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The severity of portal hypertension by a non-invasive assessment: acoustic structure quantification analysis of liver parenchyma

Wen-Bin Cai^{1,3†}, Ji-Kai Yin^{2†}, Qiao-ying Li¹, Yi-Lin Yang¹, Yun-You Duan¹ and Li Zhang^{1*}

Abstract

Background: Acoustic structure quantification (ASQ) has been applied to evaluate liver histologic changes by analyzing the speckle pattern seen on B-mode ultrasound. We aimed to assess the severity of portal hypertension (PHT) through hepatic ultrasonography.

Methods: Sixty patients diagnosed with PHT and underwent surgical treatment with portosystemic shunts were enrolled. Portal pressure (PP) was measured intraoperatively. Patients were divided into subgroups according to the severity of gastroesophageal varices and Child–Pugh class. Three difference ratio (C_m²) values on ASQ histogram mode were analyzed for their relationships with PP, degree of gastroesophageal varices and Child–Pugh liver function. Thirty healthy volunteers matched with the patients for gender and age were enrolled as controls. Comparisons among groups and correlation of the parameters with PP were analyzed. Area under the receive operating characteristic curve was used to evaluate the predicting value of ASQ parameters.

Results: In the patients, the ASQ parameters peak $C_{\rm m}^2$ ($C_{\rm m}^2$ _{max}), mean $C_{\rm m}^2$ ($C_{\rm m}^2$ _{mean}) and the highest occurred $C_{\rm m}^2$ value of the obtained red curve ($R_{\rm max}C_{\rm m}^2$) were all greatly increased (P < 0.0001, P < 0.0001, P = 0.027). Multiple comparisons indicated that, regardless of Child–Pugh class and degree of gastroesophageal varices, the patients had significantly increased $C_{\rm m}^2$ _{max} and $C_{\rm m}^2$ _{mean} compared with the controls (all P < 0.0001). No differences among subgroups were observed. $C_{\rm m}^2$ _{max} was significantly statistically correlated with PP (r = 0.3505, P < 0.01), degree of varices (r = 0.4998, P < 0.0001). Youden's index for $C_{\rm m}^2$ _{max} with a cut-off value of 140.3 for predicting the presence of PHT, gastroesophageal varices and liver function equal to or worse than Child–Pugh class B were 0.8, 0.91 and 0.84, respectively.

Conclusions: ASQ analysis of ultrasonographic images may have a role in the evaluation of the severity of PHT by detecting liver histologic changes in the speckle pattern caused by cirrhosis.

Keywords: Acoustic, Ultrasound, Portal hypertension, Gastroesophageal varices, Noninvasive

[†]Wen-Bin Cai and Ji-Kai Yin contributed equally to this work

*Correspondence: lilyzhang319_20@hotmail.com

Introduction

Variceal bleeding due to gastroesophageal varices is associated with high mortality in patients with portal hypertension (PHT) [1]. Preventive surgery is recommended and the selection of optimal candidates is based on an assessment of liver function and portal pressure (PP). Thus, measurement of PP is important in patients with suspected PHT. Hepatic venous pressure gradient



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¹ Department of Ultrasound Diagnosis, Tangdu Hospital, The Fourth Military Medical University, Xin Si Road, Ba Qiao District, Xi'an, China Full list of author information is available at the end of the article

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(HVPG) is considered the gold standard for PHT assessment in patients with cirrhosis [2–5], but the invasiveness and need for expertise in performing the examination limit its use in routine clinical practice. It would be helpful to have noninvasive methods capable of predicting, with acceptable diagnostic accuracy, the severity of clinically significant PHT.

Many methods have been proposed for assessing patients with PHT, especially to detect those with a high risk of variceal bleeding. Based on the dynamic changes of PHT [6], Doppler parameters have been suggested as a substitute for the invasive measurement of HVPG [7-9]. Due to the "static component" of PHT—a mechanical consequence of the associated hepatic architectural disorder—research has focused on analyzing cirrhotic liver parenchyma by ultrasound. Methods include liver stiffness measurement by means of transient elastography (TE) [10–12], strain elastography [13–15] or shear wave elastography [16–18] As reported by Yamaguchi et al. [19, 20] B-mode images of liver parenchyma contain numerous fine echo spots, called "speckle pattern" images [19–21]. Image analysis of speckle patterns can be used to identify tissue characteristics resulting from structural changes.

Acoustic structure quantification (ASQ), proposed by Toyoda et al. [22], uses sonographic software to analyze statistical information about acquired echo signals. The physical principle is that the scatter or deflection of the ultrasound wave when propagating through tissues varies according to the acoustic interfaces it encounters. In normal liver, the scattering fits a Rayleigh distribution [23, 24] because of the presence of many structures smaller than the wavelength of the typical ultrasound wave. By considering the speckle pattern in a region of interest (ROI), quantitative analysis of liver tissue can be used to assess the degree of hepatic fibrosis. Ultrasound wave scattering is increased in fibrotic liver parenchyma compared with normal conditions. ASQ could therefore be a helpful tool in quantifying diffuse liver disease and monitoring regression/progression in patients with liver fibrosis and the effects of fibrosis treatment [25–27].

In this study, we evaluated this quantitative imaging technique through intraoperative measurements of the difference ratio ($C_{\rm m}^2$) of patients with PHT and PP and the degree of gastroesophageal varices and liver function according to Child–Pugh score, aiming to determine the value of ASQ in predicting the severity of PHT.

Material and methods

Ethical approval of the study protocol

All subjects included in the study provided written informed consent to participate. The study protocol was

approved by the ethics committee of the Air Force Medical University Tangdu Hospital, Xi'an, China.

Patients and control subjects

The subjects of the study were enrolled from a consecutive series of patients with previously or newly diagnosed PHT who were admitted to the Fourth Military Medical University Tangdu Hospital between April 2010 and January 2012. Patients with hepatocellular carcinoma or intrahepatic thrombosis were excluded from the study. According to the sample size calculation for a twosample comparison, 60 patients were needed. Patients referred for surgical therapy with portosystemic shunts were enrolled. The indications for shunt surgery in PHT patients include: severe hypersplenism with white blood cell count $< 2.0 \times 10^9$ /L and platelets $< 30 \times 10^9$ /L; and a history of bleeding or severe gastroesophageal varices seen on endoscopy. Subjects in the patient group were further divided into subgroups according to Child-Pugh scoring criteria [28] and the severity of gastroesophageal varices (small/large), which was determined by endoscopic examination as recommended that quantitative size with a suggested cut-off diameter of 5 mm, with large varices being those greater than 5 mm [29].

Thirty healthy volunteers matched with the patients for gender and age were also enrolled. The subjects in the control group had no history of chronic liver disease, pulmonary disease or cardiovascular disease. Laboratory tests showed normal liver function and normal complete blood count.

ASQ of liver

The patients underwent ultrasound examination on the day before surgery with dedicated equipment and a 5-7 MHz convex probe (Aplio 500; Toshiba Medical Systems, Osaka, Japan) to identify the best acoustic window for ASQ. Each subject was placed in the supine or left lateral position and two images (axial plane and sagittal plane) of the right lobe at intercostal spaces 7 and 8 were obtained. As reported previously, parenchymal vessels and perivascular connective tissue are responsible for marked variation in ASQ findings [22]. The display depth and transmit focus were set to 4 cm. When images showing a high proportion of parenchyma free from large vascular structures and perivascular connective tissue were observed, the "ASQ" button was pressed and the raw data collected and stored for offline processing by the integrated software. Real time images were collected over 3 s, preferably intercostal and subcostal at maximal inspiration.

All images obtained for ASQ analysis were displayed as color-coded maps based on the amplitude of echoes and on the scattering (i.e. the deflection of the ultrasound Cai et al. BMC Medical Imaging (2022) 22:85 Page 3 of 9

wave) produced by different tissue interfaces (Fig. 1a). The ROI was positioned at a depth of 4–6 cm depending on the dimensions of the area of the liver that was most free from Glisson's capsules, as previously reported. The results were displayed on a $C_{\rm m}^{\ 2}$ histogram (Fig. 1b). The output data of the ASQ analysis were in the form of $C_{\rm m}^{\ 2}$ values, $C_{\rm m}^{\ 2}$ being a statistical parameter derived from the distribution of the echo amplitude. It is calculated using the equation $C_m^2 = \frac{\sigma_m^2}{\sigma_R^2(\mu)} = \left(\frac{\pi}{4-\pi}\right)\frac{\sigma_m^2}{\mu_m^2}$ and can also be expressed as: $C_{\rm m}^2 = \frac{Measured\ Variance}{\rm Estimated\ Variance}$ [%], where μ and σ^2 are the average and variance, respectively, of the echo amplitude in a small ROI and $\sigma_{\rm m}$ is the variance calculated from limited samples of less than $\mu + 4\sigma$. $\sigma_{\rm R}^2(\mu)$ is the variance of the Rayleigh distribution estimated from the measured average.

The calculated ASQ parameters were: $C_{\rm m}^2_{\rm max}$ (the peak value of $C_{\rm m}^2$); $C_{\rm m}^2_{\rm mean}$ (the mean value of $C_{\rm m}^2$); and $R_{\rm max}C_{\rm m}^2$ (the highest occurred $C_{\rm m}^2$ value of the red curve). As an innovative measurement, it is necessary to test the reliability. 10 patients and 10 healthy volunteers were tested by two operators for inter-operator variability and were tested by one operator twice for intra-operator variability. The inter/intra-operator variability were tested by Intraclass Correlation Coefficient analysis.

Doppler ultrasonography

All subjects underwent conventional abdominal Doppler ultrasonography with a 3.5 MHz transducer (Aplio 500; Toshiba Medical Systems, Osaka, Japan). For ASQ, the probe with a much higher frequency (5–7 MHz) were applied to acquire high resolution imaging in near field, but for conventional B mode scanning, especially for Doppler ultrasound measurement, a low frequency ultrasound with strong penetration was better. Doppler

parameters including velocity and resistive index were measured at 30°–60°. The Doppler gate was placed in the porta hepatis and in the hilum of the spleen to measure parameters for the portal vein, hepatic artery and splenic artery. Velocity measurements were made at an angle of 30°–60°. The mean velocity in the portal vein (PVVel), the hepatic artery resistive index (HARI) and the splenic artery resistive index (SpARI) were calculated automatically by the machine after the waveform traces for three cardiac cycles had been obtained. The portal hypertension index (PHI) was calculated as: $PHI = (HARI \times 0.69)$ (SpARI \times 0.87)/PVVel [30, 31]. They were calculated as the mean of three measurements.

Measurement of PP

The drugs used for general anesthesia were the same in all subjects. Heart rate, electrocardiogram, oxygen saturation, end-tidal carbon dioxide pressure, blood pressure and temperature were monitored continuously. Intraoperatively, with the blood pressure kept constant, the right gastroepiploic vein was isolated and catheterized with a pressure gauge to measure the PP. An examiner (Ji-Kai Yin) with 8 years of experience of PP measurement during surgery performed all PP studies. The mean value of PP was calculated from three repeated measurements.

Statistical analysis

Data were presented as the mean ± standard deviation. Differences between the patient group and control group were tested using the unpaired Student's *t*-tests. As an innovative measurement, the inter/intra-operator variability of ASQ were tested by Intraclass Correlation Coefficient analysis. All ASQ variables were normal distributed. The Tukey–Kramer multiple comparisons was

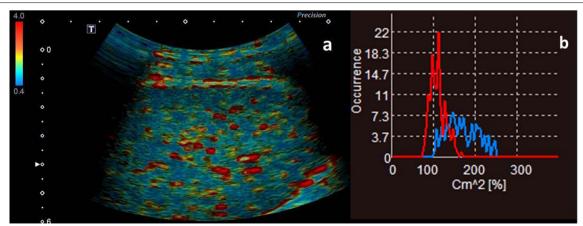


Fig. 1 Acoustic structure quantification (ASQ) analysis images obtained from a patient with portal hypertension, right lobe of liver. **a** Histogram display of the right lobe; **b** the corresponding ASQ curve for the difference ratio (C_m^2) . The red curve represents the value of C_m^2 in the region of interest; higher inhomogeneous inconsistent values are indicated by the blue curve

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used for assessing whether there was a significant difference of the ASQ parameters among subgroups according to the Child-Pugh scoring and the gastroesophageal varices grade. Spearman's rank correlation coefficient and linear regression (simple linear model) analysis were used to assess correlations among the ASQ parameters with PP, Child-Pugh score and varices grade, as the last two were semi-quantitative data and ranked data. The predictive performance of the ASQ parameters for PHT diagnose, liver function evaluation and varices grading were tested using receiver operating characteristic (ROC) curve analysis and expressed in terms of accuracy, sensitivity, specificity and Youden's index (YI) for several cutoff values. Results were considered significant at P < 0.05. The statistical software package SPSS 12.0 (SPSS Inc., Chicago, IL) was used for all data analyses.

Results

Sample characteristics

Sixty consecutive patients (46 men and 14 women; median age, 47 years) who underwent portosystemic shunt surgery were enrolled in the present study. There was no significant difference between patients and healthy controls (22 males and 8 females; age range, 32–58 years) as far as gender and age were concerned. The main clinical and pathologic data for the patients were presented in Table 1. Hepatitis B was the most common etiologic factor and was present in 40 cases (67%). Hepatitis C was the cause of cirrhosis in 14 patients (23%). Liver function was classified according to Child–Pugh score as follows: A in 17 (28%) patients; B in 37 (62%); and C in six (10%). Most patients (70%) had light ascites. Among the PHT patients enrolled in our study,

Table 1 Clinical and pathologic characteristics of 60 patients with PHT

| Patient characteristics | |
|--|-------------------|
| Age (years), median (range) | 47 (26–59) |
| Sex (F/M) | 14/46 |
| Etiology of liver disease | |
| Post-hepatitis B | 40 |
| Post-hepatitis C | 14 |
| Alcoholic | 3 |
| Cryptogenic | 3 |
| Child–Pugh class (A/B/C) | 17/37/6 |
| Ascites (absent/light/moderate/severe) | 8/42/8/2 |
| Gastroesophageal varices | |
| Absent | 5 |
| Present (small/large) | 8/35 |
| Not available | 12 |
| PP (mm Hg), mean ±SD | 28.85 ± 3.134 |

55 had a history of bleeding (12 patients had suffered more than one episode; 43 had a single episode). Twelve patients with multiple bleeding history cannot endure endoscopic examination, the extent of gastroesophageal varices was unknown. The rest five patients without a bleeding history were diagnosed with severe hypersplenism and no gastroesophageal varices were seen on endoscopy. Of the patients who had suffered a single episode of bleeding, 35 had large gastroesophageal varices and eight had small gastroesophageal varices on endoscopy. The mean PP measured directly from the right gastroepiploic vein was 28.85 ± 3.134 mm Hg.

Comparisons of ASQ and Doppler parameters

As shown in Additional file 1, the ICC of patient $R_{max}C_m^2$ were 0.927 (inter-operator variability) and 0.963 (intraoperator variability). That of healthy volunteers R_{max}C_m² were 0.948 (inter-operator variability) and 0.980 (intraoperator variability). The inter/intra-operator variability of ASQ were highly consistent. Comparisons of the Doppler and ASQ parameters among the patients and healthy subjects are shown in Table 2. The ASQ parameters C_{m}^{2} and C_{m}^{2} except $R_{\text{max}}C_{\text{m}}^{2}$ in PHT patients were much higher than those in the healthy subjects, with P < 0.01. The Doppler parameter PHI in the patient group was 1.843 ± 0.6205 m s⁻¹, which increased greatly compared with the healthy controls. Multiple comparisons indicated that, regardless of Child-Pugh class and degree of gastroesophageal varices, the patients had significantly increased $C_{\rm m\ max}^{\ 2}$ and $C_{\rm m\ mean}^{\ 2}$ compared with the controls (all P < 0.0001). No differences were observed among the subgroups. The statistical significance of differences in $C_{\text{m max}}^2$ and $C_{\text{m mean}}^2$ between groups was shown in Fig. 2.

Correlations of ASQ parameters with PHT severity and Doppler parameters

The statistical significance of correlations between ASQ parameters, PHT and Doppler parameters were evaluated using Spearman's rank correlation coefficient and linear regression analysis, as shown in Fig. 3. In the patients with PHT enrolled in our study, $C_{\rm m\ max}^{\ 2}$ was significantly statistically correlated with PP (r=0.3505, P<0.01), degree of varices (r=0.4998, P<0.0001) and

Table 2 Comparison of ASQ and Doppler parameters between healthy subjects and patients

| US variables | Healthy Control | Patients with PHT | <i>P</i> -value |
|---|--|--|-----------------------------|
| C _{m max} | 126.8 ± 9.886 | 153.9 ± 13.30 | < 0.0001 |
| $C_{m mean}^{2}$ $R_{max}C_{m}^{2}$ PHI(m s ⁻¹) | 111.7 ± 18.12 115.4 ± 8.991 1.434 ± 0.3057 | 139.5 ± 8.553 119.9 ± 8.511 1.843 ± 0.6205 | <0.0001 0.0272 0.0012 |

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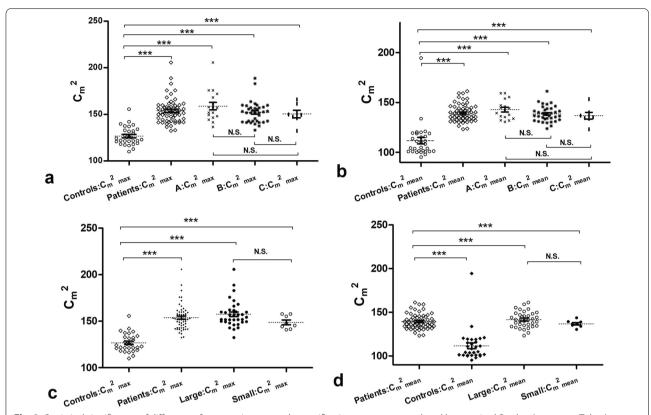


Fig. 2 Statistical significance of differences for acoustic structural quantification parameters analyzed by unpaired Student's *t*-tests or Tukey's multiple comparison tests as indicated. **a** Peak difference ratio ($C_{\rm m}^2_{\rm max}$) with Child–Pugh class; **b** mean difference ratio ($C_{\rm m}^2_{\rm mean}$) with Child–Pugh class; **c** $C_{\rm m}^2_{\rm max}$ with severity of gastroesophageal varices; **d** $C_{\rm m}^2_{\rm mean}$ with severity of gastroesophageal varices. N.S., not significant

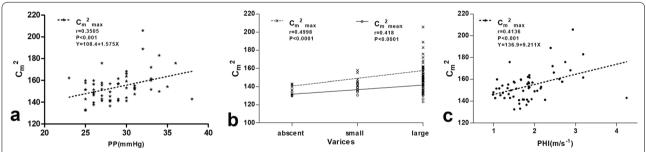


Fig. 3 Correlations among acoustic structure quantification parameters, portal hypertension severity and Doppler parameters. Positive relationships were found between **a** peak difference ratio $(C_{\text{m}}^2_{\text{max}})$ and portal pressure (PP); **b** both $C_{\text{m}}^2_{\text{max}}$ and mean difference ratio $(C_{\text{m}}^2_{\text{mean}})$ with degree of varices; and **c** $C_{\text{m}}^2_{\text{max}}$ and the Doppler parameter portal hypertension index (PHI)

the Doppler parameter PHI (r=0.4136, P<0.01). $C_{\rm m}^{\ 2}$ was significantly correlated with degree of varices only (r=0.4118, P<0.01). $R_{\rm max}C_{\rm m}^{\ 2}$ in PHT patients showed no obvious relationship with Child–Pugh scores, varices grade or PHI. None of the ASQ parameters showed a significant correlation with Child–Pugh scores, with P-values of 0.1663, 0.0920 and 0.5341 for $C_{\rm m}^{\ 2}$ max, $C_{\rm m}^{\ 2}$ mean and $R_{\rm max}C_{\rm m}^{\ 2}$, respectively. PHI correlated with PP; namely,

at higher PP, increased PHI was observed (r=0.3609, P=0.0046) (Fig. 4), but not with Child-Pugh scores and varices grade.

Given the above statistical results, the predictive performance of $C_{\rm m}^{\ 2}_{\ \rm max}$, as the most ideal parameter, was analyzed. The diagnostic YI values for $C_{\rm m}^{\ 2}_{\ \rm max}$ with a cut-off value of 140.3 in predicting the presence of PHT, gastroesophageal varices and liver function equal to or

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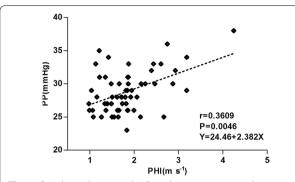


Fig. 4 Correlation between the Doppler parameter portal hypertension index (PHI) and portal pressure (PP). PHI was found to be positively correlated with PP

worse than Child–Pugh B were 0.85 (sensitivity, 91.67%; specificity, 93.33%), 0.91 (sensitivity, 97.67%; specificity, 93.33%) and 0.84 (sensitivity, 90.70%; specificity, 93.33%), respectively. For predicting the presence of a large area of gastroesophageal varices, the diagnostic cut-off value was 142.4 and the corresponding YI was 0.91 (sensitivity, 94.29%; specificity, 96.67%). In PHT patients with Child–Pugh C liver function, where $C_{\rm m}^{\ 2}_{\ max}$ was 132.3, YI reached its highest value of 0.73. The predictive performance including the area under the curve, sensitivity,

specificity and YI with corresponding cut-off values is summarized in Table 3. ROC curves are shown in Fig. 5.

Discussion

Increased PP in patients with chronic liver disease leads to a high risk of developing gastroesophageal varices and decompensation of liver function. Because gastroesophageal varices-induced hemorrhage in patients with cirrhosis can be fatal, these patients must be routinely classified according to their risk status and appropriate therapy should be undertaken to prevent hemorrhage. Endoscopy is the gold standard method for screening for esophageal varices in cirrhotic patients; however, the extent of esophageal varices can vary and follow-up for variceal bleeds is needed, which limits its routine application. HVPG is an acceptable indirect measurement of PHT and predictor of the complications of PHT. It is a strong and independent predictor of death in both compensated and decompensated cirrhosis [32, 33]. Variceal bleeding does not occur at pressures under 12 mm Hg as indicated by HVPG. No noninvasive method is available to replace HVPG measurement or endoscopy in the rapid discrimination of stage of liver cirrhosis and post-treatment evaluation, and we remain in need of noninvasive means to predict the presence or absence of gastroesophageal varices.

Table 3 Predictive performance of C_{m}^{2} for the assessment of PHT severity

| | AUC ^a | Std. Error | <i>P</i> -value | 95% CI ^b | Cut-off | Sensitivity (%) | Specificity (%) | ΥI |
|---------------------------------|------------------|------------|-----------------|---------------------|---------|-----------------|-----------------|------|
| Presence of PHT | 0.9639 | 0.0217 | < 0.0001 | 0.9213 to 1.006 | 140.3 | 91.67 | 93.33 | 0.85 |
| Varices | 0.9736 | 0.0197 | < 0.0001 | 0.9350 to 1.012 | 140.3 | 97.67 | 93.33 | 0.91 |
| Large area of varices | 0.9752 | 0.0188 | < 0.0001 | 0.9383 to 1.012 | 142.4 | 94.29 | 96.67 | 0.91 |
| ^c Child-Pugh grade≥B | 0.9605 | 0.0240 | < 0.0001 | 0.9134 to 1.008 | 140.3 | 90.70 | 93.33 | 0.84 |
| Child-Pugh grade = C | 0.9429 | 0.0427 | 0.0003 | 0.8591 to 1.027 | 144.0 | 96.67 | 85.71 | 0.82 |

^a AUC, area under ROC curve

^c Child-Pugh class \geq B means that liver function according to the Child-Pugh score was equal to or worse than the Child-Pugh B

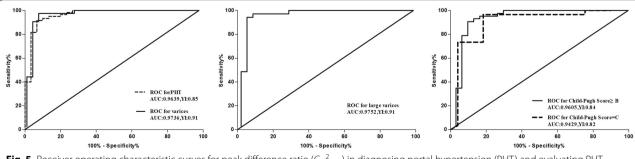


Fig. 5 Receiver operating characteristic curves for peak difference ratio ($C_{m max}^2$) in diagnosing portal hypertension (PHT) and evaluating PHT severity

^b CI, confidence interval

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Histology is an important indicator of the severity of chronic liver disease and of the degree of PHT. One method for the histologic evaluation of the liver is measurement of liver stiffness by ultrasound elastography. Much research has been conducted in this field and some techniques have been applied in routine clinical work to assist the evaluation of PHT. The guidelines published in 2018 pointed out that liver stiffness measurements of TE > 20 kPa can be used to identify patients likely bearing clinically significant portal hypertension (HVPG≥10 mmHg); liver stiffness measurement using TE<20-25 kPa combined with platelet count>110-150 × 106/mL is useful in ruling out varices needing treatment [34]. In the present study, ASQ technology based on B-mode ultrasonographic images, obtained through conventional B-mode ultrasonography, was used to identify homogeneous and heterogeneous liver changes not subjectively but objectively. It can be difficult for sonographers to make quantitative diagnoses on conventional ultrasonography as is possible with computed tomography. ASQ software analyzes the physical phenomenon of ultrasound wave scattering and by measuring the degree of scattering provides a quantitative assessment of liver parenchymal histology.

We acquired real time images over 3 s depicting liver parenchyma free from Glisson's capsules with the patient holding his or her breath. Three display modes are available in ASQ analysis: histogram, parametric and basic. Histogram mode gives the $C_{\rm m}^{\ 2}$ value after analyzing the raw data; we acquired 22 consecutive frames for each patient. We chose three parameters as indicators of liver histology: $C_{\rm m\ max}^2$, $C_{\rm m\ mean}^2$ and $R_{\rm max}C_{\rm m}^2$, representing the peak, average and highest occurred value of $C_{\rm m}^2$ of the obtained red curve in the ROI, respectively. The final values we used for statistical analysis were the means of those from each of the 22 frames. Parametric mode provides images colored according to echo amplitude, with $C_{\rm m}^2$ values coded from red to green. Basic mode provides another parameter, the probability density function of the $C_{\rm m}^{2}$ values measured in a ROI, displayed against the theoretical speckle pattern generated by a Rayleigh distribution [27]. In the present study, we focused on histogram analysis.

Three clinical indices – PP measured intraoperatively, the size of gastroesophageal varices and liver function classified by Child–Pugh score—were used as indicators of the severity of PHT [35–37]. The ASQ parameters were significantly increased in patients with PHT; $C_{\rm m}^{\ 2}_{\rm max}$ was better correlated with PP and the size of gastroesophageal varices than $C_{\rm m}^{\ 2}_{\rm mean}$ and $R_{\rm max}C_{\rm m}^{\ 2}$. $C_{\rm m}^{\ 2}_{\rm max}$ was also positively correlated with the index of hemodynamic change PHI, which increased significantly with increased PP. $C_{\rm m}^{\ 2}_{\rm mean}$ was correlated only

with the size of gastroesophageal varices. No obvious relationships were found between the ASQ parameters and Child–Pugh class. According to ROC analysis, the diagnostic value of $C_{\rm m}^2$ for PP, severity of varices and liver function was greater than that of the ASQ parameters for liver fibrosis [26]. We also evaluated hemodynamic changes in patients with PHT and their relationship with liver pathologic changes. PHI, which was significantly correlated with PP in our previous studies [38], showed a good correlation with PP and with $C_{\rm m}^2$ To our knowledge, this is the first study to evaluate this relationship with regard to histology, hemodynamics and pressure simultaneously.

Our study had limitations. First, we did not assess the middle stage between normal liver and decompensated liver cirrhosis (e.g. liver fibrosis and liver cirrhosis without PHT) due to the impossibility to get the data of portal pressure of the middle stage and this may be the reason for the high diagnostic value of $C_{\rm m}^{\ 2}_{\rm max}$. Second, the number of patients was not large enough for a comprehensive evaluation, especially of varices, which might be the reason of a week relationship (r = 0.3 ~ 0.4) to be found between these parameters. Further studies are needed to confirm the present results regarding the predictive value of ASQ parameters.

We evaluated correlations between ultrasonographic images and the histologic changes of liver parenchyma, hepatic dynamic changes, PP, gastroesophageal varices and Child–Pugh class. We employed ASQ analysis in histogram mode because the parameters were most stable in this mode. Our results show that the predictive performance of $C_{\rm m}^2$ was satisfactory and warrants further validation. We can infer that ASQ analysis of ultrasound images may have a role in the evaluation of the severity of PHT by identifying liver histologic changes from the speckle pattern observed in cirrhosis.

Abbreviations

ASQ: Acoustic structure quantification; PHT: Portal hypertension; PP: Portal pressure; HVGP: Hepatic venous pressure gradient; TE: Transient elastography; SE: Strain elastography; SWE: Shear wave elastography; $C_m^2_{\text{max}}$: Peak value of C_m^2 , $C_m^2_{\text{mean}}$: Mean value of C_m^2 ; $R_{\text{max}}C_m^2$: C_m^2 value at the peak red occurrence; PVVel: Mean velocity of the portal vein; HARI: Hepatic artery resistive index; SpARI: Splenic artery resistive index; PHI: Portal hypertension index; ROC: Receiver operating characteristic; PDF: Probability density function; ROI: Region of interest; CI: Confidence interval; YI: Youden's index.

Supplementary Information

The online version contains supplementary material available at https://doi.org/10.1186/s12880-022-00817-2.

Additional file 1. Suppl. Fig 1. Intra-operator variability of patients: RmaxCm2 of patients were tested by the same operator on the same patients for two times. Suppl. Fig 2. Inter-operator variability of patients: RmaxCm2 of patients were tested by two operators on the same patients. Suppl. Fig 3. Intra-operator variability of healthy volunteers: RmaxCm2 of

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healthy volunteers were tested by the same operator on the same healthy volunteers for two times. **Suppl. Fig 4.** Inter-operator variability of healthy volunteers: RmaxCm2 of healthy volunteers were tested by two operators on the same healthy volunteers.

Acknowledgements

Not applicable

Author contributions

WB Cai and JK Yin drafted the manuscript and carried out data processing. QYL collected data. YLY recruited the patients. YYD carried out data processing and guidance. LZ designed the research, conceptualized the manuscript and involved in data processing. All authors read and approved the final manuscript.

Funding

This work was supported by a grant from the National Natural Science Foundation of China, NSFC 81101092.

Availability of data and materials

All data generated or analysed during this study are included in this published article.

Declarations

Ethics approval and consent to participate

The study was approved by the Ethical Committee of Tangdu Hospital, the Fourth Military Medical University. All the methods were performed in accordance with the relevant guidelines and regulations of the institutional and national research committee. Informed consent was obtained from all individual participants included in this study.

Consent for publication

Not applicable.

Competing interests

The authors declare that they have no competing interests.

Author details

¹Department of Ultrasound Diagnosis, Tangdu Hospital, The Fourth Military Medical University, Xin Si Road, Ba Qiao District, Xi'an, China. ²Department of General Surgery, Tangdu Hospital, The Fourth Military Medical University, Xi'an, China. ³Department of Ultrasound Diagnostics, General Hospital of Tibet Military Region, Lhasa, China.

Received: 16 September 2021 Accepted: 5 May 2022 Published online: 12 May 2022

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