HEPATOBILIARY

Microvascular invasion and grading in hepatocellular carcinoma: correlation with major and ancillary features according to LIRADS

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Abstract

Purpose To assess major and ancillary parameters that could be correlated with Microvascular Invasion (MIV) and with histologic grade of HCC.

Materials and methods In this retrospective study, we assessed 62 patients (14 women–48 men; mean age, 63 years; range 38–80 years) that underwent hepatic resection for HCC. All patients were subject to Multidetector computed tomography (MDCT); 40 to Magnetic Resonance (MR) study. The radiologist assessed major and ancillary features according to LIRADS (v. 2018) and reported any radiological accessory fndings if detected.

Results No major feature showed statistically signifcant diferences and correlation with grading. Mean ADC value was correlated with grading and with MIV status. No major feature was correlated to MIV; progressive contrast enhancement and satellite nodules showed statistically diferent percentages with respect to the presence of MIV, so as at the monovariate correlation analysis, satellite nodules were correlated with the presence of MIV. At multivariate regression analysis, no factor proved to be strong predictors of grading while progressive contrast enhancement and satellite nodules were signifcantly associated with the MIV.

Conclusion Mean ADC value is correlated to HCC grading and MIV status. Progressive contrast enhancement and the presence of satellite nodules are correlated to MIV status.

Keywords Hepatocellular carcinoma · Microvascular invasion · Histological grading · Multidetector computed tomography · Magnetic resonance imaging

Introduction

Liver resection (LR) and orthotopic liver transplantation (OLT) are considered the standard of care of hepatocellular carcinoma (HCC) $[1-3]$ $[1-3]$ $[1-3]$. However, the high recurrence rate is a major problematic issue for hepatic resection with regard to achieving cure and long-term survival, because the tumor

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recurrence rate exceeds 60% at 5 years even in patients with small tumors [[4](#page-11-1)]. Microvascular invasion (MVI), defned as microscopically detected tumor thrombi within small tumor or peritumoral vessels, today, is considered a major risk factor of recurrence and survival in patients with HCCs after curative resection [\[5](#page-11-2)]. In addition, macrovascular and microvascular invasion have been shown to increase the risk of tumor recurrence after liver transplantation. The value of MVI is particularly stressed after OLT, because the longterm result in these patients is not satisfactory [\[6](#page-11-3)[–9](#page-11-4)]. Conversely, for patients referred for LR, the rule of MVI is not widely accepted. In fact, there is no well-defned correlation between overall and disease-free survival (DFS) with MVI [\[10\]](#page-11-5). Nevertheless, the assessment of MVI could be important in establishing the diferent phases of therapy, as the choice between LR or ablation therapies $[11-13]$ $[11-13]$, or to identify a personalized post-treatment follow-up [\[14](#page-11-8), [15](#page-11-9)]. Therefore, it is important to predict the presence of MVI

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before hepatic resection for helping physicians in determining treatment strategies. Conversely to macrovascular invasion, conventional imaging techniques have been inefective in detecting MVI since MVI is a microscopic parameter and the criteria for preoperative diagnosis of MIV are not well established [[16,](#page-11-10) [17](#page-11-11)]. Also, HCC histologic grade is an important predictive factor for recurrence and survival after hepatic resection and transplantation: poorly diferentiated HCCs are associated to worse survival in comparison to well- and moderately differentiated HCCs [[18\]](#page-11-12). The possibility that imaging features can correlate to histologic grade to select the therapeutic strategy would be of great value in helping to direct proper management of HCC [[5,](#page-11-2) [18\]](#page-11-12). The accurate detection of histologic grade of HCC is thought to be a main parameter in planning the therapeutic approach [\[5](#page-11-2), [18\]](#page-11-12).

The purpose of this retrospective study is to assess morphological parameters that could be correlated with MIV and with histologic grade of HCC.

Materials and methods

Study population

Table 1 Characteristics of the

Our institutional review board approved this retrospective study, and the requirement for patient informed consent was waived. We searched the surgical database at our institution from May 2012 to September 2018 and selected 84 patients with suspected HCC, who underwent hepatic resection. The inclusion criteria for the study population were as follows: (a) patients who had pathologically proven HCC; (b) patients who had undergone MR imaging and liver MDCT with less than a 1-month interval between imaging modalities; (c) patients who had less than a 1-month interval between

imaging and pathologic diagnosis; and (d) availability of diagnostic quality pictures of the cut sections of the resected specimens in patients who underwent surgical resection for matching of imaging and pathology fndings. The exclusion criteria were as follows: (a) divergence between the imagingbased diagnosis and the pathologically confrmed diagnosis, (b) no available MR or MDCT images.

In total, 84 patients with HCC confrmed at pathology fulflled the inclusion criteria during the study period. Among them, 22 patients were excluded for the following reasons: (a) four patients had no available MR or MDCT images and (b) in 18 patients the fnal diagnosis did not show HCC.

Finally, 62 patients [16 women–46 men; mean age, 63 years; range 38–78 years) comprised our study population. Characteristics of the 62 patients are summarized in Table [1](#page-1-0).

Lesion confrmation: reference standard

All original pathological samples were reviewed by one experienced hepatic pathologist (F.T.). Lesions were confirmed histopathologically as hepatic tumors according to the tumor classifcation of the World Health Organization and the grading were defned according to the grading system of Edmondson–Steiner. The HCC component was defned as trabecular, solid sheet, or pseudoacinar arrangements with interspersed sinusoids. For each specimen, hepatocellular diferentiation was confrmed with immunohistochemical stains characteristic of hepatocyte diferentiation (Hepatocyte-Paraffin-1).

Follow‑up

The follow-up programed for all patients was CEUS at frst month and MDCT every 3 months for the frst post-operative

year. If a new liver nodule was detected at imaging, patients underwent MRI examination.

MDCT and MR examinations

All patients were subject to MDCT and 40 to MR study.

MDCT protocol

MDCT was performed with a 64-detector row scanner (Optima 660, GE Healthcare, United States). MDCT scanning parameters were 120 kVp, 100–470 mAs (NI 16.36), 2.5-mm slice thickness, and table speed 0.984/1 mm/rotation. Scans were carried out including a region encompassing the liver from diaphragm to iliac crests. Liver protocol examinations were composed of quadruple phases, including the unenhanced, arterial, portal venous, and equilibrium phases. CT images were obtained after injection of 120 mL of a non-ionic contrast medium (iomeprol, Iomeron 400, Bracco, Milan, Italy) at a rate of 3.0–4.0 mL/s by using an automatic power injector (Empower CTA, E-Z-EM Inc., New York, United States). Image acquisition in the arterial phase which was initiated 19 s after attenuation in the descending aorta reached 100 HU, as measured with the bolus tracking method; in the portal venous phase, images were acquired 33 s after the arterial phase; in the equilibrium phase, images were acquired 180 s after administration of contrast media.

MR imaging protocol

MR imaging was performed by using a 1.5 T scanner (Magnetom Symphony, with Total Imaging Matrix Package, Siemens, Erlangen, Germany) with an 8-element body coil and a phased array coil. Our routine liver MR imaging protocol consisted of a breath-hold fat-saturated and not fat-saturated T2-weighted turbo spin-echo sequence, an in- and opposedphase T1-weighted gradient-echo sequence, dynamic imaging with a fat-saturated T1-weighted gradient-echo sequence, and difusion-weighted imaging. Difusion-weighted imaging (DWI) was obtained with planar echo-pulse sequence [*b* values 0, 50, 100, 200, 400, 600, and 800 s/mm²]. A nonspecifc agent, the Gd-BT-DO3A (Gadovist, Bayer Schering Pharma, Germany), was employed. All patients received 0.1 mL/kg of Gd-BT-DO3A by means of a power injector (Spectris Solaris® EP MR, MEDRAD Inc., Indianola, IA, USA), at an infusion rate of 2 mL/s followed by a 30-mL saline fush. Arterial phase images were acquired 7 s after contrast material arrival at the thoracic aorta by using an MR fuoroscopic monitoring system. Thereafter, portal venous phase and equilibrium phase were obtained 60 s and 3 min after contrast material administration, respectively. Detailed information regarding the MR imaging parameters is summarized in manuscript [[18\]](#page-11-12).

Image analysis

For each patient, MDCT and MR images were independently and blindly evaluated in random order within and between three radiologists (V.G., S.V.S., A.P.; 10, 15, and 20 years of experience in abdominal imaging). A consensus evaluation was performed when there was disagreement between the readers. The readers were blinded to previous radiological examination, pathologic results, and history of previous treatment but were aware that the patients had cirrhosis and thus were at higher risk for HCC. To reduce recall bias, all three readers maintained an interval of more than 2 weeks between interpretation sessions of MR and MDCT images.

Each radiologist was asked to identify the presence of lesion that was considered to be detectable if the nodule had attenuation or signal intensity that difered from that of the surrounding liver parenchyma. Thereafter, they reported the presence of the HCC assessing major and ancillary features according to LIRADS v. 2018 [[19](#page-11-13)]; also the radiologists reported any radiological accessory fndings if detected.

Readers assessed and recorded the following parameters: greatest nodule diameter, attenuation at unenhanced CT, signal intensity on T1- and T2-weighted images, DWI and ADC map, vascular hyperenhancement pattern during arterial phase, wash-out appearance during portal phase, vascular enhancement during equilibrium or late phases [[13](#page-11-7)]. The signal intensity of the lesions was categorized subjectively as isointense, hypointense, or hyperintense compared to the surrounding liver parenchyma. We assessed the signal on DWI sequences and measured the ADC of each lesion. The difusion-weighted signal decay was analyzed using the mono-exponential model, according to the equation $ADC = (ln (S0/Sb))/b$, where Sb is the signal intensity with difusion weighting *b* and S0 is the non-difusion-weighted signal intensity. This analysis is based on ROI using median value of single voxel signals for each *b* value. ROIs for the tumor were manually drawn to include such hyperintense voxels on image at *b* value 800 s/mm². Median diffusion parameters of ROI were used as representative values for each lesion. No motion correction algorithm was used but ROIs were drawn taking care to exclude areas in which movement artifacts or blurring caused voxel misalignments.

We analyzed the enhancement pattern during arterial, portal, and equilibrium or late phase and described it as homogeneous, heterogeneous, or progressive. We described the capsule appearance or pseudocapsule, defined as a peripheral rim of smooth hyperenhancement in the portal or delayed phase, as complete or partial. In addition, the researches were asked to report the presence of other imaging fndings if present.

Statistical analyses

Each variable was summarized by frequencies and percentages. Chi-square test was performed to assess statistically signifcant diference between percentage values. Monovariate correlation analysis by means of the Rho Spearman's Coefficient was performed to determine the factors (non-rim arterial phase hyperenhancement, wash-out, pseudocapsule, hyperintensity in T2, restricted signal in DWI, progressive contrast enhancement, satellite nodules) that are associated with grading and MIV. Mann–Whitney non-parametric test was used to compare a continuous variable among 2 or more groups. A multivariate logistic regression analysis was performed to determine the factors that were associated with the grading equal to 3 and with the MIV. Sensitivity, specifcity, positive predictive value, negative predictive value, and accuracy were calculated for each factors with respect to grading and the presence of vascular invasion.

A p value < 0.05 was considered statistically significant.

All statistical analysis was performed with SPSS for Windows (Version 23.0; SPSS Inc, Chicago, Ill).

Results

We assessed 62 patients that underwent surgical resection with preoperative diagnosis of HCC. Twelve patients were classifed as G3 (19.4%), 1 as G1 (1.6%), and 49 as G2 (79.0%) according to the grading system of Edmondson–Steiner (ES) [\[21\]](#page-11-14).

According to the surgical procedure, nine patients were subject to lobectomy, 2 mesohepatectomy, 27 bi-segmentectomy, and 24 segmentectomy (6 for VII, 1 for I, 2 for II, 2 for III, 6 for IV, 5 for V, and 2 for VI hepatic segment).

Pathological features

In 18 HCC reported with microvascular invasion, 9 lesions with MIV were G2 and 9 with MIV were G3.

Patient survival

To date all patients are alive. We found a new hepatic lesion (mean time 6.8 months) in six patients (9.7%); four patients were MIV (22.2% of MIV patients). During follow-up (mean time 14 months), in seven patients (4 were G3 and 3 were G2; 3 with MIV) we found metastases (mean time 13 months). In one case the lesion was pulmonary, in two cases were mesenteric, and in one case was bone (Fig. [1](#page-3-0)) and in 3 cases we found nodal metastases.

Fig. 1 A 63-year-old man with HCC. MDCT study shows costal metastasis

Imaging features

All lesions were detected and analyzed by readers. The consensus in the assessment of the nodules was 100%. The mean size was 53.0 mm; range 12–190 mm.

Table [2](#page-4-0) reports the frequencies for each imaging feature with respect to grading and MIV. No factor showed statistically signifcant diferences and correlation with grading (Table [3\)](#page-5-0). The progressive contrast enhancement and satellite nodules showed statistically diferent percentages with respect to the presence of MIV (p value = 0.03 and 0.002 at Chi-square test, respectively; see Table [2\)](#page-4-0). Moreover, at the monovariate correlation analysis (Table [3\)](#page-5-0), satellite nodules was correlated with the presence of MIV (*p* value < 0.05). A statistically significant difference was detected between ADC median value between the grad-ing ≤ [2](#page-6-0) (mean ADC 2149 × 10^{-3} mm²/s) (Fig. 2) and grading = 3 (1715 × 10⁻³ mm²/s). A statistically significant difference was detected between ADC median value in the groups without $(2138 \times 10^{-3} \text{ mm}^2/\text{s})$ and with MIV $(1801 \times 10^{-3} \text{ mm}^2/\text{s})$ mm²/s). Table [4](#page-7-0) reports diagnostic performance for each factors with respect to grading and respect to the presence of MIV (Fig. [3](#page-7-1)). Progressive contrast enhancement and the presence of satellite nodules had an accuracy according to grading equal to 74% and 77%, respectively. The presence of satellite nodules reached an accuracy of 79% according to the presence of MIV.

Table [5](#page-8-0) shows the fnding of the multivariate logistic regression analysis. Statistically significant p value (≤ 0.05)

Table 2 Imaging features in study population according to grading and according to vascular invasion

Imaging features in study population accord- Grading \leq 2 (number) ing to grading	$N = 50$	Grading \leq 2 (%)	Grading 3 (number) $N=12$	Grading 3 (%)	p value*
Non-rim arterial phase hyperenhancement					
Yes	31	62.0	8	66.7	0.72
Inhomogeneous	17	34.0	3	25.0	
No	2	4.0	$\mathbf{1}$	8.3	
Wash-out					
Yes	35	70.0	8	66.7	0.92
Inhomogeneous	10	20.0	3	25.0	
No	5	10.0	$\mathbf{1}$	8.3	
Pseudocapsule					
Yes	$27\,$	54.0	6	50.0	0.84
Alone	$\mathbf{1}$	2.0	$\boldsymbol{0}$	0.0	
No	22	44.0	6	50.0	
Hyperintensity in T2					
Yes	22	78.6	8	66.7	0.69
N _o	2	7.1	2	16.7	
Inhomogeneous	4	14.3	2	16.7	
Restricted signal in DWI					
Yes	28	100.0	12	100.0	
Progressive contrast enhancement					
Yes	8	16.0	4	33.3	0.17
Satellite nodules					
Yes	6	12.0	$\overline{4}$	33.3	0.07
Imaging features in study population accord- Without Vascular Inva-		Without Vascular	With Vascular Inva-	With Vascular	p value*
ing to Vascular Invasion	sion (number) $N=44$	Invasion $(\%)$	sion (number) $N = 18$	Invasion $(\%)$	
Non-rim arterial phase hyperenhancement Yes	29	67.4	10	52.6	0.52
	12	27.9	8	42.1	
Inhomogeneous N _o	2	4.7	$\mathbf{1}$	5.3	
Wash-out					
Yes	31	72.1	12	63.2	0.08
Inhomogeneous	6	14.0	7	36.8	
No	6	14.0	$\boldsymbol{0}$	$0.0\,$	
Pseudocapsule					
Yes	19	44.2	9	47.4	0.68
Alone	$\boldsymbol{0}$	0.0	$\mathbf{1}$	5.3	
No	24	55.8	9	47.4	
Hyperintensity in T2					
Yes	22	88.0	12	80.0	0.79
${\rm No}$	$\mathbf{1}$	4.0	$\sqrt{2}$	13.3	
Inhomogeneous	$\boldsymbol{2}$	8.0	$\mathbf{1}$	6.7	
Restricted signal in DWI Yes	25	100.0	15	100.0	
Progressive contrast enhancement					
Yes	7	16.3	$\sqrt{5}$	26.3	0.03
Satellite nodules					

***Chi-square test

contrast enhancement correlation coefficient

Table 3 Correlation between imaging features

Correlation between imaging features and grading

Table 3 (continued)

Correlation between imaging features and vascular invasion

*Signifcant for test at one tail

**Signifcant for test at two tails

Fig. 2 A 58-year-old woman with G2 HCC on VII hepatic segment. MRI study. The lesion shows inhomogeneous hyperintense signal (arrow) in T2-W sequence (**a**). In T1-W in–out phase sequence (**b** and **c**) the lesion is hypointense (arrow). The lesion shows hypervascular appearance (arrow) during arterial phase (**d**) with wash-out appearance (arrow) and capsule appearance during portal phase (**e**) and late phase (**f**) of contrast study. The lesion shows restricted difusion (arrow) in DWI sequences (**g**, **h** and **i**)

ADC 0.00 1.00 – 0.69 0.69

Fig. 3 A 71-year-old man with HCC on II hepatic segment. MDCT study. The nodule shows inhomogeneous hypervascular appearance (arrow) during arterial phase (**a**), with inhomogeneous wash-out

was highlighted in bold. No factor proved to be strong predictors of grading while progressive contrast enhancement and the presence of satellite nodules (Fig. [4](#page-8-1)) were signifcantly associated with the MIV.

Discussion

We assessed 62 patients that underwent surgical resection with preoperative diagnosis of HCC. Twelve patients were classifed as G3 (19.4%), 1 as G1 (1.6%), and 49 as G2 (79.0%). In 18 HCC reported with microvascular invasion, 9 were G2, and 9 were G3, so that no statistical analysis was performed.

No vascular parameters showed statistically signifcant diferences and correlation with grading. The presence of

appearance (arrow) and not complete capsule appearance (arrow) during portal and late phase of contrast study (**b** and **c**)

the specifc vascular profle characterized by contrast arterial uptake followed by wash-out in the venous phases has allowed defning the non-invasive diagnostic criteria for HCC [[20](#page-11-15)]. However, these criteria show a sensitivity rate of 50–60% in lesion smaller than 2 cm [\[20\]](#page-11-15) and are correlated to the hemodynamic changes in nodule during hepatocarcinogenesis [[21\]](#page-11-14). The typical uptake of contrast medium during arterial phase is due to neoangiogenesis, sinusoidal capillarization, and the increase of unpaired arteries, changes that take place during carcinogenesis from high-grade dysplastic nodule to classic HCC. During this process, the main drainage of vessels goes from veins to sinusoids and then to portal veins [[21](#page-11-14)]. This drainage was well assessed in the late phase of contrast studies. Histological examination revealed continuity between a tumor sinusoid and a portal venule in the pseudocapsule (HCC with

Table 5 Multivariate regression analysis

Fig. 4 A 58-year-old woman with HCC on VII hepatic segment. MDCT study. The nodule shows inhomogeneous hypervascular appearance (arrow) during arterial phase (**a**), with progressive contrast enhancement (arrow), without capsule appearance (arrow) dur-

ing portal and late phase of contrast study (**b** and **c**). Above the HCC, arrow shows satellite nodule, more evident in portal (**e**) and late phase (**f**) than in arterial phase (**d**) of contrast study

pseudocapsule appearance) or surrounding hepatic sinusoids (HCC without pseudocapsule). According to the hypothesis that these hemodynamic changes should correlate with the histological grade of HCC, our results show that there are no statistically signifcant diferences and correlation between grading and arterial hyperenhancement, between grading and portal wash-out, and between grading and capsule appearance. Our results are similar to the results of Schel-horn et al. [[22\]](#page-11-16); these researches assessed the imaging features extracted by combined Gd-EOB-DTPA and gadobutrol

liver-MRI to predict HCC grading, showing that a signifcant correlation with grading was not found for either the combined dynamic information of all gadobutrol phases or all the Gd-EOB-DTPA phases. No correlation with grading was found for a combination of arterial and hepatocellular phase in Gd-EOB-DTPA MRI, a combination of both arterial phases (gadobutrol and Gd-EOB-DTPA) with the Gd-EOB-DTPA hepatocellular phase, or a combination of all available gadobutrol and Gd-EOB-DTPA phases. For all gadobutrol information (dynamic phases and morphology) and for all Gd-EOB-DTPA information, no correlation with grading was found [[22](#page-11-16)]. Conversely, we found a statistically signifcant diference between ADC median value in the grading \leq 2 (mean ADC 2149 × 10⁻³ mm²/s) and grading = 3 (1715 × 10^{-3} mm²/s). These results are similar to the results of our previous study in which we showed that ADC and IVIM parameters should have a role in predicting the histological grade of HCC $[18]$ $[18]$. In fact, we found a good correlation between ADC, fp (perfusion fraction), and Dt (tissue difusivity) and tumoral grading. ROC analyses demonstrated that an ADC value of 2.11×10^{-3} mm²/s, an fp value of 47%, and an Dt value of 0.94×10^{-3} mm²/s were the most accurate cut-off levels, with a sensitivity and specificity for ADC of 100 and 100%, for fp of 100 and 89%, and for Dt of 100 and 74%, respectively [\[18\]](#page-11-12). Nakanishi et al. showed not only the utility of DWI for histological grading, but also that ADC should be used as a preoperative prediction of early recurrence [[23](#page-11-17)]. Chen et al., in a metaanalysis, found that for diferentiating well-diferentiated lesions from higher grades, DWI showed a low sensitivity (54%), high specifcity (90%), and an excellent diagnostic performance. Conversely, in diferentiating poorly diferentiated lesion from lower grades, the sensitivity was 84%, the specifcity 48%, showing a moderately high diagnostic performance [[24\]](#page-11-18). Nasu et al. demonstrated no correlation between histological grade and ADC, while they found that Signal Intensity (SI) of the HCC increased in higher grade [\[25](#page-11-19)]. The major limit of DWI and IVIM parameters to identify the histological grade of HCC, as suggested by Ichikawa et al. [\[26](#page-11-20)], is correlated to the ftting model used to extract functional data, thus the ftting would be robust even though some errors might have occurred during image acquisition [26]. Contrary to Nasu [25], in our study, we found no correlation between SI on T2-W sequences and histological grade of HCC. According to LIRADS, T2-W hyperintensity is an ancillary feature. Park et al. [[27\]](#page-11-21) showed that dysplastic nodules and HCCs cannot be distinguished on the basis of SI, since their signal intensities are similar on T1-W and T2-W sequences. However, dysplastic nodules are almost never hyperintense on T2-W sequences, early HCCs are mostly isointense on T2-W sequences, while higher grade (moderately or poorly) of HCC is associated with high SI on T2-W images, although the SI may also be related with

tumor vascularity and peliotic changes [\[27](#page-11-21)]. The major limit of our analysis is that it is a qualitative analysis. Conversely to us, Wu et al. investigated the value of MRI-based radiomics signatures for the preoperative prediction of HCC grade [[28\]](#page-11-22). They evaluated 170 confrmed HCC. The radiomics features of tumors based on both T1-W imaging and T2-W imaging were extracted, and radiomics signatures were generated using the least absolute shrinkage and selection operator (LASSO) logistic regression model. The predicted values of pathological HCC grades using radiomics signatures, clinical factors (including age, sex, tumor size, alpha fetoprotein (AFP) level, history of hepatitis, hepatocirrhosis, portal vein tumor thrombosis, portal hypertension, and pseudocapsule), and the combined models were assessed. They demonstrated that radiomics signatures could successfully categorize high-grade and low-grade HCC cases $(p<0.05)$ in both the training and test datasets. Regarding the performances of clinical factors, radiomics signatures, and the combined clinical and radiomics signature (from the combined T1-W and T2-W images) models for HCC grading prediction, the areas under the curve (AUCs) were 0.600, 0.742, and 0.800 in the test datasets, respectively. Both the AFP level and radiomics signature were independent predictors of HCC grade $(p < 0.05)$ [[28\]](#page-11-22).

MVI has drawn worldwide attention in recent years, since it is indicative of early invasion of tumor cells into the tumor vessels. In our study population, we showed that there was no diference between patients with and without MIV about recurrence or metastases from HCC during the follow-up. The presence of MVI should be recognized based on microscopy, since it is beyond the imaging resolution and cannot be directly visualized with current imaging technology; however, several imaging features may be predictive of MVI [[10,](#page-11-5) [29](#page-11-23), [30](#page-11-24)]. In our study group, we found MIV in 18 HCC (29.0%); among them, 9 lesions with MIV were G2 and 9 were G3. The mean size was 36.1 mm (range 20 to 70 mm). Our results difer from Portolani et al. which reported that HCCs with MVI are generally of large size (5 cm) , with satellite nodules, a high value of AFP, and poor grading [[10\]](#page-11-5). The unique fnding that makes our study similar to Portolani is the presence of satellite nodules. According to our results, the satellite nodules and progressive contrast enhancement showed statistically diferent percentages with respect to the presence of MIV (*p* value=0.03 and 0.002 at Chi-square test, respectively). Moreover, at the monovariate correlation analysis, the presence of satellite nodules was correlated with the presence of MIV (p value < 0.05). Progressive contrast enhancement and the presence of satellite nodules had an accuracy according to grading equal to 74% and 77%, respectively. The presence of satellite nodules reached an accuracy of 79% according to the presence of MIV. At multivariate logistic regression analysis, no factor proved to be strong predictors of grading while progressive contrast enhancement and the presence of satellite nodules were signifcantly associated with the MIV. When we analyzed vascular pattern of HCC with and without MIV, we found that no parameters showed statistically signifcant diferences and correlation with MIV, such as the capsule appearance. These data are diferent to those reported in literature. Several researches reported that the presence of nonsmooth tumor margins, no or incomplete capsule, intratumoral arteries, and large tumor size detected on contrast-enhanced dynamic CT and MRI are associated with an increased risk for MVI [\[29](#page-11-23)[–34\]](#page-12-0). According to our results, Chandarana et al. showed that tumor multifocality at imaging was the only variable that was signifcantly correlated with the presence of MIV [[33\]](#page-12-1). No other clinical, pathologic, or imaging features were useful in signifcantly predicting MIV [[33](#page-12-1)]. In our study, we found that histopathologic tumor grade was not signifcantly correlated with MIV, since 9 lesions with MIV were G2 and 9 lesions were G3. These results are similar to those by Chandarana et al. and in contradiction to prior studies showing that tumor grade is an independent predictor of MIV [\[35](#page-12-2), [36](#page-12-3)]. Regarding DWI, we found a statistically significant difference between ADC median value without $(2138 \times 10^{-3}$ mm²/s) and with MIV (1801 × 10⁻³ mm²/s). These results are similar to those reported by previous studies, showing that DWI is an interesting tool in the assessment of MIV during preoperative phase [[37](#page-12-4)[–40](#page-12-5)]. Limits of our analysis are related to the fact that in this retrospective study we assessed only conventional DWI; our future prospectives are to investigate the role of IVIM and Kurtosis DWI. In fact, as demonstrated by Li et al., histogram analysis of IVIM based on whole tumor volume can be useful for predicting MVI. The 5th percentile of D was the most useful value to predict MVI of HCC [[41](#page-12-6)]. Also Zhao et al. investigated the usefulness of IVIM in predicting MVI in HCC. Preoperative IVIM DW imaging and Gd-EOB-DTPA-enhanced MRI of 51 patients were analyzed. The ADC, D (the true diffusion coefficient), D^* (the pseudodiffusion coefficient) and f (the perfusion fraction), relative enhancement (RE); and radiological features were analyzed. Univariate analysis revealed that HCCs with MVI had a higher portion of an irregular tumor shape than HCCs without MVI. ADC, D value was signifcantly lower in HCCs with MVI. Multivariate analysis revealed that an irregular shape and D value ≤ 1.16×10 –3mm²/s were independent predictors for MVI. Combining the two factors of an irregular shape and D value, a sensitivity of 94% and specifcity of 64% for predicting MVI were obtained [\[16](#page-11-10)]. Wang et al. evaluated the role of difusion kurtosis imaging (DKI) and conventional MR imaging fndings including ADC and morphologic features for prediction of MVI. They assessed 84 patients with 92 histopathologically confrmed HCCs (40 MVI-positive lesions and 52 MVI-negative lesions). Univariate and multivariate logistic regression analyses were used to evaluate the relative value of these parameters as potential predictors of MVI. They showed that features signifcantly related to MVI at univariate analysis

were increased mean kurtosis value, decreased mean difusivity value, ADC value, the presence of infltrative border with irregular shape, and irregular circumferential enhancement. At multivariate analysis, mean kurtosis value as well as irregular circumferential enhancement were independent risk factors for MVI [[40\]](#page-12-5).

Regarding T2-W SI, we found no correlation between SI on T2-W sequences and MIV. The limit of this evaluation is the qualitative analysis; in fact, we think that a radiomics analysis should give signifcant results on MVI status.

There are several limitations to our study. First, the sample size by a single-center experience; second, this is a retrospective study with a possible selection bias; third, the study is defective of functional assessment of IVIM, Kurtosis, and radiomics features. Our future prospective is to assess the rule of these functional parameters in evaluating correlation with grading and MIV status.

Conclusions

MIV and grading are two independent features that are considered major risk factors of recurrence and survival in patients with HCCs after curative resection or OLT. Although MIV cannot be directly visualized with current imaging technology, however, several imaging features may be predictive of MVI and of grading. In our study, no major feature shows statistically signifcant diferences and correlation with grading. Mean ADC value is correlated with grading and with MIV status. Regarding MIV, the progressive contrast enhancement and the presence of satellite nodules show statistically diferent percentages with respect to the presence of MIV.

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Compliance with ethical standards

Conflict of interest The authors have no confict of interest to be disclosed. The authors confrm that the article is not under consideration for publication elsewhere. Each author has participated sufficiently in any submission to take public responsibility for its content.

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