

# Evaluation of tumor mutational burden in small early hepatocellular carcinoma and progressed hepatocellular carcinoma

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While researchers know that tumor mutational burden (TMB) is low in hepatocellular carcinoma (HCC), prior studies have not investigated TMB in cirrhosis, small early HCC and progressed HCC. HCC (n = 18) and cirrhosis (n = 6) cases were identified. TMB was determined by a 1.7 megabase, 409-gene next-generation sequencing panel. TMB values were defined as the number of nonsynonymous variants per megabase of sequence. There was no significant difference between cirrhosis versus small early HCC or between cohorts when stratified by size, early versus progressed, differentiation or morphology. There was a significant difference between cirrhosis and small early HCC versus progressed HCC (p = 0.045), suggesting TMB may be related to HCC progression. TMB similarities in small early HCC and background cirrhosis suggest TMB is not a useful tool for diagnosing small early HCC. Additional study is needed to address TMB in histological and molecular subsets of HCC.

First draft submitted: 13 October 2020; Accepted for publication: 10 June 2021; Published online: 3 August 2021

**Keywords:** HCC • hepatocellular carcinoma • progressed hepatocellular carcinoma • small early hepatocellular carcinoma • TMB • tumor mutational burden

Liver cancer is the sixth-most common cancer and the fourth-most common cause of cancer-related deaths worldwide, with increasing incidence in the last several decades [1,2]. The most common primary liver cancer is hepatocellular carcinoma (HCC), comprising 75–85% of cases [1]. The risk factors for HCC vary from region to region, but HCC typically develops in patients with chronic liver disease associated with chronic viral hepatitis, alcohol consumption and metabolic syndrome, among others [3].

Treatment of cancer with immunotherapy is a rapidly evolving field in oncology, and one of the early biomarkers to predict response to immune checkpoint inhibitors has been the immunohistochemical expression of programmed death ligand 1 (PD-L1) on tumor cells [4]. Recent studies have shown that mismatch-repair deficiency can also predict objective clinical response to immune checkpoint inhibitors across many tumor types [5]. Tumor mutational burden (TMB) is an emerging biomarker that is also predictive of response to immune checkpoint inhibitors [6]. TMB is defined as the total number of somatic nonsynonymous mutations present in the coding region expressed as mutations per megabase (mut/Mb) in a tumor [6]. Currently, static pan-cancer cutoffs for low, intermediate, and high TMB cutoff are being utilized; however, the TMB landscape is changing and will most likely move toward values that are tissue specific and percentile based in the future [7]. Recently, the FDA has approved TMB ( $\geq 10$  muts/Mb as detected by an FDA-approved assay) as a pan-tumor biomarker for treatment with pembrolizumab [8]. Finally, while both PD-L1 expression and high TMB predict response to immunotherapy across different tumor types, they are independent biomarkers in most cancer types with different rates of response predicted [9].

In HCC, many genomic alterations have been found, though there is no single oncogenic driver mutation in the majority of HCCs [10]. Studies have shown that HCCs have generally low (<5 muts/Mb) TMB, are very rarely hypermutated and are on the low median end of the TMB spectrum in carcinomas with values ranging from 0.42 to 65.6 muts/Mb and median ranging from 2.56 to 5 muts/Mb [11–14]. However, research on HCC

with higher TMB has yielded interesting results [11,15–17]. In a recent study on SHR-1210 (anti-PD-1 antibody) combined with apatinib (VEGFR2 inhibitor) in advanced HCC, HCC patients with high TMB ( $>7.2$  muts/Mb) responded favorably to treatment, with improved survival compared with those patients without high TMB [17]. In another study of 17 HCC cases, Ang *et al.* showed there were no significant differences in TMB between patients whose disease progressed, remained stable or responded to immune checkpoint inhibitors [11]. Other studies have shown that higher TMB is associated with tumor recurrence after radical hepatectomy, as well as significantly poorer overall and progression-free survival [15,16]. While much has been published on the correlation between high TMB and response to immunotherapy and prognosis, not much has been published on the mutational burden of cirrhotic liver adjacent to HCC and its precursor lesions [15,16]. Furthermore, no studies have evaluated whether TMB holds any diagnostic value as an ancillary test to histopathological examination.

In cirrhotic livers, high-grade dysplastic nodules (HGDNs) evolve to small early nonprogressed HCC, which may then develop into progressed and advanced HCC [18]. HGDNs are defined as vaguely nodular lesions with architectural and/or cytological atypia (such as small change cell) and the variable presence of unpaired arteries [19]. Early HCCs are defined as vaguely nodular malignant lesions with the following histological features: increased nuclear–cytoplasm ratio, variable numbers of intratumoral portal tracts, a pseudoglandular pattern, diffuse fatty change and varying numbers of unpaired arteries [19]. Although such morphological definitions are proposed, there are overlapping features between HGDNs and early HCC. According to the International Consensus Group for Hepatocellular Neoplasia, stromal invasion is the most helpful and distinguishing feature in differentiating small early HCC from HGDNs [19,20]. However, stromal invasion is not always present or may only be present focally and can therefore be missed on needle biopsy [20]. Progressed HCCs are defined as conspicuous tumors that are distinctly nodular with infiltrative and expansile growth patterns, and these HCCs commonly have a tumor capsule [21].

Based on morphology alone, it is often difficult to differentiate HGDNs from small early HCC. While studies have shown that TMB is generally lower in the majority of HCC compared with other carcinomas, no previous studies have investigated mutational burden in non-neoplastic cirrhotic liver compared with small early and progressed HCC [11–14]. The present study was undertaken to investigate mutational burden in background cirrhosis compared with small early HCC, small progressed HCC and large progressed HCC; to evaluate its utility in diagnosis of HCC; and to understand its role in early HCC development.

## Materials & methods

After institutional review board approval, 18 cases of HCC from 18 patients were retrieved from departmental surgical pathology archives, including small early HCCs ( $n = 6$ ), small progressed HCCs ( $n = 6$ ), large well-differentiated HCCs ( $n = 3$ ) and large moderately-differentiated HCCs ( $n = 3$ ). Based on the definitions of the current edition of the WHO, small early HCCs are defined as vaguely nodular malignant lesions that are  $<2$  cm in size with the following histological features: increased nuclear–cytoplasm ratio, variable numbers of intratumoral portal tracts, a pseudoglandular pattern, diffuse fatty change and varying numbers of unpaired arteries [19,21]. Progressed HCCs are defined as conspicuous tumors that are distinctly nodular with infiltrative and expansile growth patterns, and these HCCs commonly have a tumor capsule [21]. In the current study, small HCCs were defined as  $\leq 1.5$  cm, and large HCCs were defined as  $\geq 2$  cm. Each HCC was further classified into subtypes (e.g., steatohepatic HCC, lymphocyte-rich HCC and HCC not otherwise specified [NOS]) defined by the WHO and by differentiation as defined by the WHO [21]. In addition, background cirrhosis of the six small early HCCs was also included for analysis. Relationships between TMB and morphological alterations (e.g., steatohepatic features, cholestasis, inflammatory infiltrates and architectural pattern) were noted. Cases in which the distinction between small early HCC and high-grade dysplastic nodule was not certain were excluded. High-grade dysplastic nodules were not included as a separate category because it is not known whether there is a difference in TMB between small early HCC and background cirrhosis.

The areas with cirrhosis and HCC were microdissected in all cases for evaluation of TMB. Nonsynonymous somatic variants in select regions of 409 oncogenes and tumor-suppressor genes (1.7 megabases of genomic coverage) were detected by the Ion OncoPrint™ Tumor Mutation Load Assay running on the Ion Chef™ and S5XL™ NGS instruments (Thermo-Fisher Scientific, MA, USA). Sequence data was captured by Ion Torrent Suite Software v5.10.2 and somatic prediction was conducted using the Ion Reporter Software (IRS) v5.10.5. TMB values were defined as the number of nonsynonymous variants (missense and nonsense single-nucleotide variants [SNVs], plus insertion and deletion variants [INDELs]) and expressed as mutations per megabase [muts/Mb].

Table 1. Patient characteristics.

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Age	n = 18
Mean (years)	61
Median (years)	60
Sex	
Female	5
Male	13
Ethnicity	
Caucasian	9
Hispanics	8
Asian	1
Etiology of cirrhosis	
Hepatitis B	1
Hepatitis C	3
Hepatitis B and C	2
Non-alcoholic steatohepatitis	6
Alcoholic steatohepatitis	2
Alpha-1 antitrypsin deficiency	2
Hemochromatosis	1
Autoimmune hepatitis	1

Table 2. HCC subtypes.

HCC subtypes	Cases (n)
Steatohepatitic HCC	4
Lymphocyte-rich HCC	1
HCC NOS	10
HCC NOS with partial steatohepatitic morphology	3

HCC: Hepatocellular carcinoma; NOS: Not otherwise specified.

Continuous variables were summarized as means and/or medians with ranges, and other variables as percentages. Data was analyzed using Mann–Whitney U test. All p-values were based on a 2-sided test of statistical significance. A p-value < 0.05 was considered statistically significant.

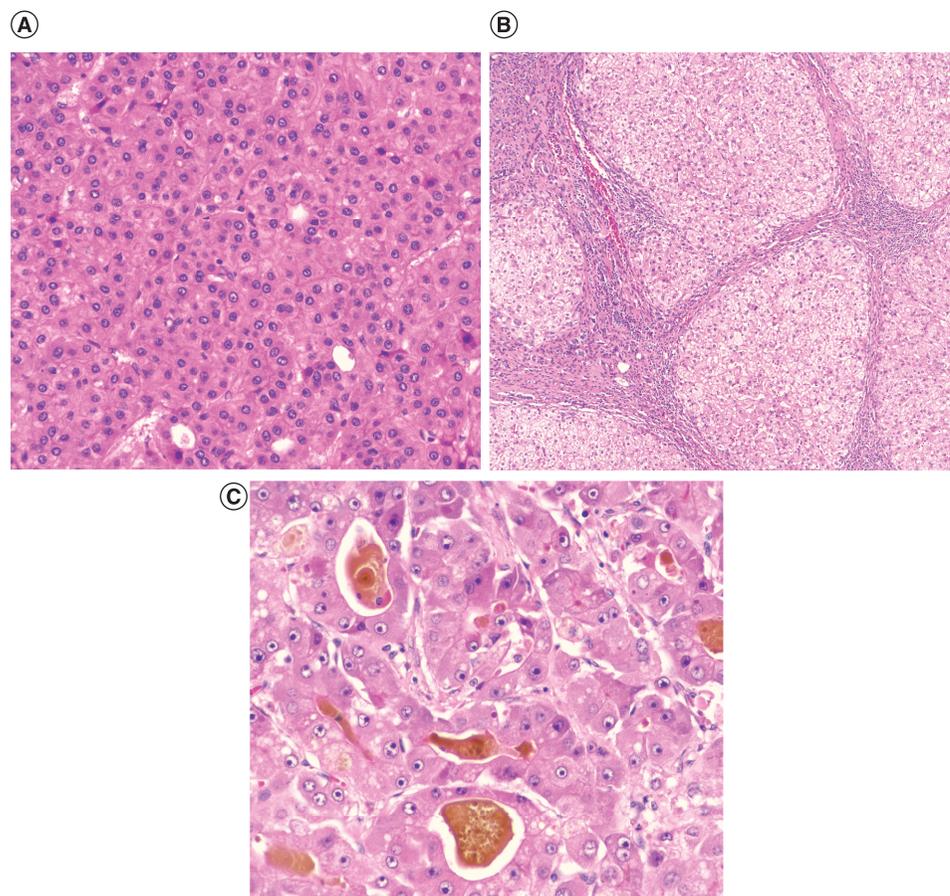
## Results

### Patient characteristics

Of the eighteen HCC patients, thirteen patients (72.2%) were male and five (27.7%) were female. Patient age ranged from 50 to 75 years (mean: 61 years; median: 60 years). The ethnicities of the patient cohort included Caucasian (n = 9), Hispanic (n = 8) and Asian (n = 1). The etiology of cirrhosis of the background liver included hepatitis B virus (n = 1), hepatitis C virus (n = 3), hepatitis B and C virus (n = 2), nonalcoholic steatohepatitis (n = 6), alcoholic steatohepatitis (n = 2), alpha-1 antitrypsin deficiency (n = 2), hemochromatosis (n = 1) and autoimmune hepatitis (n = 1). These characteristics are summarized in [Table 1](#).

### Pathologic characteristics

All cases of small early HCC ([Figure 1A](#)) with background cirrhosis ([Figure 1B](#)) and progressed HCC ([Figure 1C](#)) were untreated and did not have extrahepatic disease. According to the HCC subtypes defined by the WHO eighth edition, subtypes included the steatohepatitic variant (n = 4) and lymphocyte-rich HCC (n = 1) ([Table 2](#)) [21]. Cases with  $\geq 90\%$  steatohepatitic morphology were classified as the steatohepatitic subtype. Three cases also showed a smaller amount ( $\leq 50\%$ ) of steatohepatitic morphology and were characterized as HCC, NOS, with partial steatohepatitic morphology, for the purposes of the current study. The remaining ten cases did not fit any subtypes defined by the WHO and were categorized as HCC NOS. Three of the eighteen cases had intratumoral cholestasis and pseudoglandular architecture, including one small early HCC and two small progressed HCCs.



**Figure 1. Cirrhosis and hepatocellular carcinoma. (A)** Small early hepatocellular carcinoma (HCC) (400x, hematoxylin and eosin [H&E] stain). **(B)** Background cirrhosis of small early HCC (100x, H&E stain). **(C)** Small progressed HCC (400x, H&E stain).

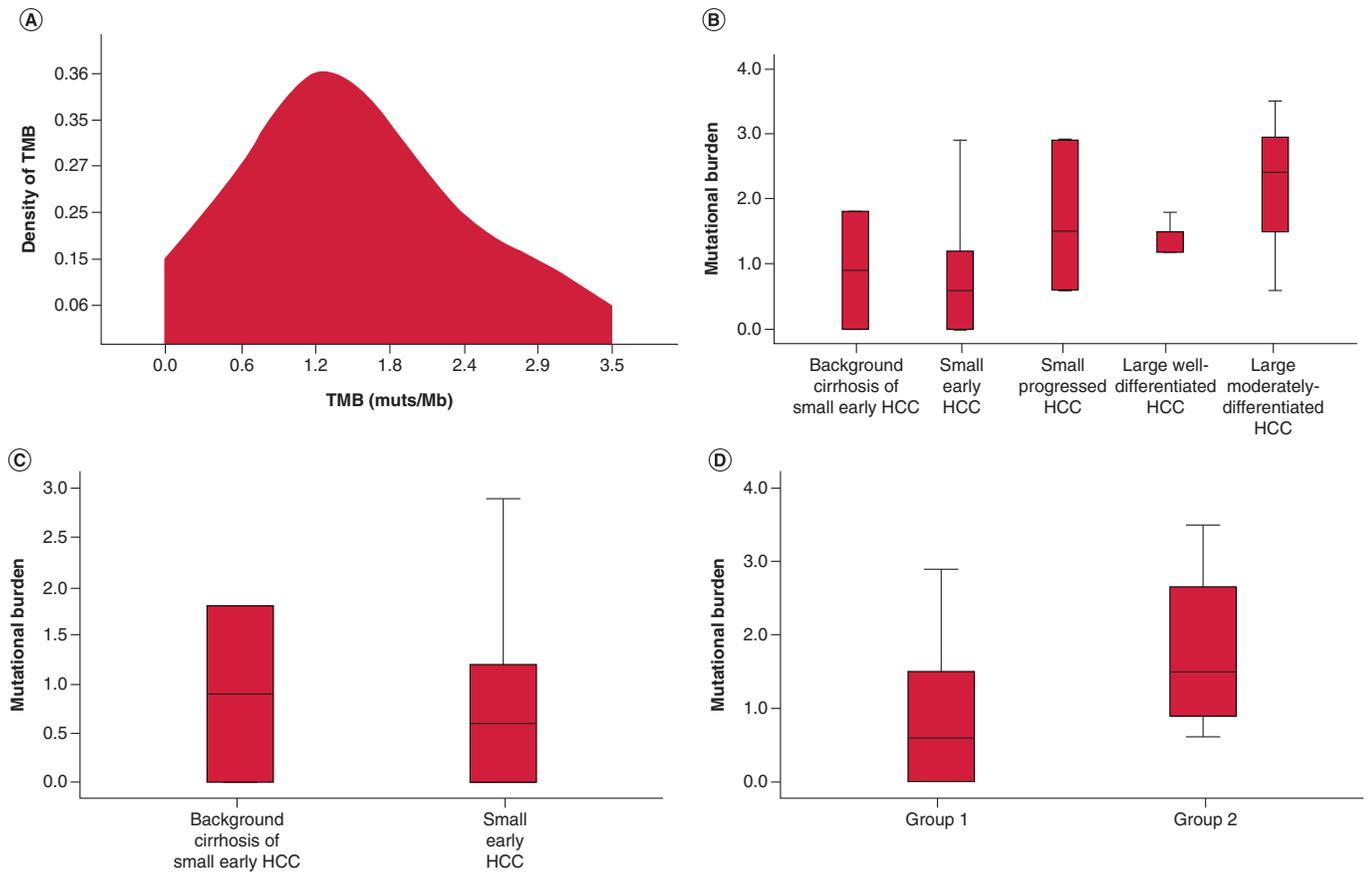
Table 3. Pathological characteristics of HCC.			
WHO criteria of HCC by size	Mean size, cm (range)	LVI, n (%)	pT stage
Small early HCC (n = 6)	0.72 (0.5–1.0)	0 (0%)	T1a (n = 1), T2 (n = 5)
Small progressed HCC (n = 6)	0.98 (0.7–1.5)	0 (0%)	T1a (n = 5), T2 (n = 1)
Large well-differentiated HCC (n = 3)	9.4 (2.0–19.8)	0 (0%)	T1b (n = 2), T2 (n = 1)
Large moderately-differentiated HCC (n = 3)	3.9 (3.0–5.2)	0 (0%)	T1b (n = 2), T3 (n = 1)

HCC: Hepatocellular carcinoma; LVI: Lymph-vascular invasion; pT stage: Pathologic tumor stage.

Pathological features, including size, lymph–vascular invasion and pathological tumor stage, were evaluated in each HCC category and stratified by early versus progressed status (Table 3). All small and large HCCs were adequately sampled and evaluated based on the WHO criteria for differentiation [21].

### Mutational burden

The mutational burden across all cases had low TMB based on pan-cancer definitions of low, intermediate, and high TMB, including background cirrhosis, with mutational burden ranging from 0 to 3.5 muts/Mb [11–14]. The distribution of TMB in the 18 HCC tumor samples is shown in Figure 2A, ranging from 0 to 3.5 muts/Mb. The mean TMB for the entire cohort of HCCs was 1.4 muts/Mb. The mean mutational burdens for cirrhosis, small early HCC, small progressed HCC, large well-differentiated HCC and large moderately-differentiated HCC were 0.9, 0.8, 1.7, 1.4 and 2.2, respectively (Figure 2B).



**Figure 2. Mutational burden in background cirrhosis and hepatocellular carcinoma tumor samples. (A)** TMB distribution in hepatocellular carcinoma (HCC) tumor samples and density of tumor mutational burden (TMB) represent the percentage of HCC at different TMB values. **(B)** Mutational burden in cirrhosis and early and progressed HCCs. **(C)** Mutational burden in the background cirrhosis (of small early HCC) vs small early HCC themselves. **(D)** Mutational burden in cirrhosis and small early HCC (group 1) versus small and large progressed HCC (group 2). HCC: Hepatocellular carcinoma; TMB: Tumor mutational burden.

#### *Background cirrhosis of small early HCC versus small early HCC*

The mutational burden for background cirrhosis ranged from 0 to 1.8 muts/Mb, with a mean value of 0.9 muts/Mb. TMB for small early HCCs ranged from 0 to 2.9, with a mean value of 0.8 muts/Mb. There was no significant difference in TMB between background cirrhosis in small early HCCs and small early HCCs ( $p = 0.87$ , Figure 2C).

#### *Small early HCC versus small progressed HCC*

TMB for small progressed HCCs ranged from 0.6 to 2.9 muts/Mb, with a mean value of 1.7 muts/Mb. There was no significant difference in TMB between small early HCC and small progressed HCC ( $p = 0.19$ ).

#### *Small HCC versus large HCC*

TMB for all small HCCs ranged from 0 to 2.9 muts/Mb, with a mean value of 1.3 muts/Mb. TMB for all large HCCs ranged from 0.6 to 3.5 muts/Mb, with a mean value of 1.8 muts/Mb. There was no significant difference between small HCC and large HCC ( $p = 0.29$ ).

#### *Large well-differentiated HCC versus large moderately-differentiated HCC*

TMB for large well-differentiated HCCs ranged from 1.2 to 1.8 muts/Mb, with a mean value of 1.4 muts/Mb. TMB for large moderately-differentiated HCCs ranged from 0.6 to 3.5 muts/Mb, with a mean value of 2.2 muts/Mb. There was no significant difference between small HCC and large HCC ( $p = 0.66$ ).

*Small early HCC & background cirrhosis versus small & large progressed HCC*

For additional comparison, small early HCC and its background cirrhosis were grouped together (group 1) for comparison to small progressed HCCs and large progressed HCCs (group 2). The mean TMB for group 1 was 0.9 muts/Mb, compared with 1.7 muts/Mb for group 2 ( $p = 0.045$ , Figure 2D).

**Relationships between TMB & HCC for viral etiologies versus nonviral etiologies**

TMB for HCCs with HBV and/or HCV etiologies ( $n = 6$ ) ranged from 0.0 to 2.9 muts/Mb, with a mean value of 0.88 muts/Mb. TMB for HCCs with nonviral etiologies ( $n = 12$ ) ranged from 0.6 to 3.5 muts/Mb, with a mean value of 1.7 muts/Mb. Though there was no significant difference between HCC for viral versus nonviral etiologies ( $p = 0.085$ ), the samples are too small to draw any firm conclusions.

**Relationships between TMB & morphologic findings in HCC**

Three cases with cholestasis and pseudoglandular architecture had TMBs ranging from 0.6 to 2.9 muts/Mb, with a mean of 1.6 muts/Mb. The remaining fifteen cases without cholestasis had TMBs ranging from 0 to 3.5 muts/Mb, with a mean of 1.4 muts/Mb. There was no significant difference in TMB between HCC with and without cholestasis ( $p = 0.86$ ). Seven cases with steatohepatic features had TMBs ranging from 0 to 2.4 muts/Mb with a mean of 0.9 muts/Mb. The remaining eleven cases without steatohepatic features had TMBs ranging from 0 to 3.5 muts/Mb, with a mean of 1.6 muts/Mb. There was no significant difference between TMB in HCC with steatohepatic features versus TMB in HCC without steatohepatic features ( $p = 0.12$ ).

**Discussion**

Extensive research on TMB in HCC has demonstrated a correlation between higher TMB and poor prognosis. These HCCs exhibit an immune-rich microenvironment and tend to be inflammation-driven, which makes them candidates for immune checkpoint inhibitors. However, no studies have examined the differences in mutational burden in background cirrhosis versus HCC in varying stages of development. This pilot study addresses whether TMB values change during carcinogenesis of HCCs and if TMB values can be helpful in the diagnostic workup of HCCs.

In the current cohort, all cases of HCC and background cirrhosis were found to have relatively low mutational burden, consistent with previous literature [11–14]. There was no significant difference in TMB between the cohorts of HCC when stratified by size, early versus progressed status or differentiation (well vs moderately differentiated). However, when cirrhosis and small early HCCs were considered together, there was a significant difference versus small and large progressed HCCs. These findings suggest that while small early HCCs have a similar mutational burden to background cirrhosis, mutational burden may progress with histology irrespective of tumor size.

In clinical practice, differentiating between high-grade dysplastic nodules and well-differentiated HCC can be a diagnostic conundrum, as morphology alone may not suffice. Heat-shock protein 70 (HSP70), glutamine synthetase (GS) and glypican-3 (GPC3) immunostains, can be helpful in supporting the diagnosis of well-differentiated HCC with increased reliability and objectivity [22,23]. Sensitivity for detection of HCC is 58.7% with two positive immunostains and 25.0% with three positive immunostains while combined positivity for either two or three immunostains is 100% [22]. However, if only one of these three immunostains is positive, the sensitivity for detection of HCC is 93.5%, but specificity drops to 85.7%, as 14.3% of high-grade dysplastic nodules are positive for one immunostain [22]. Even with the aid of immunohistochemistry, differentiating a well-differentiated HCC from a high-grade dysplastic nodule remains challenging. Thus, additional molecular techniques may be useful in resolving this difficult histological differential diagnosis.

The current study found that there was no significant difference in mutational load between small early HCCs and the background cirrhotic liver ( $p = 0.87$ ). While mutational burden was not directly evaluated in high-grade dysplastic nodules, the similarity of mutational burden between background cirrhotic liver and small early HCC suggests that mutational burden is not a useful diagnostic tool for distinguishing between high-grade dysplastic nodule and small early HCC.

The molecular subtyping of HCC has been expanding as increasing numbers of molecular alterations are identified in HCC [15,24,25]. Studies have shown that the phenotypes of HCC have been linked to specific genetic mutations, oncogenic pathways and/or gene expression profiles [25]. Though specific mutations were not evaluated in the current study, three HCC cases (one small early HCC and two small progressed HCCs) in the current cohort had cholestasis, pseudoglandular architecture and lack of inflammatory infiltrates, a morphological phenotype that

has been associated with *CTNNB1* mutations [25–27]. Previous studies of HCC mutation profiles showed a positive correlation between high TMB and *CTNNB1* mutations [12,28]. However, TMB in these three cases of HCC in the current study were on the lower end of the TMB spectrum. Additional studies with identification of genetic alterations and molecular subtypes are needed, and may yield a deeper insight to the biology and pathogenesis between cirrhosis, precursor lesions and HCC.

Another example of phenotypes of HCC linked to genetic alterations is steatohepatic HCC [25,27]. Investigators have found that this subtype of HCC falls into the nonproliferative category of the transcriptomic categorization of HCC, which is characterized by well-differentiated morphology, maintenance of hepatocytic markers and chromosomal stability [25,27]. In the current cohort, there were seven HCC cases with steatohepatic features that had lower TMB with a mean of 0.9 muts/Mb. Steatohepatic HCC falls into the G4 transcriptomic subgroup, which shares a similar gene expression profile to non-neoplastic mature hepatocytes [24,25,27]. This may explain the less aggressive histological phenotype of steatohepatic HCC with a lack of satellite nodules and vascular invasion [27]. In the current study, steatohepatic HCCs exhibited this less aggressive histological phenotype and showed a trend toward lower TMB than HCCs without steatohepatic features. Although this trend was not statistically significant ( $p = 0.12$ ), this finding further suggests that steatohepatic HCC may represent a unique biological subtype of HCC and is in keeping with a low proliferation transcriptomic phenotype.

In other tumor types, such as colon and lung, high TMB has been associated with microsatellite instability, and lymphocyte-rich tumors have been associated with microsatellite instability and/or high TMB [29–35]. In contrast, lymphocyte-rich HCC (also known as lymphoepithelioma-like HCC) is not associated with microsatellite instability or a high number of somatic mutations [36,37]. In the current study, the case of lymphocyte-rich HCC also showed a lower TMB score of 1.0 muts/Mb, consistent with the previous literature.

The current study was undertaken to examine mutational burden in background cirrhosis, small early HCC and progressed HCC. The authors acknowledge there are limitations to this pilot study. One possible limitation was that TMB was calculated utilizing a targeted NGS panel. This raises the possibility of bias versus the gold standard of whole exome sequencing (WES). However, multiple prior studies have shown high concordance with the TMB value produced by the assay utilized in this study and those from both other targeted panels and WES [38,39]. A further limitation of the study is the small number of cases in the cohort, limiting the power of the study. With a small number of HCC cases, there was no control for variable histological subtypes of HCC, molecular subtypes of HCC or the etiology of chronic liver disease. Further studies with larger pure cohorts of cases are needed to evaluate and control for these factors.

## Conclusion

There was no significant difference in TMB between the cohorts of HCC when stratified by size, progression (early vs progressed status), morphology or differentiation (well vs moderately differentiated) in this pilot study. However, there was a significant difference between cirrhosis/small early HCC versus small and large progressed HCC, suggesting that TMB may be associated with histological progression. While high-grade dysplastic nodules were not specifically studied, the lack of a difference in mutational burden between small early HCC and its background cirrhosis suggests that TMB is not useful as a diagnostic tool to distinguish between these two entities. Thus, the practical message of this study is that TMB does not appear to be a useful marker to differentiate cirrhotic and dysplastic nodules from early HCC. Future studies are needed to address TMB in specific histological and molecular subsets of HCC and in HCC arising from different etiologies of chronic liver disease.

## Future perspective

Static pan-cancer cutoffs for low-, intermediate- and high-TMB cutoffs are currently being utilized in clinical practice. However, the landscape of TMB will likely change, as it moves toward values that are tissue specific and percentile based in the future [7]. While TMB is generally considered low compared with other carcinomas, as more research is done on TMB in HCCs, a subset of HCCs may be considered to have high TMB within the tissue-specific HCC cutoffs. Studying TMB in specific histological and molecular subsets of HCC and in HCC arising from different etiologies of chronic liver disease may also provide insight into the pathobiology of HCC and its response to immunotherapy.

### Summary points

- While studies have shown that tumor mutational burden (TMB) is generally lower in the majority of hepatocellular carcinomas (HCCs) compared with other carcinomas, prior studies have not investigated TMB in non-neoplastic cirrhotic liver compared with small early HCC and progressed HCC.
- This study investigated whether there were differences in mutational burden between background cirrhosis, small early HCC, small progressed HCC and large HCC.
- There was no significant difference in TMB between the cohorts of HCC when stratified by size, progression (early vs progressed), morphology and differentiation (well vs moderately differentiated).
- However, there was a significant difference between cirrhosis and small early HCC versus small and large progressed HCC, suggesting that TMB may be related to HCC progression.
- The similarity in mutational burden of background cirrhosis and small early HCC suggests that TMB will not be a useful marker to differentiate cirrhotic and dysplastic nodules from early HCC.
- Further studies are needed to address TMB in histological and molecular subsets of HCC and in HCC arising from different etiologies of chronic liver disease.

### Author contributions

Each co-author listed participated sufficiently in the work to take responsibility for the content.

### Financial & competing interests disclosure

The authors have no relevant affiliations or financial involvement with any organization or entity with a financial interest in or financial conflict with the subject matter or materials discussed in the manuscript. This includes employment, consultancies, honoraria, stock ownership or options, expert testimony, grants or patents received or pending, or royalties.

No writing assistance was utilized in the production of this manuscript.

### Ethical conduct of research

Appropriate institutional review board approval was obtained.

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