 4$ ). The storage modulus (a) for HCCs and background tissue increased with increasing precompression. The background tissue was highly variable because of different fibrosis grades. The tissue contrast (b) remained relatively constant with compression, but decreased with increasing fibrosis grade ( $F0$ ,  $n = 2$ ;  $F2$ ,  $n = 1$ ;  $F4$ ,  $n = 1$ ).  $\tan(\delta)$  (c) and  $\tan(\delta)$  tumour-to-background contrast (d) remained relatively constant with increasing compression.

Ramp loading up to 20% compression was used to investigate strain-hardening in HCCs and colon metastases when compared to the surrounding background. The background of all samples that were tested had a fibrosis grade of  $F0$ . Interestingly, the background strain-hardened faster than the HCC that was tested, as shown in figure 9. In figure 10, all colon metastases ( $n = 4$ ) strain-hardened faster than the surrounding background, but the rate and extent of strain-hardening were quite variable.

#### 4. Discussion

We have quantified differences in tissue stiffness contrast based on cancer type or the background tissue disease state. Few studies have quantified tissue mechanics in human hepatic malignancies via mechanical testing (Yeh *et al* 2002, Kusaka *et al* 2000). This work provides mechanical testing estimates of the viscoelastic properties of specific cancer types that are currently absent from the literature. HCCs, a primary tumour, were approximately of the same stiffness as the surrounding background and interestingly exhibited lower contrast with large compressions. Metastases, or secondary cancers, were stiffer than the surrounding background. Secondary tumours also strain-hardened faster than their corresponding background liver tissue. Cirrhotic  $F4$ -graded tissue was significantly stiffer than  $F0$ -graded tissue, and mean values of the graded sample groups were comparable to estimates obtained via elastography (Sandrin *et al* 2003). Steatotic tissue was only slightly stiffer than normal tissue but generally



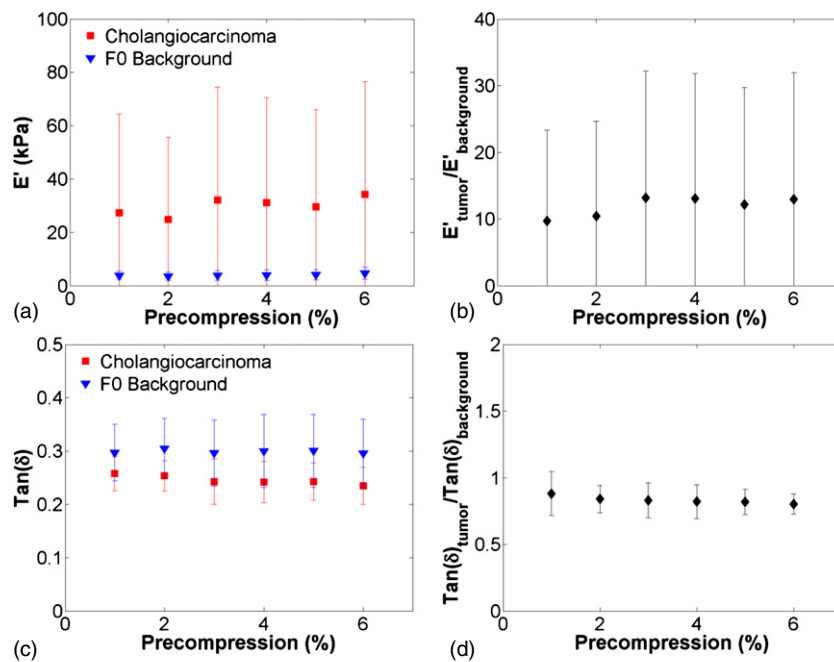


**Figure 4.** Viscoelastic properties of colon metastases ( $n = 6$ ). The storage modulus (a) of the malignant tissue was much higher in colon metastases and exhibited higher variability than the surrounding background tissue ( $\dagger$ ,  $p < 0.05$ ;  $\ddagger$ ,  $p < 0.001$ ). The storage modulus contrast (b) was relatively constant, as were  $\tan(\delta)$  (c) and  $\tan(\delta)$  contrast (d).

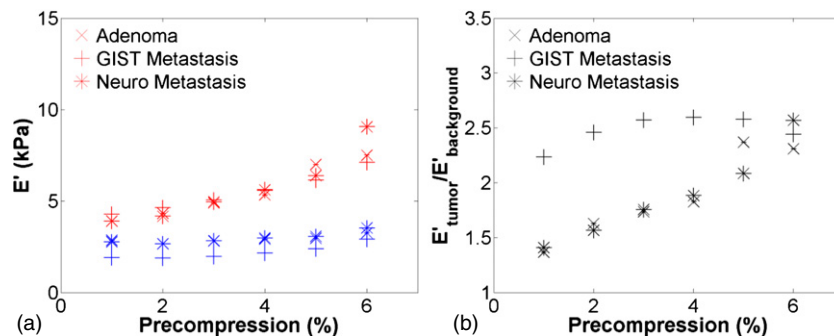
not significantly so, as shown in a prior study on liver tissue in rats (Salameh *et al* 2009). These results provide insights that may prove useful in diagnosing hepatic malignancies using quantitative stiffness imaging modalities.

The background tissue samples were divided into groups based on fibrosis score or the presence or absence of steatosis. F4-graded cirrhotic tissue was significantly stiffer than normal background tissue, and results were comparable to those previously reported (Sandrin *et al* 2003, Palmeri *et al* 2008). The variability of tissue stiffness increased with fibrosis grade, likely an increase in tissue heterogeneity with the pathological state. Elastography modalities such as SSI and MRE can partially circumvent the increase in dispersion resulting from heterogeneity by averaging the stiffness in a large ROI. This was not possible with our system, because the testing platens could not accommodate a sample larger than  $1 \text{ cm}^3$ . However, the mean elastic moduli were comparable to imaging studies. Steatotic tissue was stiffer than normal tissue, but not significantly so, as reported in prior studies (Yeh *et al* 2002). ARFI shear wave imaging has also shown that stiffness increases with steatosis in a chicken model (Guzman Aroca *et al* 2010). The loss modulus was also elevated, but not significantly. This differs from observations in a rat model of steatosis (Salameh *et al* 2009). However, in that study, the level of steatosis was approximately 30%, while the level of steatosis observed in this study was only 5%–10%.

We tested four HCCs, primary cancers, over the course of this study. The storage modulus in the tumours was approximately of the same stiffness as that in the corresponding background. One study reported that testing an HCC was impossible because it was too soft (Yeh *et al* 2002); we did not find this to be the case, but the HCCs were relatively soft compared to

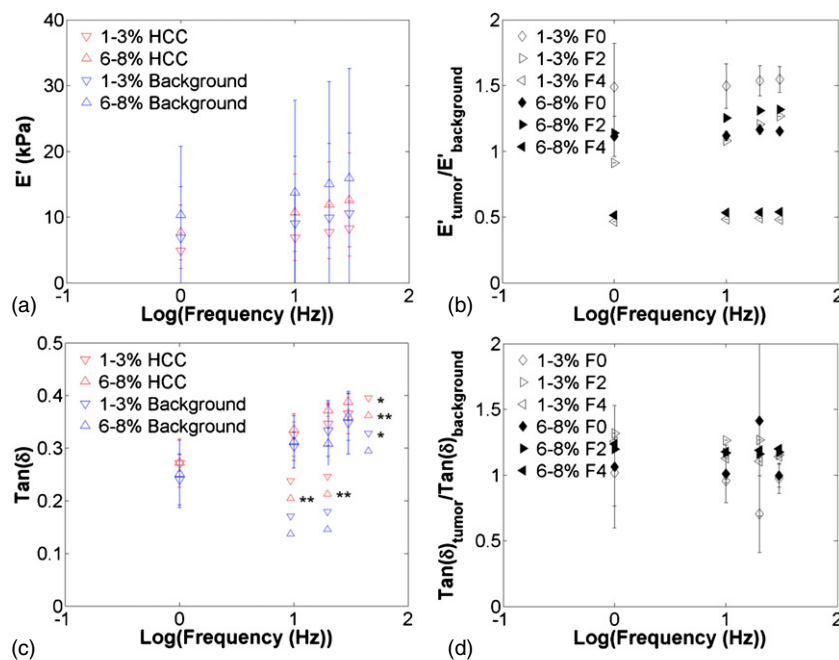


**Figure 5.** Viscoelastic properties of cholangiocarcinomas ( $n = 3$ ). The storage modulus (a) was higher and more variable in the malignant tissue than the F0 background. The storage modulus contrast (b) was relatively constant, as were  $\tan(\delta)$  (c) and  $\tan(\delta)$  contrast (d).



**Figure 6.** Effects of precompression on a benign adenoma ( $n = 1$ ), gastrointestinal stromal (GIST) metastasis ( $n = 1$ ), and neuroendocrine (Neuro) metastasis ( $n = 1$ ). The lesion and normal tissue storage modulus (a) increased with increasing precompression. An increase in the contrast (b) with increasing precompression was observed in the adenoma and the neuroendocrine metastasis.

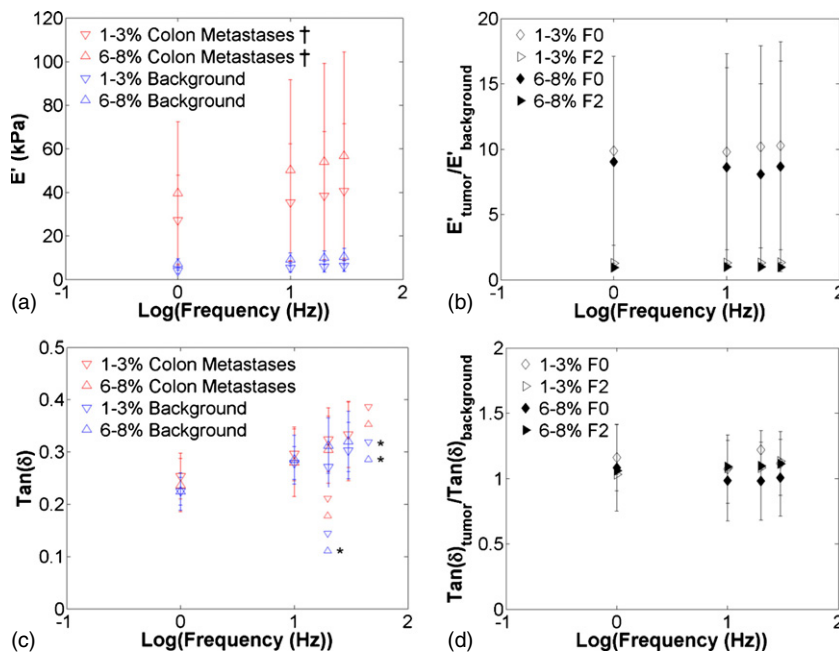
the background when compared to other tissue types. This may be explained by the fact that HCCs primarily occur in patients with liver fibrosis, which results from a variety of diseases or conditions including hepatitis B and C, diabetes mellitus, alcoholism and fat accumulation (Bruix *et al* 2001). Damage to the liver leads to a progressive replacement of normal tissue with scar tissue, increasing the inherent stiffness of the liver. Of our samples, two were graded F0, one was graded F2 and one was graded F4, which is reflected in the variability of the background tissue. In figure 3(b), the contrast is broken down based on fibrosis grade. The tumour-to-background contrast is relatively low and decreases with increasing fibrosis grade,



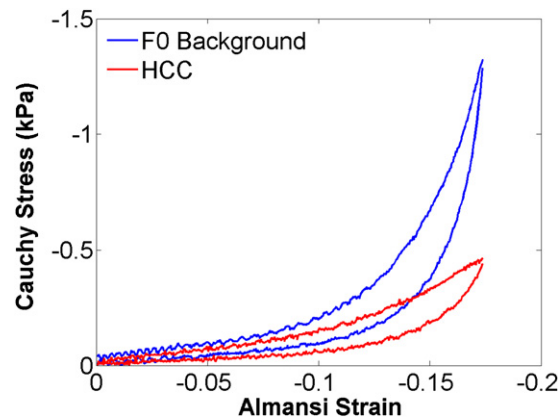
**Figure 7.** Effects of testing frequency on hepatocellular carcinoma (HCC) and surrounding background viscoelastic properties ( $n = 4$ ). Graphs present the storage modulus (a), modulus contrast (b),  $\tan(\delta)$  (c) and  $\tan(\delta)$  contrast (d) for the 1%–3% and 6%–8% compression ranges. Increases in frequency increased the storage modulus and  $\tan(\delta)$  (\*,  $p < 0.05$ ; \*\*,  $p < 0.001$ ). The storage modulus and  $\tan(\delta)$  contrast remained relatively constant with increases in frequency. Note that symbols to the left of the asterisks indicate statistical significance only i.e. they are not actual data points.

with the tumour being softer than the surrounded background (0.5:1) for  $F4$ -graded tissue. Low contrast or tumours softer than the surrounding background may be a useful indicator of primary hepatic cancer. Interestingly,  $\tan \delta$  values and variability were similar for both malignant and background tissue, similar to those previously reported in healthy animal tissue (Chatelin *et al* 2011, Kiss *et al* 2004).

Secondary tumours were in general stiffer than their corresponding background. Colon metastases were significantly stiffer and much more variable than the background tissue. The same behaviour was observed for cholangiocarcinomas. The variability may reflect different levels of tumour progression, patient variability (e.g. health, diet) or tissue heterogeneity resulting from the pathological state of the tissue. Ideally, we would have globally tested the entire tumour or spatially mapped the tissue stiffness via dynamic indentation (DeWall *et al* 2012). However, due to the finite amount of tissue available and the pathology lab's need to analyse tissue for pathological diagnosis, we could not acquire entire tumours. In addition, for our compression testing protocol, it is infeasible to test tumours at the same level of progression in human studies, as treatment strategies are started soon after tumour detection. Interestingly, the background tissue storage modulus estimates were very consistent across the secondary tumours tested, which reflects the fact that the tumour was metastasized from another site. That is, the liver did not have an underlying disease or condition that caused the cancer: of the colon metastases ( $n = 6$ ) and cholangiocarcinomas ( $n = 3$ ) tested, eight were graded  $F0$  and one was graded  $F2$ .  $\tan \delta$  estimates and variability were again comparable, indicating that viscous damping may not hold any diagnostic value.

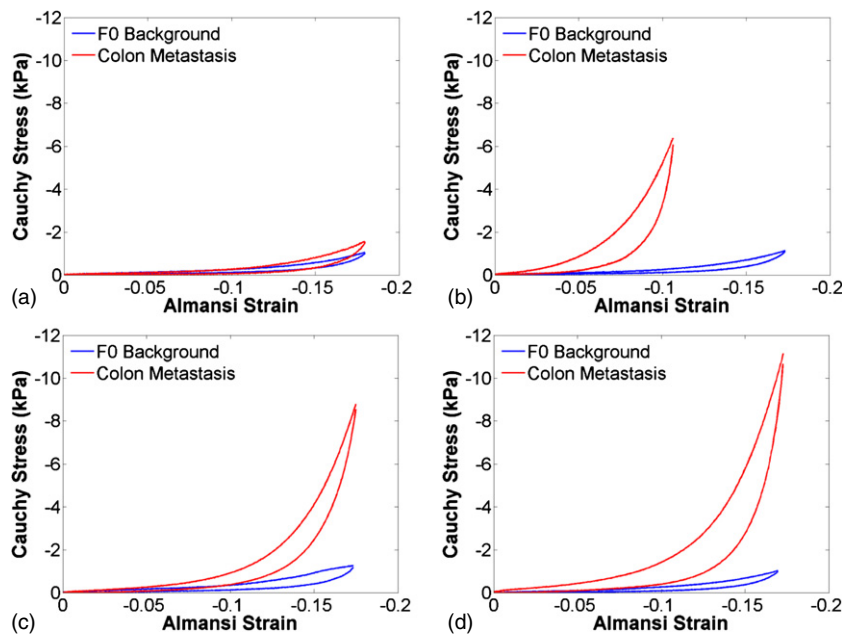


**Figure 8.** Effects of frequency on colon metastases and surrounding background viscoelastic properties ( $n = 6$ ). Graphs present the storage modulus (a), modulus contrast (b),  $\tan(\delta)$  (c) and  $\tan(\delta)$  contrast (d) for the 1%–3% and 6%–8% compression ranges. The storage modulus of colon metastases was significantly higher than the background for all precompression levels at all frequencies ( $\dagger, p < 0.05$ ;  $\ddagger, p < 0.001$ ). Increases in frequency increased the storage modulus and  $\tan(\delta)$  ( $^*, p < 0.05$ ;  $^{**}, p < 0.001$ ). The storage modulus and  $\tan(\delta)$  contrast in colon metastases remained relatively constant with increases in frequency. Note that symbols to the left of the asterisks indicate statistical significance only i.e. they are not actual data points.



**Figure 9.** Third ramp testing cycle of a hepatocellular carcinoma and surrounding F0 background tissue compressed up to 20%. Interestingly, the background tissue strain-hardened faster than the primary tumour.

We acquired only one of several types of the lesions that were tested, including a benign adenoma, gastrointestinal stromal tumour metastasis, and neuroendocrine metastasis. All three were comparably stiff, which may suggest that some tumours are difficult to differentiate based



**Figure 10.** Third ramp testing cycle of colon metastases and surrounding *F0* background tissue compressed up to 20% ( $n = 4$ ). There was significant variability in the strain-hardening of the colon metastases that were tested (a–d). However, in all cases, the secondary tumour hardened faster than the background tissue.

on stiffness information. However, only one sample was obtained for each case, which makes generalized conclusions difficult. Acquiring more samples would have been ideal, but the probability of acquiring more of these less common cancer types was low; only one of these cancer types was acquired over the duration of this three and a half year study.

Both HCCs and colon metastases showed similar frequency-dependent behaviour. The storage modulus and  $\tan \delta$  increased with increasing frequency, following the expected trend. However, the stiffness of the tumour and background tissue at all frequencies remained relatively constant, having little effect on the observed contrast. This may not be true of higher testing frequencies, which is applicable to radiation-force-based elastography approaches that operate in the range of 50–400 Hz (Muller *et al* 2009, Sandrin *et al* 2003). We did not estimate the viscoelastic tissue properties at higher frequencies through the course of this study. Future studies should investigate what, if any, effect higher frequencies have on the tumour-to-background contrast.

The tumour-to-background contrast for all tumour types changed little up to 6% precompression. Ramp testing elucidated the strain-hardening behaviour of the tissue at higher levels of compression. Interestingly, the contrast decreased in the HCC that was tested. That is, it became softer relative to the background, which is likely the result of the stiff fibrotic tissue in the background. Colon metastases were all strain-hardened faster than the corresponding background but at different rates. Strain-hardening may be useful to increase the tumour-to-background contrast in secondary tumours, but achieving a high enough level of compression may be difficult in a clinical setting. Additionally, the compression will strain-harden the overlying layers of tissue, which may obscure rather than clarify the image. Adding a specified amount of compression by hand is also difficult to control or quantify, decreasing the value of the quantitative stiffness estimates obtained.

There are inherent limitations to *ex vivo* experiments. Some have shown differences between *ex vivo* and *in vivo* measurements, which may result from tissue degradation over time (Chatelin *et al* 2011). However, in this study, we tested tissue samples soon after removal from the patient, which minimized this effect. *In vivo* tissue is also actively perfused, which has been shown to affect the observed tissue stiffness (Kerdok *et al* 2006), but perfusing the small tissue samples ( $\sim 1 \text{ cm}^3$ ) that we obtained would have been impossible. These two factors should be considered, but both the lesion and background absolute stiffness may change at the same rate. That is, the tumour-to-background contrast may be the same regardless of whether the stiffness was measured *ex vivo* or *in vivo*, despite absolute differences in the tumour and background tissue. In future studies, it would be beneficial to use a quantitative stiffness imaging modality to quantify tumour and background stiffness before resection, followed by *ex vivo* dynamic testing after resection. However, during the course of this study, these systems were not available to us.

We have characterized the viscoelastic properties of human primary and secondary cancers via mechanical testing, which few previous studies have quantified. The tumour-to-background contrast was much lower in primary than in secondary cancers. This observation may prove beneficial if stiffness maps of hepatic malignancies can be visualized in a repeatable manner. With the advent of new imaging modalities that can quantify the elasticity in tumour and background tissue noninvasively, this may soon be a clinical reality.

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