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### Permalink

<https://escholarship.org/uc/item/0dx1k98w>

### Journal

Radiology, 304(1)

### ISSN

0033-8419

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### Publication Date

2022-07-01

### DOI

10.1148/radiol.211131

Peer reviewed

# Direct Comparison of Quantitative US versus Controlled Attenuation Parameter for Liver Fat Assessment Using MRI Proton Density Fat Fraction as the Reference Standard in Patients Suspected of Having NAFLD

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Supported by National Institute of Diabetes and Digestive and Kidney Disease (R01DK106419) and Siemens Healthineers.

Conflicts of interest are listed at the end of this article.

See also the editorial by Ito in this issue.

Radiology 2022; 304:75–82 • <https://doi.org/10.1148/radiol.211131> • Content codes: **GI** **US**

**Background:** MRI-derived proton density fat fraction (PDFF) is an accurate, reliable, and safe biologic marker for use in the noninvasive diagnosis of hepatic steatosis in patients with nonalcoholic fatty liver disease (NAFLD). Because of the cost and limited availability of MRI, it is necessary to develop an accurate method to diagnose NAFLD with potential point-of-care access.

**Purpose:** To compare the diagnostic accuracy of the quantitative US (QUS) fat fraction (FF) estimator with that of the controlled attenuation parameter (CAP) in the diagnosis of NAFLD using contemporaneous MRI-derived PDFF as the reference standard.

**Materials and Methods:** Participants with or suspected of having NAFLD were prospectively recruited at the NAFLD Research Center between July 2015 and July 2019. All participants underwent MRI-derived PDFF measurement, transient elastography with CAP measurement, and QUS. QUS FF was derived using computed QUS parameters from the acquired radiofrequency US data using a calibrated reference phantom. The area under the receiver operating characteristic curve (AUC) was calculated to assess the accuracy of QUS FF and CAP in the diagnosis of hepatic steatosis (defined as MRI-derived PDFF  $\geq$  5%). AUCs were compared using the DeLong test.

**Results:** A total of 123 participants were included (mean age, 52 years  $\pm$  13 [SD]; 67 [54%] women). Of these participants, 100 (81%) had MRI-derived PDFF of 5% or more. QUS FF had a significantly higher AUC for diagnosis of NAFLD than did CAP (0.92 [95% CI: 0.87, 0.98] vs 0.79 [95% CI: 0.67, 0.90],  $P = .03$ ). QUS FF had a sensitivity of 98% (98 of 100) and a specificity of 48% (11 of 23). CAP had a sensitivity of 87% (87 of 100) and a specificity of 57% (13 of 23).

**Conclusion:** The quantitative US fat fraction estimator is more accurate than the controlled attenuation parameter in the diagnosis of hepatic steatosis in patients with or suspected of having nonalcoholic fatty liver disease.

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Online supplemental material is available for this article.

Nonalcoholic fatty liver disease (NAFLD), the most common chronic liver disease in the United States, is defined as the presence of hepatic steatosis of 5% or more at imaging or histologic analysis, without secondary causes of fat deposition (1). Although MRI-derived proton density fat fraction (PDFF) is considered the reference standard with which to detect and quantify liver fat in clinical trials, it is limited as a large-scale screening modality by its cost and lack of availability (2). Ideally, a modality should be noninvasive and accurate and offer point-of-care access to detect NAFLD and clinically assess hepatic steatosis in patients with NAFLD (3).

Conventional US is the most common image-based modality used for NAFLD assessment because of its wide availability and low cost (4). However,

conventional US is limited by its lack of quantitative accuracy and reproducibility due to operator dependence (5). Mild steatosis (on the order of 5% of patients) can be misdiagnosed because of often-encountered concomitant obesity (6).

When compared with conventional US, controlled attenuation parameter (CAP) and quantitative US (QUS) offer greater quantitative accuracy while still providing potential for point-of-care access (7). CAP, measured with a vibration-controlled transient elastography device, enables rapid assessment of steatosis and liver fibrosis (8). CAP has been shown to correlate with histologic grading of hepatic steatosis (9,10); however, the optimal cutoff values using CAP vary substantially across studies and are not standardized (7,11).

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## Abbreviations

AUC = area under the ROC curve, CAP = controlled attenuation parameter, FF = fat fraction, NAFLD = nonalcoholic fatty liver disease, PDFF = proton density FF, QUS = quantitative US, ROC = receiver operating characteristic

## Summary

The quantitative US fat fraction estimator using the Lizzi-Feleppa midband and envelope statistic was more accurate than the controlled attenuation parameter in the diagnosis of nonalcoholic fatty liver disease and quantification of liver fat content.

## Key Results

- In this prospective study of 123 participants to assess nonalcoholic fatty liver disease (MRI-derived proton density fat fraction [PDFF]  $\geq 5\%$ ), the quantitative US fat fraction (FF) estimator had an area under the receiver operating characteristic curve (AUC) of 0.92, higher than the AUC of 0.79 for controlled attenuation parameter (CAP) ( $P = .03$ ).
- For detection of an MRI-derived PDFF of 10% or more, the quantitative US FF estimator had an AUC of 0.90, higher than the 0.75 for CAP ( $P = .001$ ).

QUS has been developed to overcome the qualitative nature of US B-mode imaging (12). QUS uses techniques, such as spectral analysis, envelope statistics of backscattered signals, or speed of sound, to quantify liver fat and was shown to have high interexamination repeatability and high intersonographer and interscanner reproducibility (13–15). Recently, QUS fat fraction (FF) estimator, derived from QUS parameters such as Lizzi-Feleppa midband and envelope statistics, has been developed to enable direct conversion from QUS to corresponding liver FF (16).

Both QUS and CAP provide potential point-of-care diagnosis of NAFLD; however, the comparative accuracy of these modalities in the diagnosis of NAFLD in patients at risk for NAFLD is not known. Thus, this study aims to compare the diagnostic accuracy of the QUS FF estimator with that of CAP in the detection of hepatic steatosis in a well-characterized prospective cohort of participants suspected of having NAFLD using contemporaneous MRI-derived PDFF as the reference standard. We also evaluated diagnostic accuracy in the detection of MRI-derived PDFF of 10% or more, a common eligibility criterion for nonalcoholic steatohepatitis–related pharmacologic trials.

## Materials and Methods

This was a Health Insurance Portability and Accountability Act–compliant and institutional review board–approved prospective cross-sectional study that included a well-characterized cohort with or suspected of having NAFLD. Our study was supported in part by Siemens Healthineers through a research grant and a US scanner loaned to the University of California at San Diego. The authors controlled the information submitted for publication.

## Study Design

Participants were consecutively recruited at the NAFLD Research Center between July 2015 and July 2019 [R.L. >10

years of experience]. Some participants in the current study (62 of 123 [50%]) were part of a previously reported study (16) that aimed to establish a QUS NAFLD classifier and QUS FF estimator. Written informed consent was obtained before participants were enrolled in this institutional review board–approved study.

All participants underwent a standardized research visit that included detailed medical history taking, physical examination, and anthropometric measurement. All participants were assessed with MRI-derived PDFF, QUS, and CAP to quantify liver fat. Those who were not able to complete all MRI-derived PDFF, QUS, and CAP assessments were excluded from the study. The median interval between QUS and MRI-derived PDFF was 0 days (IQR, 0–12 days). The median interval between CAP and MRI-derived PDFF was 14 days (IQR, 4–34 days).

## Inclusion and Exclusion Criteria

Participants aged at least 18 years who had or were suspected of having NAFLD were included in the study. Participants who met any of the following criteria were excluded from the study: clinical, laboratory, or histologic evidence of liver disease other than NAFLD; substantial alcohol consumption ( $\geq 14$  drinks per week for men,  $\geq 7$  drinks per week for women); use of steatogenic or hepatotoxic medication; inability to undergo MRI (because of claustrophobia, metallic implants, or body circumference exceeding the bore of the MRI scanner); major systemic illnesses; or any other conditions determined by the investigator to affect the participant's ability to adhere to study requirements.

## MRI Protocol

MRI-derived PDFF served as the reference standard, as it provided a quantitative measurement of liver fat content that correlated with liver biopsy steatosis grade (2,17) and MR spectroscopy findings (18). Previous studies also have shown MRI-derived PDFF outperforms US modalities, such as US or CAP, in the quantification of liver fat content, justifying the use of MRI-derived PDFF as the reference standard (6,19). Detailed procedures used to acquire MRI-derived PDFF data are provided in Appendix E1 (online). A trained image analyst (A.S.B., 2 years of experience) who was blinded to QUS and CAP results placed circular regions of interest (radius, 1 cm) in each of the nine Couinaud segments (20,21). Average MRI-derived PDFF values from liver segments five through eight were calculated and used as the reference standard for hepatic fat content to match QUS and CAP data that were obtained from the right hepatic lobe.

## QUS Data Acquisition

QUS liver examinations were performed using a Siemens S3000 (Siemens Healthineers) unit with a 4C1 (1–4 MHz nominal) or 6C1HD (1–6 MHz nominal) transducer by one or two of six registered diagnostic medical sonographers trained in the research protocol. To eliminate potential confounding physiologic effects, participants were asked to fast for 4 hours before the US examination. Each par-

participant underwent at least one same-day scanning session, but some underwent as many as four sessions. The multiple sessions were performed as part of separate studies that assessed the interexamination repeatability and interoperator and interscanner reproducibility of QUS parameter measurements (13,14), which showed that QUS parameter measurements are repeatable and reproducible. A detailed description of QUS data acquisition is provided in Appendix E2 (online).

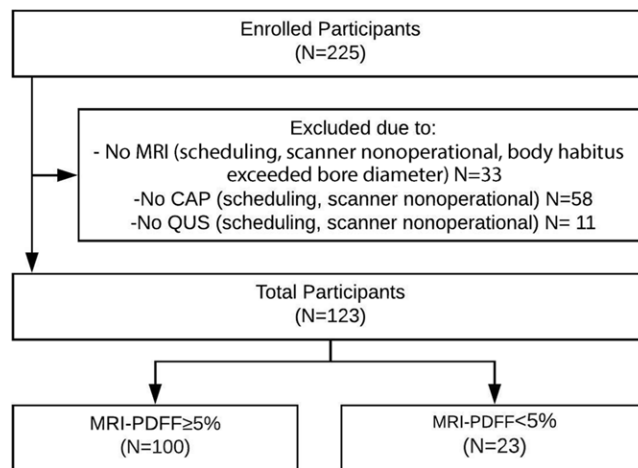
### QUS FF Estimation Derivation

Seven representative QUS parameters (ie, attenuation coefficient, backscatter coefficient, Lizzi-Feleppa slope, intercept, midband fit, and envelope statistics parameters  $k$  and  $\mu$ ) were computed from the acquired radiofrequency US data by using a previously described procedure (16). A detailed explanation of each parameter is provided in Appendix E3 (online). The computation was performed offline by a biomedical engineer (A.H., >10 years of experience) using a custom MATLAB (MathWorks) software tool. QUS parameters were computed using the data corresponding to fields of interest drawn freehand by a trained analyst (A.H., >10 years of experience) within the margins of the liver boundary. For each QUS parameter, five measurements per session were averaged to yield one value (16). When there were data from multiple sessions, only data from the first session were used.

QUS FF was derived according to the procedure previously detailed (16) (Appendix E4 [online]). Briefly, a generalized linear regression model was developed to predict QUS FF using the computed QUS parameters. Stepwise regression was used for parameter selection. QUS- and MRI-derived PDFF data were used for model training, with MRI-derived PDFF being the reference standard. QUS FF data were generated with a leave-one-out cross-validation procedure. For each participant, QUS FF was derived by using the model trained with the QUS- and MRI-derived PDFF data of all other participants. After derivation, each participant was classified as having NAFLD using a QUS FF cut point of 5% or more. QUS FF of 10% or more was used to diagnose MRI-derived PDFF of 10% or more. Additionally, for illustrative purposes, representative parametric QUS FF maps were created, as explained in Appendix E5 (online).

### CAP Measurement

CAP measurements were obtained using a FibroScan 502 Touch device (model 2.0.5; Echosens) and an M Probe or XL Probe by a trained technician (E.M., 3 years of experience) who was blinded to clinical findings and other imaging results. Detailed methods have been described previously (8). Participants were asked to fast for 4 hours before the visit. For the procedure, participants were placed in the supine position with their right arm behind their head and their right leg over their left leg. Then, the technician acquired 10 successful measurements of the right lobe and selected the median value. The technician used the M (3.5 MHz) or XL (2.5 MHz) probe to assess liver fat content. When instructed by the FibroScan device, the XL probe was used. For CAP, cut points of 288 dB/m or more and 306 dB/m or more were



**Figure 1:** Derivation of the study cohort. CAP = controlled attenuation parameter, QUS = quantitative US, PDFF = proton density fat fraction.

used to diagnose NAFLD (defined as MRI-derived PDFF  $\geq 5\%$ ) and MRI-derived PDFF of 10% or more (10), respectively. The sensitivity analysis about the CAP optimal cut points is shown in Appendix E6 (online) and Tables E1 and E2 (online).

### Outcome Measures

The primary outcome was the diagnosis of NAFLD at imaging, as defined by MRI-derived PDFF of 5% or more. The secondary outcome was detection of hepatic fat content of 10% or more, as defined by MRI-derived PDFF of 10% or more. Participants with MRI-derived PDFF of 10% or more have been investigated in this study, as the cut point has been widely used as an enrollment criterion for nonalcoholic steatohepatitis–related pharmacologic trials (NCT03551522, NCT04073368, NCT02912260).

### Statistical Analyses

Receiver operating characteristic (ROC) curve analyses were used to compare the performance of QUS FF with that of CAP in the detection of NAFLD (defined as MRI-derived PDFF  $\geq 5\%$ ) and MRI-derived PDFF of 10% or more. For each ROC analysis, the area under the ROC curve (AUC), sensitivity, specificity, and positive and negative predictive values were calculated. The DeLong test was used to compare the AUCs of QUS and CAP (22). Interquartile range was defined as the difference between the third and first quartiles. Univariate Pearson correlation coefficients were used to calculate the correlations between QUS and MRI-derived PDFF and between CAP and MRI-derived PDFF. Linear regression slope, intercept, and  $R^2$  value were evaluated. Limits of agreement were defined as bias  $\pm 1.96$  [SD]. Ninety percent Winsorization was used to adjust outliers for a CAP and MRI-derived PDFF scatterplot (Appendix E7 [online]) (23). An experienced biostatistician (R.B., >10 years of experience) analyzed the data using SAS software (version 9.4; SAS Institute). Two-tailed  $P \leq .05$  was indicative of a significant difference.

**Table 1: Patient Characteristics**

Characteristic	Total (n = 123)
Age (y)*	52 ± 13
Sex	
Female	67 (54)
Male	56 (46)
BMI (kg/m <sup>2</sup> )*	31.7 ± 4.9
Diabetes mellitus	47 (38)
Race	
White	65 (53)
Hispanic	34 (28)
Asian	20 (16)
Black	4 (3)
MRI result	
MRI-derived PDFF (%)*	13.5 ± 8.7
MRI-derived PDFF (%) <sup>†</sup>	12.8 (11.8)
MRI-derived PDFF ≥5%	100 (81)
MRI-derived PDFF ≥10%	70 (57)
Quantitative US results	
QUS fat fraction (%)*	13.5 ± 6.7
QUS fat fraction (%) <sup>†</sup>	13.8 (9.4)
Transient elastography results	
CAP (dB/m)*	316 ± 54
CAP (dB/m) <sup>†</sup>	323 (61)

Note.—Unless otherwise indicated, data are numbers of participants, with percentages in parentheses. BMI = body mass index (calculated as weight [in kilograms] divided by height [in meters squared]), CAP = controlled attenuation parameter, PDFF = proton density fat fraction, QUS = quantitative US.

\* Data are mean ± standard deviation.

<sup>†</sup> Data are median, and data in parentheses are the interquartile range.

On the basis of prior research studies with MRI-derived PDFF as the reference standard, we assumed the AUC of CAP to be 0.80 (95% CI: 0.70, 0.90) in the detection of NAFLD (10), and we conservatively assumed the AUC of QUS FF was 0.93 (24). We used an approximate correlation between CAP and MRI-derived PDFF of 0.5 (25) and estimated a sample size of 117 participants was needed to achieve a power of 0.80 with  $\alpha = .05$  (26).

## Results

### Participant Characteristics

A total of 123 prospectively recruited participants (mean age, 52 years ± 13; 67 [54%] women, 56 [46%] men) with or suspected of having NAFLD with contemporaneous MRI-derived PDFF, QUS, and CAP were included in this study. A detailed study schema is presented in Figure 1. Baseline patient characteristics and imaging results are presented in Table 1.

The cohort had a mean body mass index (calculated as weight in kilograms divided by height in meters squared) of 31.7 ± 5.0. One hundred (81%) participants had NAFLD (defined as MRI-derived PDFF ≥5%). Seventy (57%)

participants had MRI-derived PDFF of 10% or more. Median MRI-derived PDFF, QUS FF, and CAP were 12.8% (IQR, 11.8%), 13.8% (IQR, 9.4%), and 323 dB/m (IQR, 61 dB/m), respectively. Representative images of MRI-derived PDFF, QUS, and CAP from two participants with MRI-derived PDFFs of 2.6% and 11.5% are shown in Figure 2.

### Comparison of QUS FF Estimator and with CAP in the Diagnosis of NAFLD

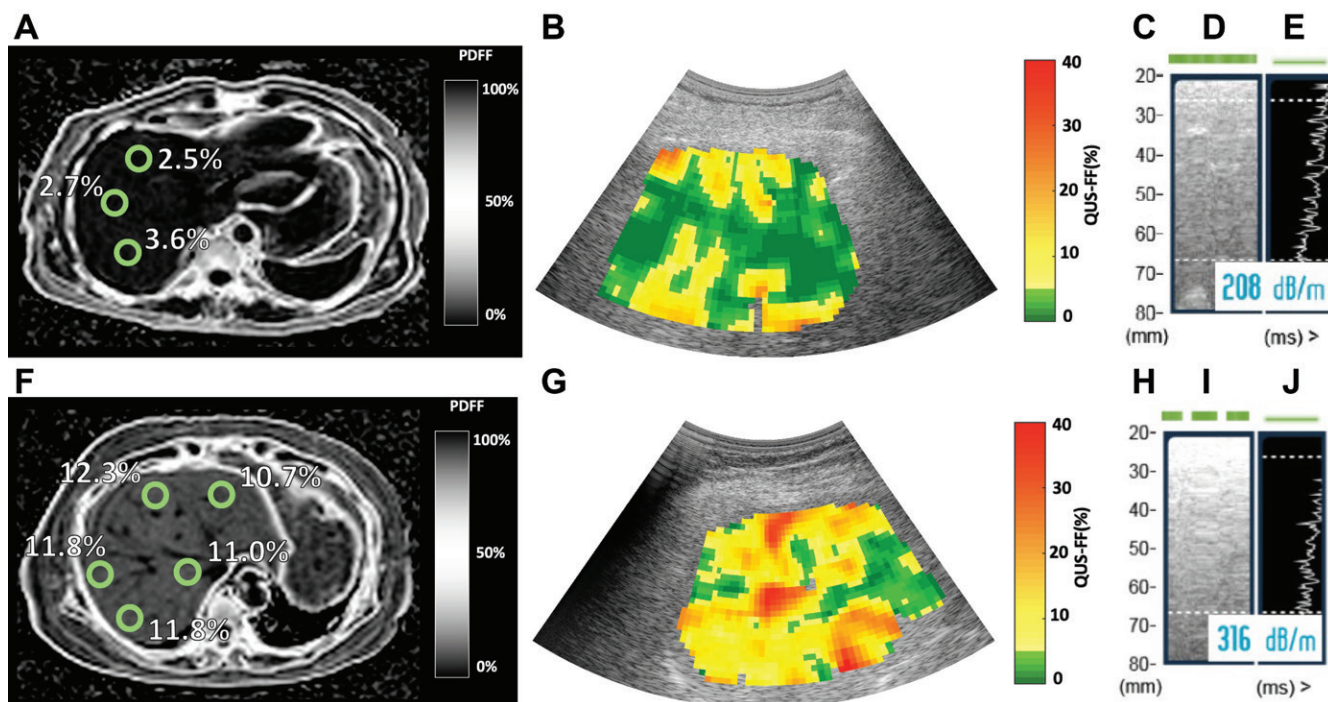
QUS FF had a significantly higher AUC for diagnosis of NAFLD (defined by MRI-derived PDFF ≥5%) than did CAP (0.92 [95% CI: 0.87, 0.98] vs 0.79 [95% CI: 0.67, 0.90],  $P = .03$ ). For QUS, QUS FF of 5% or more was used to diagnose NAFLD. CAP of 288 dB/m or more was used, as suggested by Caussy and colleagues (10). Table 2 shows cross-tabulation of QUS and CAP in relation to diagnosis of NAFLD. QUS had a sensitivity of 98% (95% CI: 93, 100) (98 of 100) and a specificity of 48% (95% CI: 27, 69) (11 of 23), whereas CAP had a sensitivity of 87% (95% CI: 79, 93) (87 of 100) and a specificity of 57% (95% CI: 35, 77) (13 of 23) (Table 3). QUS and CAP had similar positive predictive values (89%, [98 of 110] vs 90% [87 of 97]). QUS had a higher negative predictive value compared with CAP (85% [11 of 13] vs 50% [13 of 26]).

### Comparison between QUS FF Estimator and CAP in Detection of MRI-derived PDFF of 10% or More

QUS FF had a significantly higher AUC for the detection of MRI-derived PDFF of 10% or more than did CAP (0.90 [95% CI: 0.85, 0.95] vs 0.75 [95% CI: 0.66, 0.84],  $P = .001$ ), and the difference was clinically relevant and statistically significant. For cut points, QUS FF of 10% or more was used to detect MRI-derived PDFF of 10% or more. CAP of 306 dB/m or more was used, as suggested by Caussy and colleagues (10). Table 4 shows cross-tabulation of QUS and CAP in relation to detection of MRI-derived PDFF of 10% or more. In the detection of participants with MRI-derived PDFF of 10% or more, QUS had a sensitivity of 94% (95% CI: 86, 98) (66 of 70) and a specificity of 64% (95% CI: 50, 77) (34 of 53), whereas CAP had a sensitivity of 80% (95% CI: 69, 89) (56 of 70) and a specificity of 51% (95% CI: 37, 65) (27 of 53) (Table 3). QUS also had a higher positive predictive value compared with CAP (78% [66 of 85] vs 68% [56 of 82]) and a higher negative predictive value (90% [34 of 38] vs 66% [27 of 41]).

### Agreement between QUS FF Estimator and MRI-derived PDFF and between CAP and MRI-derived PDFF

Agreement between QUS FF and MRI-derived PDFF across the entire range of PDFF values is shown on the Bland-Altman plot and scatterplot (Figs 3, 4A). The mean bias between QUS FF and across the range of MRI-derived PDFF values was -0.01% ( $P = .98$ ). The 95% limits of agreement were 11.3% and -11.4%. Linear regression of QUS FF against MRI-derived PDFF yielded a slope of 0.58, an intercept of 5.7%, and an  $R^2$  value of 0.56. The Pearson correlation coefficient was 0.75 ( $P < .001$ ) for QUS FF versus MRI-derived PDFF. A Winzorized linear regression model for QUS and CAP is described in Appendix E7 (online).



**Figure 2:** MRI-derived proton density fat fraction (PDFF), quantitative US (QUS), and controlled attenuation parameter (CAP) images in two representative participants. MRI-derived PDFF values were 2.6% in a 45-year-old man (top row) and 11.5% in a 67-year-old woman (bottom row). For CAP, valid image representation closest to the reported value has been selected as the representative image. **(A, F)** Representative MRI-derived PDFF images. Circular regions of interest (radius, 1 cm) have been placed on each of the nine Couinaud segments. For this analysis, MRI-derived PDFF values from liver segments five through eight were averaged and used as the reference standard for hepatic fat content. **(B, G)** Representative QUS fat fraction (FF) images. B-mode reconstructed US images including colorized FF maps (the parametric maps are not intended to show the distribution of fat in the liver; thus, average QUS FF value across the entire field of interest was recorded). Representative CAP images with **(C, H)** depth explored (in millimeters), **(D, I)** time-motion mode, and **(E, J)** amplitude mode.

**Table 2: Cross-Tabulation between QUS, CAP, and MRI-derived PDFF of 5% or Greater**

Diagnostic Test	MRI-derived PDFF $\geq$ 5%		Total (n = 123)
	Positive (n = 100)	Negative (n = 23)	
<b>QUS</b>			
Positive	98 (98)	12 (52)	110 (89)
Negative	2 (2)	11 (48)	13 (11)
<b>CAP</b>			
Positive	87 (87)	10 (43)	97 (79)
Negative	13 (13)	13 (57)	26 (21)

Note.—Data are number of participants, and data in parentheses are percentages. Detection of MRI proton density fat fraction (PDFF) of 5% or more indicated hepatic steatosis. For cut points, quantitative US (QUS) fat fraction of 5% or more and controlled attenuation parameter (CAP) of 288 dB/m or more were used.

As there is no direct conversion formula between CAP and MRI-derived PDFF, agreement between CAP and MRI-derived PDFF is shown using a scatterplot (Fig 4B). Linear regression of CAP against MRI-derived PDFF yielded a slope of 2.6, an intercept of 280 dB/m, and an  $R^2$  value of 0.19. Pearson correlation coefficient was 0.44 ( $P < .001$ ) for CAP versus MRI-derived PDFF.

## Discussion

With the prevalence of nonalcoholic fatty liver disease (NAFLD) increasing in the global population, a noninvasive widely accessible modality with which to detect NAFLD remains an unmet need to clinically assess hepatic steatosis in patients with NAFLD. Although US-based modalities, such as quantitative US (QUS) fat fraction (FF) estimator and controlled attenuation parameter (CAP), have been developed to provide potential point-of-care diagnosis of NAFLD, there has been no comparison between diagnostic accuracy of these modalities in patients at risk for NAFLD. Thus, we sought to compare the two imaging modalities in a well-characterized prospective cross-sectional observational study of participants with or suspected of having NAFLD. QUS FF had a significantly higher area under the receiver operating characteristic curve compared with CAP in the diagnosis of NAFLD (0.92 vs 0.79,  $P = .03$ ). Likewise, QUS FF was significantly more accurate than CAP in the detection of participants with MRI-derived proton density FF (PDFF) of 10% or more (0.90 vs 0.75,  $P = .001$ ). QUS FF estimation shows promise as a potential method for hepatic steatosis screening and as a potential diagnostic enrichment biologic marker in the identification of patients who could benefit from pharmacologic trials. High screening failure rates are reported in nonalcoholic steatohepatitis-related pharmacologic trials because participants did not meet the MRI-derived PDFF criteria, regardless of their prescreened CAP results (27). The high positive predictive value

**Table 3: Comparison between QUS and CAP Performance in Detection of MRI-derived PDFFF of 5% or More (Hepatic Steatosis) and MRI-derived PDFFF of 10% or More (Common Eligibility Criterion for Clinical Trials)**

Measurement	MRI-derived PDFFF $\geq$ 5%		MRI-derived PDFFF $\geq$ 10%	
	Sensitivity (%) ( $n = 100$ )	Specificity (%) ( $n = 23$ )	Sensitivity (%) ( $n = 70$ )	Specificity (%) ( $n = 53$ )
QUS	98 (93, 100) [98]	48 (27, 69) [11]	94 (86, 98) [66]	64 (50, 77) [34]
CAP	87 (79, 93) [87]	57 (35, 77) [13]	80 (69, 89) [56]	51 (37, 65) [27]

Note.—Data in parentheses are the 95% CI, and data in brackets are the number of participants. CAP = controlled attenuation parameter, PDFFF = proton density fat fraction, QUS = quantitative US.

**Table 4: Cross-Tabulation between QUS, CAP, and MRI-derived PDFFF of 10% or Greater**

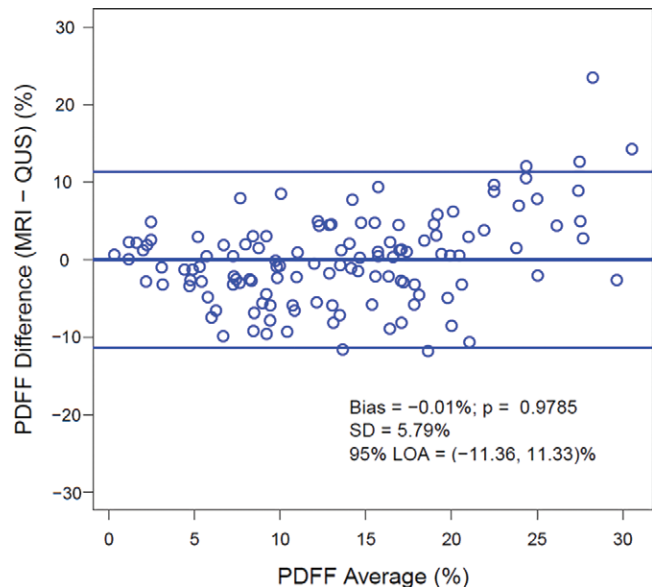
Diagnostic Test	MRI-derived PDFFF $\geq$ 10%		Total ( $n = 123$ )
	Positive ( $n = 70$ )	Negative ( $n = 53$ )	
QUS			
Positive	66 (94)	19 (36)	85 (69)
Negative	4 (6)	34 (64)	38 (31)
CAP			
Positive	56 (80)	26 (49)	82 (67)
Negative	14 (20)	27 (51)	41 (33)

Note.—Data are number of participants, and data in parentheses are percentages. For cut points, quantitative US (QUS) fat fraction of 10% or more and controlled attenuation parameter (CAP) of 306 dB/m or more were used. PDFFF = proton density fat fraction.

of QUS in the diagnosis of MRI-derived PDFFF of 10% or more might help reduce the screening failure rate for nonalcoholic steatohepatitis–related pharmacologic trials to less than 30%.

Recently, several studies have proposed use of the attenuation coefficient or backscatter coefficient from the analysis of US echoes to accurately estimate liver fat (7). Although different QUS methods, such as US-guided attenuation parameter (28), attenuation coefficient (29), or attenuation imaging (30), show promise in having similar or high AUC in the detection of hepatic steatosis, those studies included a relatively small number of patients compared with CAP, which warrants verifying their utility in a larger population to verify optimal cut points. Our study validates the findings of Han et al (16) regarding the agreement of QUS FF with MRI-derived PDFFF in quantifying and diagnosing hepatic steatosis. More studies are needed to compare diagnostic accuracy of proprietary attenuation imaging methods from different manufacturers (ie, Canon, Hologic, GE Healthcare, Siemens, SuperSonic, and Hitachi).

Our study is also consistent with prior studies that showed that although the FibroScan device (which includes vibration-controlled transient elastography and CAP) has advantages in enabling simultaneous assessment of steatosis and fibrosis, CAP has only moderate accuracy in the detection of hepatic fat content of 5% or more (30). Although CAP has varying optimal cut points for diagnosis of NAFLD (4) and has a low coefficient of determination (Fig 4), QUS FF correlates directly with MRI-derived PDFFF results, which makes it easy to use without

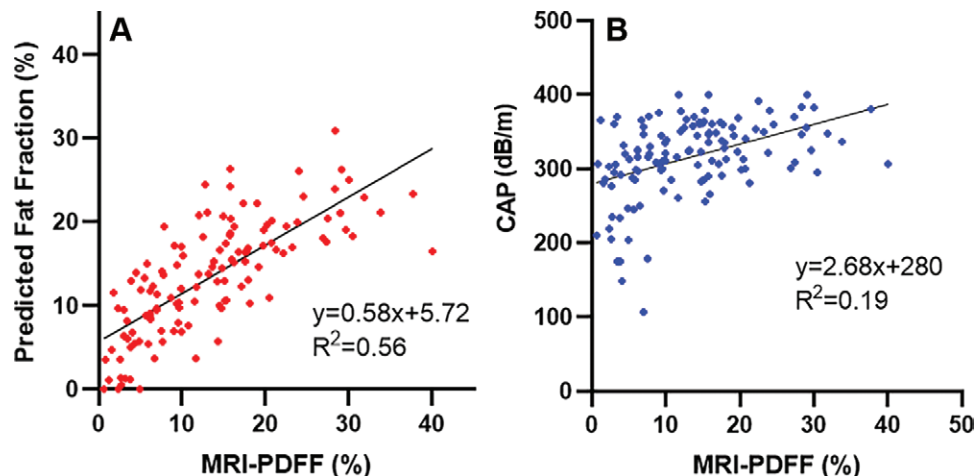


**Figure 3:** Bland-Altman plot shows the difference between MRI-derived proton density fat fraction (PDFFF) and quantitative US (QUS) fat fraction estimator across the entire range of PDFFF values. LOA = limits of agreement.

deriving yet another cut point (Figs 3, 4). Although the specificity of QUS FF was low in the diagnosis of hepatic steatosis, the negative predictive value of QUS FF was lower than that of CAP (85% vs 50%). This suggests that further investigations are needed in primary care settings to reduce false-positive rates.

Several studies suggested that the severity of hepatic steatosis may correlate with lobular inflammation, fibrosis, and presence of steatohepatitis (31). Among patients with no fibrosis at baseline, patients with high liver fat (MRI-derived PDFFF  $\geq$ 15.7%) had a higher proportion of fibrosis progression compared with those with lower liver fat content (MRI-derived PDFFF  $<$ 15.7%) (32). However, detection of and screening for NAFLD are not routinely performed in primary care, diabetes, or obesity clinics because of cost-benefit uncertainties in diagnostic testing and lack of available treatments (33). Pending validation in independent studies, QUS methods may help lower misclassification rate for diagnosis of NAFLD so patients who do not have disease will not need further evaluation. Moreover, it is technically possible to integrate algorithms such as ours into the US machine to automatically display parametric maps (such as those in Fig 2B), allowing inline analysis and documentation of results.

There are some notable limitations in our study. QUS FF was trained with QUS and MRI-derived PDFFF data from this



**Figure 4:** Scatterplots of (A) quantitative US fat fraction estimator (QUS-FF) versus MRI-derived proton density fat fraction (PDFF) and (B) controlled attenuation parameter (CAP) versus MRI-derived PDFF, along with the linear regression line.

study. However, a leave-one-out cross-validation procedure helped minimize bias by deriving QUS FF of each participant without using their own MRI-derived PDFF results. QUS in its current implementation needs phantom calibration, and fields of interest should be drawn manually. However, one-dimensional convolutional neural network algorithms have shown promise by providing a phantom-free approach using raw radiofrequency US data for liver fat quantification (34). In addition, participants were biased toward NAFLD, as 81% of participants had MRI-derived PDFF of 5% or more. However, the cohort portrays the full spectrum of patients seen in a hepatology clinic. Thus, it provides a context for physicians to use QUS to diagnose NAFLD among patients suspected of having NAFLD. Further studies are needed to validate these findings in a primary care or diabetes clinic. Also, the three methods of fat assessment were not always performed on the same day. Finally, we acknowledge that there may be a more complex model for CAP that delineates its relationship with hepatic fat content. Similar to liver fibrosis measurements, growing literature suggests a possibility of novel combination of imaging-based measurements with blood-based biologic markers to achieve greater diagnostic accuracy (35).

In conclusion, in a prospective cohort of participants with or suspected of having nonalcoholic fatty liver disease, we showed that the quantitative US fat fraction (FF) estimator is more accurate than the controlled attenuation parameter in the detection of hepatic steatosis at a MRI-derived proton density FF threshold of 5% or more and 10% or more. Further research will focus on developing a point-of-care quantitative US device for physicians to further extend the availability of this promising technology.

**Author contributions:** Guarantor of integrity of entire study, R.L.; study concepts/study design or data acquisition or data analysis/interpretation, all authors; manuscript drafting or manuscript revision for important intellectual content, all authors; approval of final version of submitted manuscript, all authors; agrees to ensure any questions related to the work are appropriately resolved, all authors; literature research, J.J., A.H., W.D.O., K.J.F., R.L.; clinical studies, J.J., A.H., E.M., A.S.B., M.P.A., W.D.O., C.B.S., R.L.; statistical analysis, J.J., A.H., R.B., M.P.A., W.D.O.; and manuscript editing, J.J., A.H., E.M., R.R.L., A.S.B., M.P.A., J.W.E., W.D.O., K.J.F., C.B.S., R.L.

**Disclosures of conflicts of interest:** J.J. No relevant relationships. A.H. No relevant relationships. E.M. No relevant relationships. R.B. No relevant relationships. R.R.L. No relevant relationships. A.S.B. No relevant relationships. M.P.A. No relevant relationships. J.W.E. No relevant relationships. W.D.O. No relevant relationships. K.J.F. Member of *Radiology* editorial board; consultant for GE Healthcare; grants from Median, Pfizer, GE, and Bayer. C.B.S. Consultant to Blade, Boehringer, and Epigenomics; grants from GE, Siemens, Philips, Bayer, Gilead, and Pfizer; lectures for Pfizer and Medscape; royalties from Wolters Kluwer; stock in Livivos; travel expenses paid by Sun Yat-Sen University; lab service agreements with Enanta, Gilead, ICON, Intercept, Nusirt, Shire, Synageva, and Takeda; consulting under auspices of institution for Advanced Magnetic Resonance Analytics, Bristol Myers Squibb, Exact Sciences, GE Digital, and IBM Watson; unpaid advisor to Quantix Bio. R.L. Institution received grants from Arrowhead Pharmaceuticals, AstraZeneca, Boehringer-Ingelheim, Bristol Myers Squibb, Eli Lilly, Galectin Therapeutics, Galmed Pharmaceuticals, Gilead, Hanmi, Intercept, Inventiva, Ionis, Janssen, Madrigal Pharmaceuticals, Merck, NGM Biopharmaceuticals, Novo Nordisk, Merck, Pfizer, Sonic Incytes, and Terns Pharmaceuticals; consultant to Aardvark Therapeutics, Altimmune, Anylam/Regeneron, Amgen, Arrowhead Pharmaceuticals, AstraZeneca, Bristol Myers Squibb, CohBar, Eli Lilly, Galmed, Gilead, Glympse Bio, Hightide, Inipharma, Intercept, Inventiva, Ionis, Janssen, Madrigal, Metacrine, NGM Biopharmaceuticals, Novartis, Novo Nordisk, Merck, Pfizer, Sagimet, Theratechnologies, 89 Bio, Terns Pharmaceuticals, and Viking Therapeutics; cofounder of LipoNexus.

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