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# Association of breast cancer risk, density, and stiffness: global tissue stiffness on breast MR elastography (MRE)

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# Abstract

#### Code availability N/A.

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**Ethical approval** The study was approved by our research institutional review board. The study was performed in accordance with the ethical standards as laid down in the 1964 Declaration of Helsinki and its later amendments or comparable ethical standards.

Consent to participate Informed consent was obtained from all individual participants included in the study.

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**Purpose**—Quantify in vivo biomechanical tissue properties in various breast densities and in average risk and high-risk women using Magnetic Resonance Imaging (MRI)/MRE and examine the association between breast biomechanical properties and cancer risk based on patient demographics and clinical data.

**Methods**—Patients with average risk or high-risk of breast cancer underwent 3.0 T breast MR imaging and elastography. Breast parenchymal enhancement (BPE), density (from most recent mammogram), stiffness, elasticity, and viscosity were recorded. Within each breast density group (non-dense versus dense), stiffness, elasticity, and viscosity were compared across risk groups (average versus high). Separately for stiffness, elasticity, and viscosity, a multivariable logistic regression model was used to evaluate whether the MRE parameter predicted risk status after controlling for clinical factors.

**Results**—50 average risk and 86 high-risk patients were included. Risk groups were similar in age, density, and menopausal status. Among patients with dense breasts, mean stiffness, elasticity, and viscosity were significantly higher in high-risk patients (N= 55) compared to average risk patients (N= 34; all p < 0.001). Stiffness remained a significant predictor of risk status (OR = 4.26, 95% CI [1.96, 9.25]) even after controlling for breast density, BPE, age, and menopausal status. Similar results were seen for elasticity and viscosity.

**Conclusion**—A structurally based, quantitative biomarker of tissue stiffness obtained from MRE is associated with differences in breast cancer risk in dense breasts. Tissue stiffness could provide a novel prognostic marker to help identify high-risk women with dense breasts who would benefit from increased surveillance and/or risk reduction measures.

### Keywords

Breast cancer risk; Dense breasts; Breast tissue stiffness; Breast MR imaging; Breast elastography; Breast stroma

# Introduction and background

Fifty percent of screening-eligible women have high mammographic breast density (MBD). MBD is a strong risk factor for breast cancer, with a four to sixfold increased risk in women with dense tissue compared to those with minimal dense tissue [1]. As such, increased areas of breast density may be more susceptible to the initiation and promotion of breast cancers. However, breast cancer risk is not elevated across all women with dense breasts uniformly [2].

Because half of all women have dense breast tissue, there is significant interest in developing imaging biomarkers to improve personalized risk stratification and identify which women with dense breasts are, in fact, at elevated risk for breast cancer. Doing so will enable appropriate imaging surveillance, reduce unnecessary additional screening, and enable effective risk-reducing strategies for women with dense breasts.

Studies have shown that the variation in the risk associated with breast density may be related to differences in the breast microenvironment at a microscopic level [3–6]. More recently, studies using quantitative proteomics, collagen analyses, and mechanical

measurements have demonstrated that mammographically dense tissues have varying levels of collagen density, breast stroma stiffness, and epithelial cell density [7–9]. These mechanical properties of tissue play a major role in the development and progression of disease states and have been studied in multiple parts of the body [10–12]. Preliminary studies, performed in vitro, in animal models, or in small numbers of patients (livers and other organs), show this hypothesis to be true and also valid in relation to breast cancer development. An in vivo study in mice [13] demonstrated a causal link between increased stroma collagen deposition and enhanced tumorigenesis, local invasion, and metastases. These interactions may, in turn, affect oncogenesis and contribute to increased cancer risk in dense breasted women [4, 14, 15].

With the advent of MR elastography, quantitative biomechanical properties, such as tissue stiffness, elasticity and viscosity, have become viable imaging biomarkers to better understand the tissue microenvironment of patients in vivo [16–19]. Magnetic resonance elastography (MRE) is a safe and novel non-invasive imaging technique to quantitatively assess the mechanical properties of soft tissues using MR imaging. It assesses the viscoelastic shear properties of lesions through direct MR visualization of acoustic waves and demonstrates decreased elasticity in malignant tumors. The key component of elasticity imaging is to characterize the tissue response to the stress. In general, MRE imaging consists of the following steps: (1) Deliver shear waves in the tissues to be imaged; (2) Measure tissue displacement; (3) Generate quantitative stiffness maps (elastograms). As such, MRE allows an objective, quantitative analysis of the viscoelastic properties of average and diseased breast tissues, providing greater insight into the study of and treatment of breast cancer and may be used to differentiate which dense breasts will go on to develop cancer. We hypothesize that the distinctive biomechanical properties of microenvironments can be assessed by MRE, and may account for the varying risk patterns for breast cancer in patients with similar densities. In this study, we will quantify in vivo biomechanical tissue properties, such as breast stiffness, elasticity and viscosity, in various breast densities in both average risk and high-risk women using Magnetic Resonance Imaging (MRI)/MRE. We will also examine the association of biomechanical properties of the breast with cancer risk based on patient demographic and clinical data.

# Materials and methods

#### Patients

In this institutional review board-approved prospective single-institution study, we recruited two groups of women with all breast densities with different breast cancer risks to undergo a 3.0 T dynamic contrast-enhanced MRI/MRE of the breast. Average risk women were defined as having no personal history of breast cancer, no prior high-risk breast biopsies, no self-reported significant family history of breast cancer, and a negative mammogram within 12 months (Table 1). Average risk patients were at least 35 years old, not pregnant, not breastfeeding, had no imaging abnormality on mammography or sonography (Breast Imaging Reporting and Data System [BI-RADS] 1 or 2), and had no contraindications to MRI or contrast agents. These patients enrolled in the trial received a research-only MRI with MRE.

High-risk breast cancer patients were recruited from patients who received standard of care breast MR for routine evaluation (patients with prior breast cancer history or those who were deemed at lifetime risk of 20% or greater based on Tryir Czuick scores [20–23]). All prospectively collected patients provided informed written consent. High-risk patients were at least 26 years of age, not pregnant, not breastfeeding, had no imaging abnormality on mammography or sonography (Breast Imaging Reporting and Data System [BI-RADS] 1 or 2), and had no contraindications to MRI or contrast agents.

Exclusion criteria were incomplete examinations and technical failures.

#### Imaging

All patients received combined 3-T multiparametric contrast-enhanced breast MRI and breast elastography.

#### **Breast MRE protocol**

Our breast MRE exam is naturally integrated into the established breast CEMRI / MRI clinical protocol, avoiding the need to switch RF coils or reposition patients. Our current breast MRE protocol was previously published [24], and the breast MRE sequence is added at the conclusion of the clinical portion of the exam.

The breast MRE protocol is performed using a gradient echo phase contrast sequence [25]. A pillow-like passive driver is positioned between the breasts under the sternum while the patient lies prone in a standard breast coil [24]. Low-frequency vibrations of 40 Hz are transmitted to the passive driver from an active driver (Resoundant, Inc., Rochester, MN) located outside the scan room during the entire duration of image acquisition (5–7 min). Breast MRE data are obtained from 40 axial slices, centered at the breast along the superior-inferior direction. A modified 3D-GREMRE pulse sequence is used with the following major parameters [9]: vibration frequency = 40 Hz; FOV x/y/z = 38.4/38.4/12 cm; flip angle = 8°; TR = 22.2–22.9 ms, TE = 15.9–18.1 ms (fat/water in-phase); axial bilateral imaging plane; matrix = 96 × 96 × 30; 8 motion cycles per 9 TRs (3 phase offsets); motion sensitivity (MENC) = 12.3 micron/radian; motion encoding directions = x/y/z; scan time = 5'25''-5'42'' (free breathing). 3D wave images are processed with 3D multiple-model direct inversions without directional filtering, generating 3D elastograms of bilateral breasts.

#### **Breast MRE measurements**

Regions of interest are then drawn over the central slice (at the level of the nipple) and custom, in-house software is used to obtain MRE stiffness values. Quantitative breast stiffness and viscosity measurements were obtained as described previously [24] by drawing the whole breast region of interest (ROI) around the breast tissue (at the center slice). This was drawn on the magnitude images, which demonstrate anatomy the best. The wave images were analyzed to assess the adequacy of wave penetration through breast tissue. The ROI was then copied and translated onto the stiffness and viscosity maps to obtain the global breast MRE measurement.

#### Multiparametric breast MRI

A dynamic contrast-enhanced image set was also acquired, with the first series being an unenhanced fat-saturated gradient-recalled echo T1-weighted sequence (VIBRANT) followed by three dynamic contrast-enhanced fat-saturated T1-weighted gradient-recalled echo series (VIBRANT) performed after IV administration of Gadobutrol (Gadavist, Bayer) at 30 s, 3 min and 6 min with the use of a T1-weight-based dosing protocol. The dynamic contrast images were acquired in the sagittal orientation (TR/TE = 5.1/2.4 ms; matrix =  $256 \times 256$ ). Automatic post-processing included the generation of subtraction images between pre- and post-contrast images produced after each phase. Late gadolinium fat-suppressed T1- weighted fast-spoiled-gradient-echo (FSPGR) sequences were also acquired for both right and left sides separately in the axial orientation (TR/TE = 115/3.15 ms; matrix =  $256 \times 192$ , NEX = 2). T2 weighted sagittal and T1 weighted FSE AX images were obtained pre-contrast.

#### Statistical analysis

In both the average risk and high-risk groups, the following breast imaging features were recorded: breast parenchymal enhancement (BPE) (from clinical breast MR imaging report); breast density (from most recent clinical MG report); tissue stiffness, elasticity, and viscosity. Breast background parenchymal enhancement was routinely assessed on a BIRADS scale [26] (minimal, mild, moderate, marked) by standard of care within the imaging reports by one of five breast fellowship trained radiologists. Patient demographic and disease characteristics were summarized for the full sample and by risk status; comparisons were conducted across risk groups (average versus high) using two-sample t-tests (for continuous variables) or Fisher's exact test (for categorical variables). Breast stiffness, elasticity, and viscosity were averaged across the left and right breasts. If breast stiffness, elasticity, or viscosity was missing for one breast, then the value observed for the contralateral breast was used. For the full sample and within each breast density group (non-dense versus dense), two-sample *t*-tests allowing for unequal variances were conducted to compare breast stiffness, elasticity, and viscosity across risk groups (average versus high). Separately for breast stiffness, elasticity, and viscosity, a multivariable logistic regression model was used to evaluate whether the MRE parameter predicted risk status after controlling for clinical factors. A nominal significance level of a = 0.05 was used for all analyses.

# Results

#### Patients

From February 2017 to November 2019, 57 average risk and 86 high-risk patients were recruited to the study. Of the 57 average risk patients, 50 who met the inclusion criteria were included in the average risk portion of the study (mean age = 55.6 years, range = 39.0-74.0; Table 1); 2 were excluded for incomplete examinations, and 5 were excluded for technical failures. All 50 average risk patients had breast stiffness, elasticity, and viscosity data available for both breasts. Eighty-six patients who fulfilled the inclusion criteria were included in the high-risk portion of the study (mean age = 53.6 years, range = 26.0-76.0;

Table 1). Of these 86 high risk patients, 82 had breast stiffness, elasticity, and viscosity data available for both breasts, and 4 had these data available for one breast.

As shown in Table 1, average risk and high-risk women did not significantly differ in their mean age (mean age = 55.6 vs. 53.6 years, p = 0.27), density (68.0% vs. 64.0% dense breasts, p = 0.71), or menopausal status (66.0% vs. 69.8% were post-menopausal, p = 0.70).

# **Breast MRI BPE measurements**

Background parenchymal enhancement was stratified into two cohorts on MRI (minimal or mild versus moderate or marked) and did not significantly differ between the average risk and high-risk cohorts, p = 0.56.

#### **Breast MRE measurements**

Quantitative breast stiffness and viscosity measurements were significantly higher in the high-risk dense breast cohort (N= 55) compared to that of the average risk dense breast cohort (N= 34; all p < 0.001) (Figs. 1, 2). The means were not significantly different between those with dense versus non-dense breasts in the average risk patient cohort (p = 0.14 for breast stiffness, p = 0.78 for breast viscosity; Table 2). Similarly, the means were not significantly different between those with dense versus non-dense breast sin the high-risk patient cohort (p = 0.09 for breast stiffness, p = 0.13 for breast viscosity; Table 2, Fig. 3). In the 40 women who had a prior breast surgery or biopsy on one breast but not the other, breast stiffness did not significantly differ between the surgerized or biopsied breast versus contralateral breast (Table 3, Figs. 4 and 5).

In the multivariable logistic regression model, breast stiffness remained a significant predictor of risk status (OR = 4.26, 95% CI [1.96, 9.25]) even after controlling for breast density, MRI BPE, age, and menopausal status. Similar results were seen for breast elasticity (OR = 4.88, 95% CI [2.08, 11.43]) and viscosity (OR = 11.49, 95% CI [1.15, 114.89]).

# Discussion

The most striking results in our prospective study to understand global breast stiffness in average and high-risk patients is the significantly higher stiffness of breast tissue in the high-risk (prior breast cancer history or high risk based on lifetime risk of greater than 20%) dense breasted patients compared to the average risk dense breasted patients. This finding held true even for the patients that had prior unilateral post-operative and/or post-treatment related radiation change as the affected/treated breast did not show a significant difference in MRE parameters between unaffected/untreated breast. Our study suggests that the structurally based (tissue stiffness) risk information obtained from MRE could be used to identify the subset of women with dense breasts most likely to benefit from increased surveillance and serve as a prognostic biomarker in screening breast cancer patients. These differences in stiffness were also seen between high-risk and average risk patients with non-dense breasts, although it is less clinically significant as the performance of screening mammography is better in non-dense breasts.

Through translational studies [27, 28], one biologic explanation for the increased risk of breast cancer in dense breasted patients suggests that increased collagen deposition, tissue tensile strength and collagen structural differences may contribute to increased mammographic density, which then is associated with breast cancer initiation [4, 7, 14, 15, 14, 15]. In fact, increasing evidence indicates that the tumor microenvironment plays a critical role in regulating the biologic behavior of, and predisposition to breast cancer [36, 37]. Recent studies have shown that organization and stiffness of the collagen matrix are important in mediating tumor growth and invasion [3, 4, 28, 3, 4]. Abnormal changes in the amount and organization of extracellular matrix lead to altered biochemical, physical, and biomechanical properties of tumor-associated ECM that contribute to tumor progression [41, 42].

In a similar light, a 2002 study investigated the feasibility of MRE to distinguish malignant and benign properties of breast tissue. Analysis of MR elastograms using a 65 Hz frequency on 20 female patients with malignant and benign breast lesions and 15 healthy volunteers as the control demonstrated that cancerous growths consistently demonstrated higher elasticity values (greater stiffness) in contrast to surrounding tissue. In fact, quantitatively, the stiffness value of breast carcinomas was, on average, 418% higher than the value of the adjacent tissues (p < 0.05) [43]. Malignant breast tumors measured a median stiffness of 15.9 kPa, while adjacent breast parenchyma and fatty tissue measured a median of only 2.5 and 2.0 kPa, respectively. Furthermore, the difference in stiffness between malignant and benign tumors was also evident through MRE, where benign breast lesions were determined to be at a median value of 7.0 kPa. The differing values of malignant tumors, benign tumors, and surrounding breast tissue illustrate that MRE as an imaging technique has promise to differentiate between benign and malignant disease processes, and therefore demonstrates clinical value [43–45].

Clinically, we know that over 40% of our breast cancer screening patients have dense breasts [46]. As a result of relatively new dense breasts notification laws, these patients are now being told that they have dense breast tissue (which could result in decreased sensitivity of mammography screening and increase their risk of breast cancer). Providers are encouraged to discuss these details with patients and, where appropriate, offer various forms of supplemental dense breast screening [47–49]. These supplemental screening examinations can find additional cancers; however, they also result in increased false positive results [23, 50, 51]. Since the risks and benefits of a screening test are functions of each patient's density features and risk factors, personal screening. Personalized breast cancer screening algorithms will result in cost efficiencies [52–57] and reduced false positive rates. As such, our data are promising, whereby imaging biomarker of global breast tissue stiffness could provide an additional component in a clinical decision-making tool to guide providers of screening and risk-reduction measures based on patient values and preferences.

In our study, we observed a nonsignificant increase in stiffness in both the dense and non-dense breasts. These observed differences with increasing stiffness with density are consistent with other smaller studies [58–60]; however the lack of a statistical significance is unique in our study. It should be noted that our study had few cases included along

the extreme spectrum of breast densities, fatty (n = 1) and extremely dense (n = 3) in our average risk cohort, which may be affecting our results of statistical significance. Also, it should be noted in our study, that we chose to use the central slice as a first step to assess global 3D MRE values and used a 40 Hz frequency on a 3 T scanner. The region of interest included the central breast tissues, including fatty tissue and breast parenchyma on the slice, sparing the edges. This technique is similar to the annotations drawn and lessons learned on clinical diagnostic liver MRE. Contrast this technique to that of a 2017 study that demonstrated that dense breasts had significantly higher stiffness measurements compared with non-dense breasts  $(p < 0.05 \ [60])$  the authors used a 60 Hz frequency on the 3 T scanner, which requires less power for penetration. We speculate that the stiffness is highly dependent on the measurement method and the tissues that are covered.

Limitations within our study highlight the need for further inquiry to fill the gaps of current research before implementation in clinical practice. Our study is one of the largest to date; other published breast MRE studies have been performed using a small sample cohort of approximately 20 to 50 patients, limiting the representation of breast tissue density. In addition, the high-risk volunteers used for testing the efficacy of MRE had included those with a personal history of breast cancer, making it difficult to extrapolate the results to the general screening population. Thus, future research should aim to encompass a larger set of patients to account for individual differences in breast tissue and a variety of lesion characteristics. Given the current study is based on self-reported family history of breast cancer rather than including patients who went on to develop breast cancer, in future trials, we will also plan to calculate lifetime and 5-year risks for patients based on accepted clinical breast cancer risk models [61–63] and follow patients who go on to develop breast cancer. Doing so will allow us to have more accurate correlations to lifetime risk rather than the current stratification provided here. Another limitation is the fairly homogenous demographics of the patient population in this study. Therefore, adding demographic variation to the population will be of utmost interest, given the variations seen in breast density based on racial differences [64-66]. Also, future studies should include computergenerated volumetric breast density from MG to classify patients as dense or non-dense, given the considerable inter- and intra-reader variability within the mammographic density reporting system [67, 68]. As MRE protocols continue to evolve and develop, standardized protocols with multi-institutional trials will be necessary to ensure generalizability of MRE results.

As a more personalized approach within the breast cancer screening regimen develops, further risk stratification using quantitative imaging biomarker of global breast stiffness could inform more effective personalized screening regimens. We anticipate the results of this study will give light to more investigations on how tissue stiffness correlates with breast cancer risk and prognosis. These prior studies and our results provide support for the further study of MRE given its ability to assess the viscoelastic properties of breast tumors and the surrounding tissue [69–71]. While the studies on MRE's application to in vivo breast tissue are limited, this trial substantiates the capabilities of MRE and its potential for a risk stratification tool in women with dense breasts.

# Conclusions

In conclusion, our work above suggests structurally based, quantitative biomarker of tissue stiffness obtained from global 3D breast MRE could provide a novel prognostic marker used to identify the subset of high-risk women with dense breasts. As such, a stiffness values could help stratify dense breasted patients into those who are at elevated risk and would benefit from increased surveillance with supplemental imaging techniques and/or risk reduction measures.

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# Data availability

The imaging data were stored on a shared internal drive between the authors. The datasets generated during and/or analyzed during the current study are available from the corresponding author on reasonable request.

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### Fig. 1.

The 50-year-old average risk female with **a** dense breasts on negative screening mammography, **b** post-contrast breast MRI was negative for imaging abnormalities, mild bilateral benign background parenchymal enhancement, **c** MR magnitude map demonstrates anatomical anatomy to delineate central slice **d** corresponding elastogram map shows mild symmetric bilateral stiffness ranging within 0.5–1.0 kPa



# Fig. 2.

The 41-year-old female with a significant history of a maternal aunt with BRCA 2 mutation carrier, maternal history of breast cancer, IBIS model 29% **a** dense breasts on negative screening mammography, **b** post-contrast breast MRI was negative for imaging abnormalities, mild bilateral benign background parenchymal enhancement, **c** MR magnitude map demonstrates anatomical anatomy to delineate central slice **d** corresponding elastogram map shows mild symmetric bilateral stiffness ranging within 2.0–4.0 kPa



# Fig. 3.

Box and whisker plot of breast stiffness (averaged across the left and right breasts) by breast density and risk status. High-risk patients with dense breasts had greater breast stiffness compared to average risk patients with dense breasts. The box represents the interquartile range, the horizontal line within each box represents the median, and the diamond within each box represents the mean



### Fig. 4.

Box and whisker plot of breast stiffness (averaged across the left and right breasts) by biopsy/surgery in high risk patients. 24 high-risk women with dense breasts and no biopsy/surgery and 30 high-risk women with dense breasts and biopsy/surgery in either or both breasts. The horizontal line within each box represents the median, and the diamond within each box represents the mean. The breast stiffness median = 1.34 versus 2.56 in the no biopsy/surgery versus biopsy surgery group. The breast stiffness mean = 1.92 versus 2.35 in the no biopsy/surgery versus biopsy surgery group. These means were not significantly different



#### Breast Stiffness in Women with One Biopsied/Surgerized and One Unaffected Breast

# Fig. 5.

Stiffness of surgerized/unafected breast scatterplot. The blue markers represent average risk women, and the red markers represent high-risk women. The diagonal line represents perfect agreement for stiffness between a woman's biopsied/surgerized breast and unafected breast

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Table 1

Patient demographic characteristics by risk status

Characteristic	Average risk $(N = 50)$	High risk $(N = 86)$	Total $(N = 136)$	<i>p</i> -value <sup>a</sup>
Age in years (mean, SD)	55.6 (10.2)	53.6 (11.3)	54.3 (10.9)	0.27
Breast density (#, % dense)	34 (68.0%)	55 (64.0%)	89 (65.4%)	0.71
Prior breast cancer (#, % yes)	0 (0.0%)	28 (32.6%)	28 (20.6%)	
Biopsy-proven high risk lesion (#, % yes)	0 (0.0%)	12 (14.0%)	12 (8.8%)	
Biopsy or surgery in either breast (#, % yes)	7 (14.0%)	50 (58.1%)	57 (41.9%)	< 0.001
Menopausal status (#, % post-menopausal)	33 (66.0%)	60 (69.8%)	93 (68.4%)	0.70
On hormone replacement therapy (#, % yes)	5(10.0%)	8 (9.3%)	13 (9.6%)	> 0.999
First degree relative with breast cancer (#, % yes)	0 (0.0%)	64 (74.4%)	64 (47.1%)	

<sup>4</sup>For age in years, the *p*-value was based on a two-sample *f*-test allowing for unequal variances. For all other patient demographic and disease characteristics, the *p*-value was based on Fisher's exact test. Em dashes indicate that the *p*-value was not calculated because high-risk status was defined by prior breast cancer, biopsy-proven high-risk lesion, and family history of breast cancer

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# Table 2

Magnetic resonance elastography (MRE) parameters and Magnetic Resonance Imaging (MRI) background parenchymal enhancement (BPE) by risk status and breast density

Characteristic	Average risk			High risk		
	Non-dense $(N = 16)$	<b>Dense</b> $(N = 34)$	<i>p</i> -value <sup><i>a</i></sup>	Non-dense $(N = 31)$	Dense $(N = 55)$	<i>p</i> -value <sup><i>a</i></sup>
Breast stiffness			0.14			0.09
Mean $(SD)$	1.07 (0.18)	1.16 (0.21)		1.69 (1.19)	2.14 (1.12)	
Median (range)	1.05 (0.65–1.44)	1.15 (0.76–1.67)		$1.09\ (0.54-4.36)$	1.37 (0.92-4.09)	
Breast elasticity			0.01			0.06
Mean (SD)	0.96 (0.15)	1.10 (0.20)		1.57 (1.08)	2.03 (1.08)	
Median (range)	0.96 (0.61–1.21)	1.10 (0.74–1.58)		$1.03\ (0.52 - 3.85)$	1.32 (0.74–3.99)	
Breast viscosity			0.78			0.13
Mean $(SD)$	0.23 (0.09)	0.23 (0.07)		0.26 (0.27)	0.35 (0.24)	
Median (range)	0.23(0.08-0.39)	0.23 (0.11–0.44)		0.20 (0.0–1.39)	0.27 (-0.05-1.05)	
BPE (#, % minimal or mild)	14 (87.5%)	20 (58.8%)	0.06	28 (90.3%)	35 (63.6%)	0.01

<sup>a</sup>For breast stiffness, elasticity, and viscosity, the *p*-value was based on a two-sample *t*-test allowing for unequal variances. For BPE, the *p*-value was based on Fisher's exact test

#### Table 3

Breast stiffness in patients with 1 surgerized breast and 1 unaffected breast

Patient group	N	Breast stiffness me	<i>p</i> -value <sup><i>a</i></sup>	
		Unaffected breast	Surgerized breast	
Average risk	7	1.07 (0.12)	1.07 (0.15)	_
High risk	33	2.33 (1.23)	2.22 (1.17)	-
Total	40	2.11 (1.21)	2.02 (1.15)	0.14

<sup>a</sup>The *p*-value was based on a paired *t*-test comparing breast stiffness in the unaffected versus surgerized breast. The sample was limited to patients who underwent biopsy or surgery on one breast but not the other