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ORIGINAL ARTICLE

TSC1/2 mutations define a molecular subset of HCC with aggressive behaviour and treatment implication

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ABSTRACT

Objective We investigated the mutational landscape of mammalian target of rapamycin (mTOR) signalling cascade in hepatocellular carcinomas (HCCs) with chronic HBV background, aiming to evaluate and delineate mutation-dependent mechanism of mTOR hyperactivation in hepatocarcinogenesis.

Design We performed next-generation sequencing on human HCC samples and cell line panel. Systematic mutational screening of mTOR pathway-related genes was undertaken and mutant genes were evaluated based on their recurrence. Protein expressions of tuberous sclerosis complex (TSC)1, TSC2 and pRPS6 were assessed by immunohistochemistry in human HCC samples. Rapamycin sensitivity was estimated by colony-formation assay in HCC cell lines and the treatment was further tested using our patient-derived tumour xenograft (PDX) models.

Results We identified and confirmed multiple mTOR components as recurrently mutated in HBV-associated HCCs. Of significance, we detected frequent (16.2%, n=18/111) mutations of *TSC1* and *TSC2* genes in the HCC samples. The spectrum of *TSC1/2* mutations likely disrupts the endogenous gene functions in suppressing the downstream mTOR activity through different mechanisms and leads to more aggressive tumour behaviour. Mutational disruption of *TSC1* and *TSC2* was also observed in HCC cell lines and our PDX models. *TSC*-mutant cells exhibited reduced colony-forming ability on rapamycin treatment. With the use of biologically relevant *TSC2*-mutant PDXs, we demonstrated the therapeutic benefits of the hypersensitivity towards rapamycin treatment.

Conclusions Taken together, our findings suggest the significance of previously undocumented mutation-dependent mTOR hyperactivation and frequent *TSC1/2* mutations in HBV-associated HCCs. They define a molecular subset of HCC having genetic aberrations in mTOR signalling, with potential significance of effective specific drug therapy.

INTRODUCTION

Liver cancer (hepatocellular carcinoma (HCC)) is a major malignancy worldwide and the second most common fatal cancer in China, including Hong Kong and Southeast Asia. About 55% of all new cases worldwide occur in China.^{1 2} Chronic HBV infection is the major underlying risk factor. HCC is deadly because of high recurrence rate even after

Significance of this study

What is already known on this subject?

- Hepatocellular carcinoma (HCC) is a common cancer and leading cause of death worldwide.
- HCC is heterogeneous with various risk factors including viral infection (HBV and HCV), alcoholism and exposure to aflatoxin B1.
- Activation of mammalian target of rapamycin (mTOR) signalling cascade is resulted from ligand-dependent signals from epidermal growth factor and insulin-like growth factor signalling.

What are the new findings?

- There are frequent mutational disruptions on multiple key and canonical components of mTOR signalling cascade.
- Mutation-dependent mechanism is likely to be another major cause leading to mTOR hyperactivation.
- *Tuberous sclerosis complex (TSC)1* and *TSC2* are the most frequently mutated mTOR pathway-related genes and they collectively define a novel molecular subset of human HCCs with more aggressive tumour behaviours.
- Our study signifies personalised therapeutic option for a novel molecular subset of patients with susceptible mutant HCC through the inhibition of mTOR signalling.

How might it impact on clinical practice in the foreseeable future?

- *TSC1/2* mutations represent one of the most frequent single categories of genetic alterations found in human HCC and mTOR signalling cascade represents one of the most prominent therapeutic targets in HCC.
- There is frequent mutation-dependent mTOR hyperactivation, which defines a novel molecular subset of human HCC and is likely to be actionable through inhibition by rapamycin or its derivatives.
- Through perfect combination of both high-throughput next-generation sequencing-based mutation screening and patient-derived tumour xenograft model, our study demonstrates, with necessary supportive evidence correlating mutational findings and drug testing, the potential personalised treatment on relevant patients with HCC carrying specific molecular alterations.



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surgical resection and frequent metastasis. Unfortunately, the overall response rate of patients with HCC to chemotherapy is unsatisfactory due to the highly chemoresistant nature of the tumour and the toxicity of the chemotherapeutic agents. On the other hand, Sorafenib, a multiple tyrosine-kinase inhibitor and the only Food and Drug Administration-approved molecularly targeted drug for HCC, has demonstrated only a modest survival benefit in patients with HCC, with the median survival only 2–3 months longer than the placebo arm in large-scale trials in both Caucasians and Asians.^{3,4} There is an urgent need to identify strategic molecular targets for developing new and effective molecularly targeted therapy. In this regard, investigation of the mutational landscape of HCC by next-generation sequencing (NGS) for novel, recurrently mutated targets with therapeutic implication would be valuable and would help in rational designing of personalised treatment strategy for patients with HCC.

Recent studies have demonstrated phosphoinositide 3-kinase (PI3K)/protein kinase B (PKB/AKT)/mammalian target of rapamycin (mTOR) signalling pathway to have pivotal role in cancers, including HCC.^{5,6} Components of mTOR signalling pathway are frequently upregulated in human HCCs.⁷ Activation of mTOR signalling cascade was believed to be the result of ligand-dependent signals from epidermal growth factor and insulin-like growth factor signalling, rather than from a mutation-dependent mechanism.⁶ In accordance, reported literature has revealed low frequency of mutations in mTOR signalling pathway.⁷

To systematically exploit the mutational landscape of mTOR signalling cascade in chronic HBV background, we performed deep NGS-based targeted DNA sequencing (targeted-seq) on a panel of 81 selected mTOR pathway-related genes using a large cohort of 95 HBV-associated HCC cases. This initial observation was further augmented by mutational screening using whole-exome sequencing (WES) on 16 additional HBV-associated HCC cases, as well as whole-transcriptome sequencing (WTS) and Sanger sequencing in a panel of HCC cell lines. We found frequent mutations on various components of mTOR signalling cascade. Among the mutant mTOR-related genes identified, *tuberous sclerosis complex (TSC) 1* and *TSC2* were found to be the most frequently mutated in HCC tumour samples. Such frequent mutational disruption of *TSC1/2* complex, which plays negative regulatory on Rheb and in turn inactivates mTORC1 activity, would likely result in hyperactivation of mTOR signalling as suggested by immunohistochemistry (IHC) staining. Of note, we further provide the necessary therapeutic implication of *TSC* mutations by subjecting relevant *TSC*-mutant cell lines and in-house established patient-derived tumour xenograft (PDX) models to rapamycin treatment and confirmed their hypersensitivity. Overall, our study supports personalised therapeutic option for a novel molecular subset of patients with susceptible mutant HCC, through the inhibition of mTOR signalling.

MATERIALS AND METHODS

Patients and samples

A total of 95 human HCCs were selected from our sample collection to perform deep-targeted-seq. Another 16 pairs of human HCCs and their corresponding non-tumourous livers (NTLs) were used in WES. All patients had chronic HBV infection and were positive for hepatitis B surface antigen in their sera (see online supplementary table S1). The samples were obtained immediately after surgical resection from the operation theatre, frozen in liquid nitrogen and kept at -80°C . Frozen sections were cut from tumour and NTL blocks separately and stained for histological examination to ensure a homogenous

cell population of tissues. Use of human samples was approved by the institutional review board of the University of Hong Kong/Hospital Authority Hong Kong West Cluster (see online supplementary materials and methods for the detailed methodology regarding NGS-based mutation evaluation, subsequent data validation and functional characterisation).

RESULTS

Targeted-seq revealed recurrently mutated genes in mTOR pathway in HCC

To explore the pattern and importance of genetic alterations in mTOR pathway genes, we performed deep-targeted-seq in a large cohort of 95 human HCC tumour samples (targeted-seq cohort) for 81 mTOR pathway-related genes (see online supplementary table S2) selected based on Kyoto Encyclopedia of Genes and Genomes pathway definition and literature search, with mean depth of base coverage of $154.3\times$ (range: 135.9–197.1) (see online supplementary table S3). Normal polymorphic sequence variants were removed by background filtering against reported variants deposited in public repositories. Of the 95 human HCC tumours studied, 69 (73%) carried at least one mutation in our selected mTOR-related gene set. Among the 81 genes, 25 (31%) were found to be recurrently mutated (figure 1A, upper part), while 22 (27%) were singleton (figure 1A, lower part). The remaining 34 genes (42%) showed no mutations in this cohort. All the mutant genes were sorted and tabulated according to their frequency of occurrence (figure 1A) and displayed in a pathway diagram to illustrate their potential roles in the mTOR signalling (figure 1B). In order to identify the potential key signalling components frequently mutated in HCC, we paid particular attention to the top-ranking mutant genes. We found that six genes (and the corresponding proteins), namely *TSC2* (*TSC2*), *HIF1A* (*HIF1 α*), *PABPC3* (*PABPC3*), *RB1CC1* (*ATG17*), *RPS6KA3* (*RSK2*) and *TSC1* (*TSC1*), were frequently affected in more than 5% of the cases in our cohort (figure 1A, top left and figure 1B). The high mutation frequency of these genes uncovered several key nodes in mTOR pathways which, once genetically altered, may support adaptation benefit and provide survival advantage in HCC. This might possibly involve the dysregulation of mTOR signalling activation (*TSC1/2* and *RSK2*), its activity coupling with downstream biological processes including autophagy and protein translation (*ATG17* and *PABPC3*) and intracellular reprogramming for the tumour microenvironment adaptation (*HIF1 α*). Interestingly, from our findings, *mTOR* kinase (2%) and other well-known mediators and regulators such as *PI3K β/γ* (3% and 1%), *PTEN* (1%) and *Akt1/2/3* (1%; 1% and 1%) were found to be mutated only in a very limited subset of the HCC samples and no mutation was found for *Rheb*, which encodes the direct downstream effector of *TSC1/2*.

Frequent *TSC1* and *TSC2* mutations defined a novel subgroup of human HCCs

Currently, no reported NGS studies in HCC have identified these high mutation rates of *TSC1* and *TSC2* in HCC. Our targeted-seq data showed that *TSC2* was the top-listing mutant gene, with mutations found in 12 of the 95 HCC tumours (12.6%). The functionally related *TSC1* mutation was also found in 5 of the 95 tumours (5.3%) (figure 1A, upper part). Of note, four of the five *TSC1* mutants in our cohort were found in the tumours without *TSC2* mutation, thus suggesting a mutually exclusive mutation pattern. This mutually exclusive pattern was also observed in the other top-ranking mTOR mutant genes like *RB1CC1* and *RPS6KA3* (figure 1A, upper

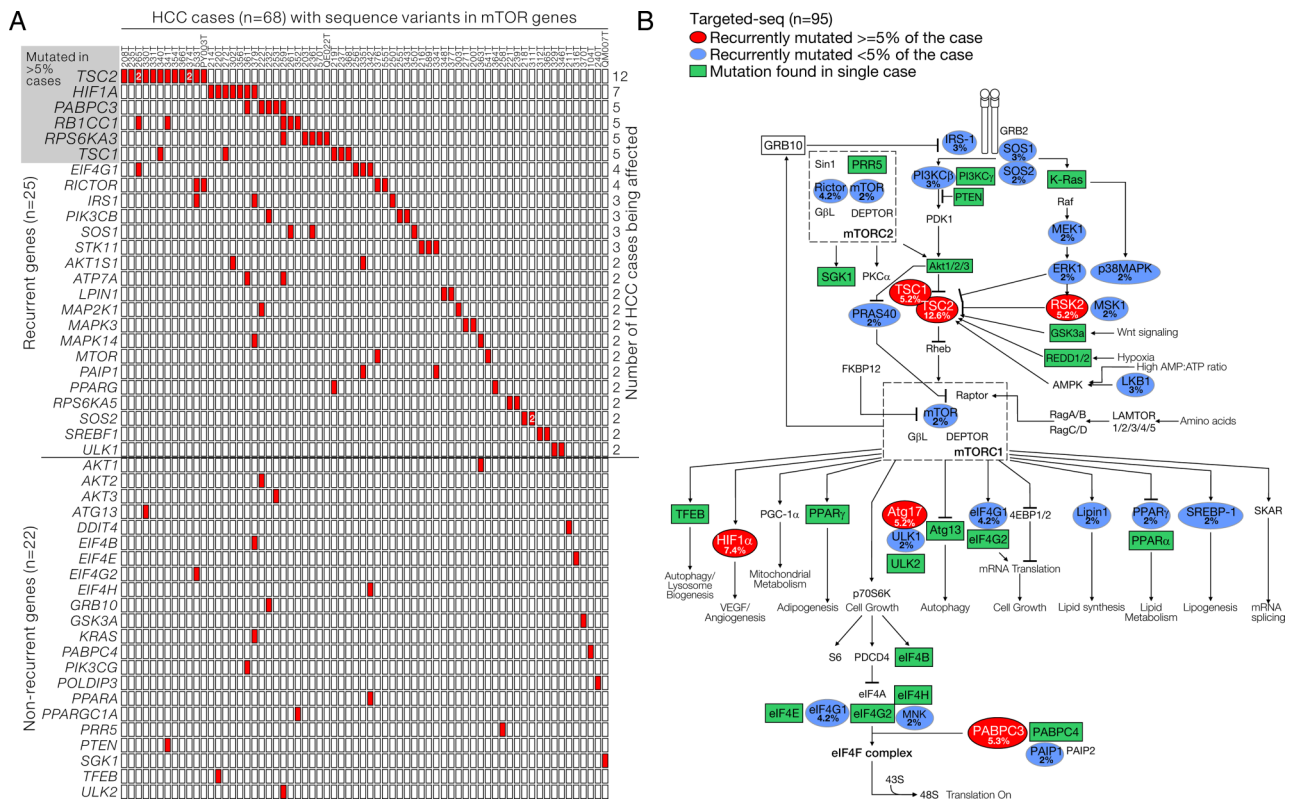


Figure 1 Representations of the targeted DNA sequencing (targeted-seq) for mammalian target of rapamycin (mTOR) pathway-related genes in hepatocellular carcinoma (HCC) discovery cohort. (A) A total of 95 HBV-associated human HCC tumour samples were subjected to targeted-seq for mTOR pathway-related genes. Sixty-nine HCC samples were found to carry at least one mTOR-related mutation. Among the 81 mTOR-related genes being screened, 25 were found to be recurrently mutated in more than one sample, while 22 of them were singleton. The mutant genes were ranked and listed accordingly to their frequency. (B) Schematic diagram visualising the mutants listed in (A) to illustrate their implications in mTOR-related signalling. *TSC*, tuberous sclerosis complex.

part). By further retrieving and analysing the HCC exome sequencing data (n=202) from The Cancer Genome Atlas (TCGA) for the mTOR-related mutants, *TSC2* and *TSC1* were consistently found to be most frequently mutated, affecting 5.9% and 4.95%, respectively, of the total number of cases (see online supplementary figure S1A). *TSC1* and *TSC2* mutations among different cancers were also examined using data from TCGA cancer panel. Among the 25 cancer types being examined, 7 of them, were found to carry *TSC1* and *TSC2* mutations, with HCC ranked second among all the cancer types. High mutation rates of *TSC1* and *TSC2* in HCC and other cancers were likely suggesting the potential involvement of mTOR signalling dysregulation underlying their development (see online supplementary figure S1B). In addition, we compared the coincidence of *TSC* mutation with some of the well-reported HCC-related mutant genes, including *TP53* (p53), *CTNNB1* (β-catenin), *AXIN1* (Axin1) and *ARID1A* (ARID1A) (figure 2A). We found that *TSC* mutations were present irrespective of the genetic background of *TP53* mutation. More importantly, *TSC* mutations likely stratified a novel subgroup of patients whose tumours were not likely to be affected by *CTNNB1*, *AXIN1* and *ARID1A* mutations, in which their mutation rates (range: 11.6%–15.8%) were comparable with *TSC* (figure 2B). We further identified and confirmed two additional *TSC* mutations from our exome sequencing dataset of 16 HCC cases (see online supplementary table S4 and supplementary figure S2). To investigate the clinical significance of this novel genetic subgroup of HCC, the patient samples were stratified into three groups: (1) with *TSC* mutation, (2) with known HCC driver mutation in any

of *TP53*, *CTNNB1*, *AXIN1* and *ARID1A* but not *TSC* mutation and (3) the others without the aforementioned mutations, followed by clinicopathological correlation analysis. Intriguingly, *TSC*-mutated HCCs were significantly associated with more aggressive tumour behaviour including larger tumour size (p=0.034) and presence of venous invasion (p=0.041) (table 1). This observation further provided evidence pointing to the potential tumour suppressive role of the *TSC* complex in human HCC. Loss of function in *TSC* through genetic alteration likely contributes to HCC progression by supporting tumour growth and enhancing cancer metastasis.

Mutations in *TSC1/2* rendered them functionally inactive

We confirmed all the identified *TSC1* and *TSC2* mutations in the tumour samples with independent Sanger sequencing (figure 3A, B, left half of the chromatogram, see online supplementary figure S3A,B). The majority of *TSC1* and *TSC2* mutations were heterozygous, with mutant read frequency at around 50% (figure 3A, B). Thus, noisy and overlapping signals were observed in several HCC cases carrying both copies of the wild type and insertion/deletion (INDEL)-mutant *TSC2* (see online supplementary figure S4). On further examination of the results in the correspondingly NTLs (figure 3A, B, right half of the chromatogram, see online supplementary figure S3B, C), intriguingly, among the 14 *TSC2* variants in 12 HCC cases, 9 (64.3%) were somatic, while the other 5 (35.7%) were not. Among the five *TSC1* variants, two (40%) were confirmed to be somatic, while the remaining three (60%) were not. By combining the mutation data from both the validation and discovery

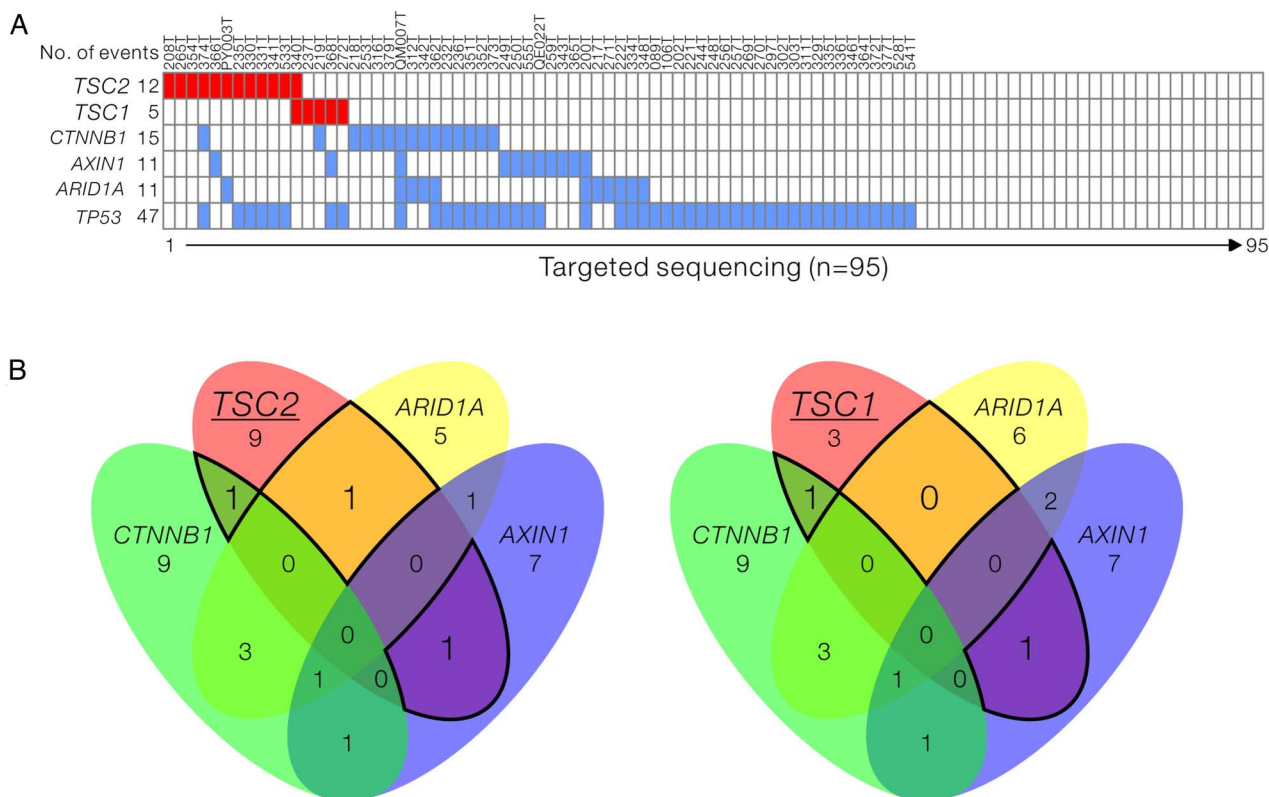


Figure 2 Frequent *tuberous sclerosis complex (TSC)1* and *TSC2* mutations define a novel subgroup of human hepatocellular carcinomas (HCCs). (A) Diagram listing the key genes found to be mutated in our HCC discovery cohort (n=95). *TP53*, *CTNNB1*, *AXIN1* and *ARID1A* are key genes which have been known to be mutated in human HCC. We found that the *TSC1* and *TSC2*, which encodes protein complex as negative regulator of mammalian target of rapamycin signalling, were frequently mutated. (B) Venn diagrams showing the rates of coincidence of *TSC2* or *TSC1* mutations with *TP53*, *CTNNB1*, *AXIN1* and *ARID1A* as highlighted by the black lines.

cohorts, we identified that 13 of the 111 total HCC cases (11.7%) carried *TSC2* mutations and 6 of the 111 HCC cases (5.4%) carried *TSC1* mutations (figure 3C). Overall, *TSC1/2* mutations were found in a total of 16.2% (18/111) of the cases and two-third of them (12/18) carried somatic mutations. By considering the somatic and non-somatic variants as a whole, of the six *TSC1* variants identified, three (50%) were INDEL mutations, two (33.3%) were non-synonymous ones, resulting in single amino acid change, and the remaining one (16.7%) was stop-gain mutation (figure 3D, right panel). The types of *TSC2* mutations identified were more diverse. In addition to non-synonymous mutations (46.7%), INDEL (20%) and two stop-gain mutations (13.3%), splicing-related changes (20%) were also identified in *TSC2* (figure 3D, left panel). Collectively, we predicted that the identified INDEL, stop-gain and splicing-related mutations would pose significant deleterious effects on *TSC1/2* complex and render them functionally inactive. Similarly, non-synonymous mutations were supported by in silico prediction to confer detrimental outcomes on native protein functions. The TSC inactivation was achieved by limiting the key functional domains (*TSC1*-binding and GTPase activating protein (GAP) domains in *TSC2*; *TSC2*-binding domain in *TSC1*) and possibly through a range of mechanisms affecting the other structural regions in *TSC1* and *TSC2* proteins (figure 3E).

***TSC1* and *TSC2* expressions were reduced in human HCCs carrying *TSC* mutations**

We examined the protein expression levels of *TSC1* and *TSC2* in human HCCs by IHC in the 12 cases carrying somatic *TSC* mutations. By scoring the intensity of *TSC1* and *TSC2* staining,

we demonstrated a trend ($p=0.05$) of downregulation in *TSC* expression in human HCCs with *TSC* mutations, when compared with the NTLs (figure 4A). Increase of S6 protein phosphorylation was consistently observed in representative cases carrying somatic *TSC2* mutations (figure 4B and see online supplementary figure S5A, B). In contrast, we observed some *TSC2* expression in HCC cases carrying wild-type *TSC2*. More importantly, these wild-type cases showed low phospho-S6 signals in the tumours (figure 4C). Collectively, our results suggest that *TSC2* mutations downregulates the TSC protein expression, which in turn upregulates mTOR activity, as shown by the increased phosphorylation of its downstream substrate.

Mutational status of *TSC1* and *TSC2* in HCC cell lines

Next, we examined the *TSC1* and *TSC2* mutational status in HCC cell lines. On WTS of seven HCC cell lines (BEL7402, HepG2, Hep3B, Huh7, MHCC97L, PLC and SMMC), we found that PLC cells carried *TSC2* mutation (figure 5A), which resulted in the N1651S amino acid substitution at the C-terminal Rap-GAP domain. This mutation was confirmed by Sanger sequencing (figure 5B, E). Immunoblotting for *TSC1* and *TSC2* with corresponding specific antibodies revealed undetectable *TSC1* plus a very low level of *TSC2* expression in H2P and H2M cells (a pair of HCC cell lines with different metastatic potential established from the same patient) (figure 5C). By Sanger sequencing, we further uncovered that the undetectable *TSC1* protein expression in H2P cells were resulted from the c.C1525T substitution which leads to the premature stop gain. In addition, H2P cell was also found to carry a *TSC2* c.A2833G substitution which leads to a K945D

Table 1 Clinicopathological correlation of patient with HCC samples carrying *TSC* mutation and other background mutation*

Parameters	With <i>TSC</i> mutation (n=18)	With known HCC driver mutation† (n=53)	Others (n=40)	p Value‡
Gender				
Male	15 (83.3%)	40 (75.5%)	26 (65%)	0.342
Female	3 (16.7%)	13 (24.5%)	14 (35%)	
Mean age (range)§	50.7 (24–68)	52.4 (29–72)	51.0 (24–74)	0.812
Tumour size				
>5 cm	15 (83.3%)	31 (58.5%)	19 (47.5%)	0.034
≤5 cm	3 (16.7%)	22 (41.5%)	21 (52.5%)	
Background liver disease				
Normal	0 (0%)	0 (0%)	3 (7.5%)	0.350
Chronic hepatitis	8 (44.4%)	22 (41.5%)	17 (42.5%)	
Cirrhosis	10 (55.6%)	31 (58.5%)	20 (50%)	
Liver invasion				
Yes	4 (23.5%)	23 (45.1%)	10 (26.3%)	0.117
No	13 (76.5%)	28 (54.9%)	28 (73.7%)	
Tumour microsatellite formation				
Yes	9 (52.9%)	29 (55.8%)	20 (51.3%)	0.912
No	8 (47.1%)	23 (44.2%)	19 (48.7%)	
Tumour encapsulation				
Yes	5 (27.8%)	18 (34.6%)	15 (39.5%)	0.712
No	13 (72.2%)	34 (65.4%)	23 (60.5%)	
Venous invasion				
Yes	14 (77.8%)	31 (58.5%)	17 (42.5%)	0.041
No	4 (22.2%)	22 (41.5%)	23 (57.5%)	
Cellular differentiation				
Edmondson grade I–II	5 (27.8%)	21 (39.6%)	15 (37.5%)	0.724
Edmondson grade III–IV	13 (72.2%)	32 (60.4%)	25 (62.5%)	
TNM staging				
I–II	4 (22.2%)	19 (35.8%)	19 (47.5%)	0.175
III–IV	14 (77.8%)	34 (64.2%)	21 (52.5%)	

Bold indicates statistically significant p values.

*Patient samples from discovery and validation cohorts (n=111) were stratified into three groups: with *TSC* mutation (n=18), with known HCC driver mutations (n=53) and other mutations (n=40) accordingly.

†Cases that carry no *TSC* mutations but having mutations in any of *TP53*, *CTNNB1*, *AXIN1* and *ARID1A*.

‡Fisher's exact test.

§Analysis of variance.

HCC, hepatocellular carcinoma; TNM, tumour, node, metastases; *TSC*, tuberous sclerosis complex.

mutation at the centre region of *TSC2* (figure 5E). Taken together, we found that two of the eight HCC cell lines (25%) showed *TSC1* and *TSC2* mutations.

mTOR Inhibitor effectively suppressed cell proliferation in *TSC*-mutant HCC cells

Loss-of-function mutation of *TSC1/2* relieves Rheb G-protein from inactivation and leads to hyperactivation of mTORC1 activity. We sought to find out the functional implications of *TSC* mutation in HCC regarding to the tumour sensitivity towards mTOR inhibitor treatment. Eight HCC cell lines with well-defined *TSC1/2* mutation status were plated and subjected to rapamycin treatment at three different concentrations ranging between 1, 10 and 100 nM (figure 5F) for 4 days. Among the six HCC carrying wild-type *TSC1/2*, three of them (Huh7, 97L and

HepG2) were sensitive to rapamycin treatment starting from 10 nM, while the remaining three (SMMC, BEL7402 and Hep3B) were insensitive even at the highest concentration. Interesting, for PLC and H2P cells carrying *TSC1/2* mutations, their proliferation was marked suppressed by rapamycin treatment at the minimal dosage. The hypersensitivity to the low mTOR inhibitor treatment supports the idea that *TSC1/2* mutation may serve as a potential biomarker to assess the reliance of HCC cells on mTOR signalling and predicts their responsiveness to mTOR inhibitor treatment. To further evaluate and mimic the effect of restoration of *TSC2* expression in HCC cells, we stably knocked down Rheb in *TSC2* wild-type SMMC cells and *TSC2*-mutant PLC cells by lentiviral-based small hairpin (sh) RNA approach (see online supplementary figure S6A, B). Although stable shRheb SMMC cells could be established (see online supplementary figure S6C), on the contrary, stable shRheb PLC cells could not be established after lentiviral transduction and subsequent puromycin selection. It was likely that *TSC2* mutation renders PLC cells to be Rheb-dependent and expression of shRNA against Rheb drastically suppressed its proliferation (see online supplementary figure S6D).

TSC2 mutation-bearing HCCs were hyper-responsive to mTOR inhibitor in PDTX model

To further recapitulate our in-vitro observation, we used two of our HCC PDTX models who carried biologically relevant *TSC2* stop-gain mutations (PDTX#5: *TSC2* Q1377X and PDTX#9: *TSC2* Q63X) and a PDTX with wild-type *TSC2* (PDTX#3) as the control. The PDTX models were subjected to rapamycin treatment daily and the body weight and tumour size were monitored. Rapamycin treatment at a concentration of 1.0 and 2.5 mg/kg was both well tolerated, as the body weights of the treatment group were similar to those of the vehicle control (figure 6A). Rapamycin at either 1.0 or 2.5 mg/kg was sufficient to almost completely suppress tumour growth in PDTX#5 (figure 6B, left panel). We then used rapamycin at 1.0 mg/kg as the working concentration. Both PDTX#9 (figure 6B, middle panel) and PDTX#5 (figure 6B, right panel) showed a similar remarkable tumour-suppressive response with rapamycin. In contrast, in PDTX#3 with wild-type *TSC2*, the rapamycin-treated tumours increased in volume progressively, though moderately (figure 6B, right panel). As an indication of poorer response towards rapamycin treatment, the relative tumour volume (rapamycin: vehicle) of PDTX#3 was significantly higher than those of PDTX#5 and PDTX#9, starting from day 12 onwards (t-test, $p < 0.001$) (figure 6C). A greater difference in tumour size between the vehicle-treated and rapamycin-treated tumours (figure 6D) as well as a higher mean tumour mass ratio (vehicle:rapamycin) was seen in both PDTX#5 and PDTX#9, as compared with PDTX#3 (figure 6E). Interestingly, very small tumours with nearly negligible tumour mass were observed in rapamycin-treated tumours in PDTX#5 and PDTX#9 but not PDTX#3. The hyper-sensitivity towards mTOR inhibitor treatment was further supported by the significantly lower relative tumour mass (rapamycin/vehicle) of PDTX#5 and PDTX#9 when compared with PDTX#3 (t-test, $p < 0.001$) at the end point of experiment (figure 6F). Taken together, our results suggested an overall treatment benefit with the use of mTOR inhibitor in HCC and the treatment response was superior especially in those tumours which bore mutations leading to the activation in this pathway. These observations demonstrated and suggested the therapeutic implication and translational potential of the identified *TSC1/2* mutants in human HCCs.

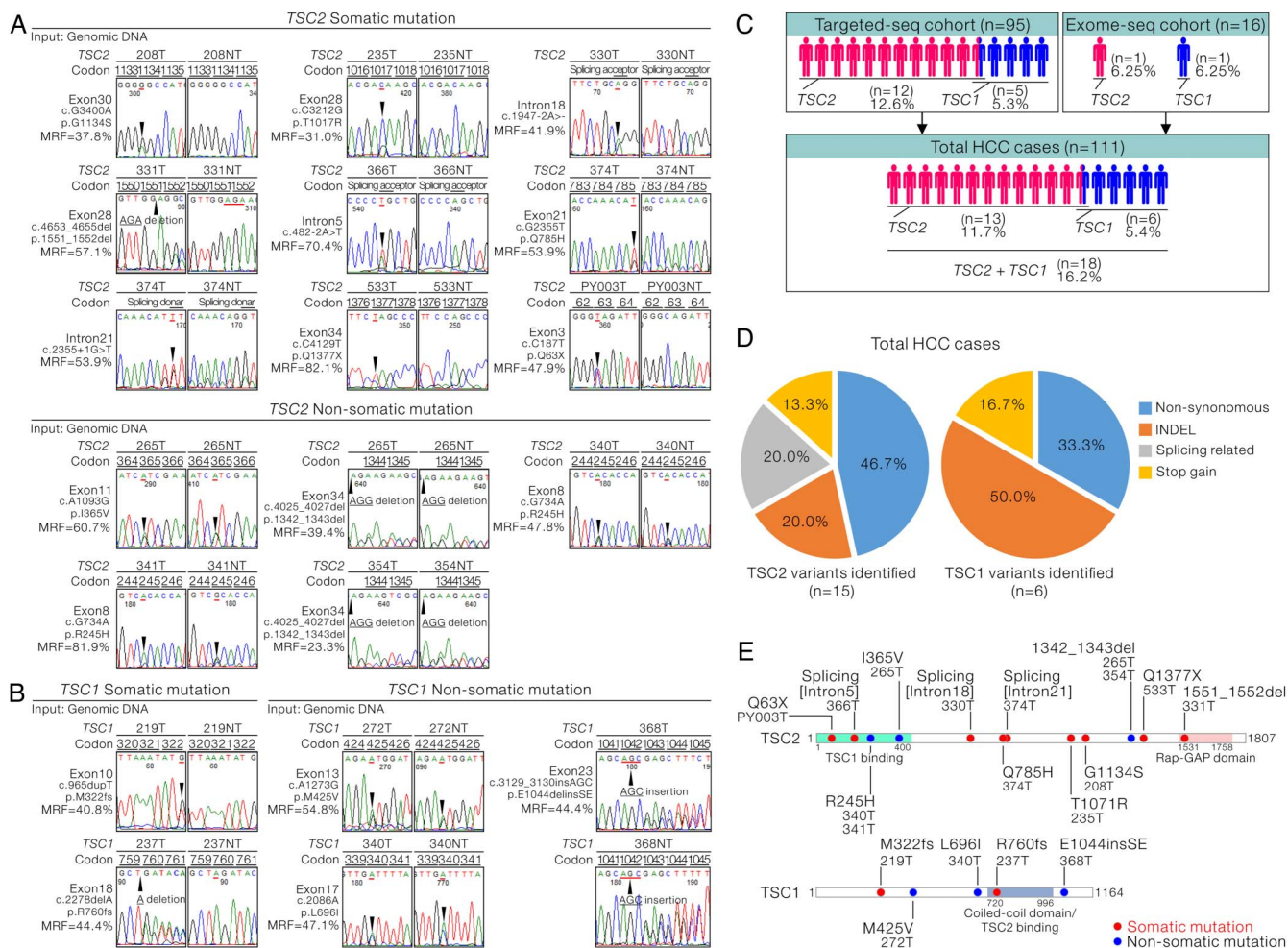


Figure 3 Representations of the confirmation of *tuberous sclerosis complex (TSC)1/2* mutations and their possible effects in negatively regulating their tumour suppressing activity. (A) Sanger sequencing confirmation of the *TSC2* mutations identified from the targeted DNA sequencing (targeted-seq) in both tumours and corresponding non-tumorous livers is shown. The identified mutations were classified as somatic and non-somatic. (B) Sanger sequencing confirmation of the *TSC1* mutations identified from the targeted-seq in both tumours and corresponding non-tumorous livers is shown. The identified mutations were classified as somatic and non-somatic. (C) Flow chart summarising the number of hepatocellular carcinoma (HCC) cases carrying the *TSC1* and *TSC2* mutations in the discovery cohort, validation cohort or the total combined HCC cases. (D) Diagram summarising and categorising the types of *TSC2* (n=15) and *TSC1* (n=6) mutations found in the current study. (E) Schematic diagram showing the alterations of the amino acid changes in *TSC1* and *TSC2* by the identified genetic changes.

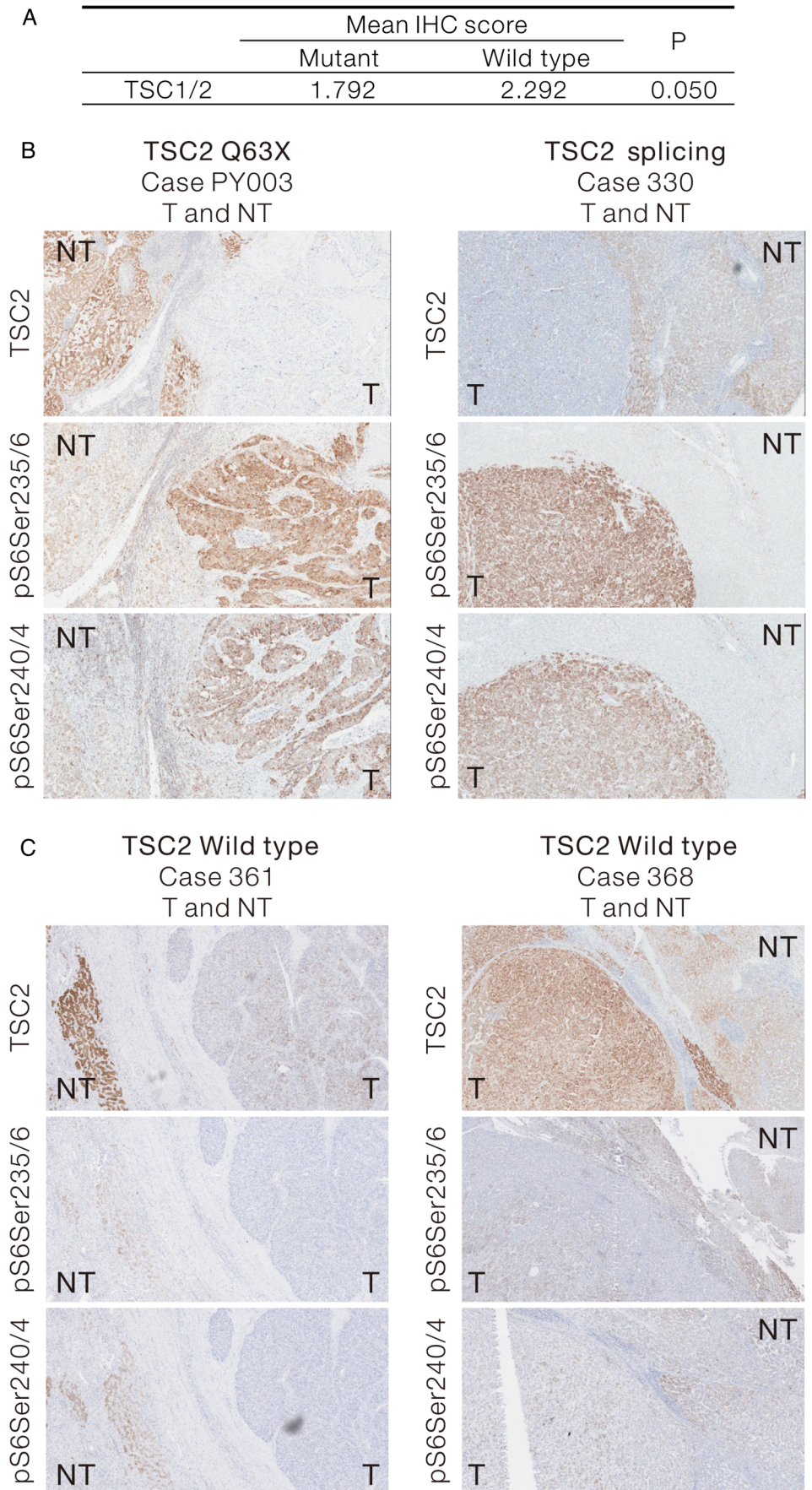
DISCUSSION

Despite mutations have been recurrently detected in genes responsible for cell cycle regulation (*TP53*), cell proliferation (*CTNNB1*) and switch/sucrose non-fermentable (SWI/SNF) ATP-dependent chromatin remodelling (*ARID1A*), consensus among mutations or mutant genes detected in recently performed NGS-based studies is suboptimal. High genetic heterogeneity remains the greatest challenge for the delineation of HCC molecular mechanisms. Based on evidence extracted from our NGS-based datasets, extensive components of mTOR signalling cascade are mutated in human HCCs. These data provide novel insight in suggesting significant mutation-dependent regulation mechanism on mTOR signalling, with multiple key and canonical mTOR pathway-related components being shortlisted and confirmed to harbour frequent mutational disruptions. These gene targets are attractive and potentially promising targets for further investigations to further understand the underlying mechanistic processes in driving mTOR hyperactivation.

PI3K/Akt/mTOR pathway has recently drawn great attention as an alternative therapeutic, druggable pathway in HCC to

enhance the limited survival advantage delivered by sorafenib treatment. Our group and others have previously demonstrated the overexpression of mTOR in more than 50% of the HCCs.^{6,8} mTOR Signalling is tightly regulated by upstream signalling in response to extracellular growth factor, stresses and nutrients. The signalling axis is dually regulated by both phosphatase and tensin homolog (PTEN) and TSC1/2. We had previously shown that PTEN expression was downregulated in our HCCs from patients and the downregulation was associated with increased invasive behaviour in HCC.⁹ Intriguingly, our targeted-seq data further revealed that PTEN was rarely mutated in HCC (identified only in a single case among the 95 patient samples). In the current study, we identified a common mechanism in a subset of patients with HCC carrying *TSC* mutations, which predispose them to have deregulated mTOR activity. Currently, very limited information is known about the expression of *TSC1* and *TSC2* in human HCCs. A single brief report used IHC to demonstrate the under-expression of *TSC2* in human HCCs. The under-expression was also found to be associated with advanced tumour stage, vascular invasion and

Figure 4 Downregulation of tuberous sclerosis complex (TSC)1/2 expression in human hepatocellular carcinoma (HCC) carrying TSC mutations is shown. (A) Twelve HCC samples carrying somatic *TSC1/2* mutations and their corresponding NTL were subjected to IHC staining for *TSC1/2*. The *TSC1/2* staining intensity in the tumour and non-tumour tissues were collectively presented as mean IHC score. Their statistical difference was compared by Wilcoxon signed-rank test (one-sided). (B) Representative IHC images showing the reduced *TSC2* expression in HCC tumours carrying *TSC2* non-sense mutation (*TSC2* Q63X, Case PY003T) and splicing mutation (Case 330T) and their corresponding phospho-S6 staining as downstream markers for mammalian target of rapamycin pathway activation. (C) Representative IHC images showing the *TSC2* expression and the downstream phospho-S6 staining in two HCC cases (*TSC2* WT, Case 361T and Case 368T) with no *TSC2* mutation. IHC, immunohistochemistry; NTL, non-tumorous liver.



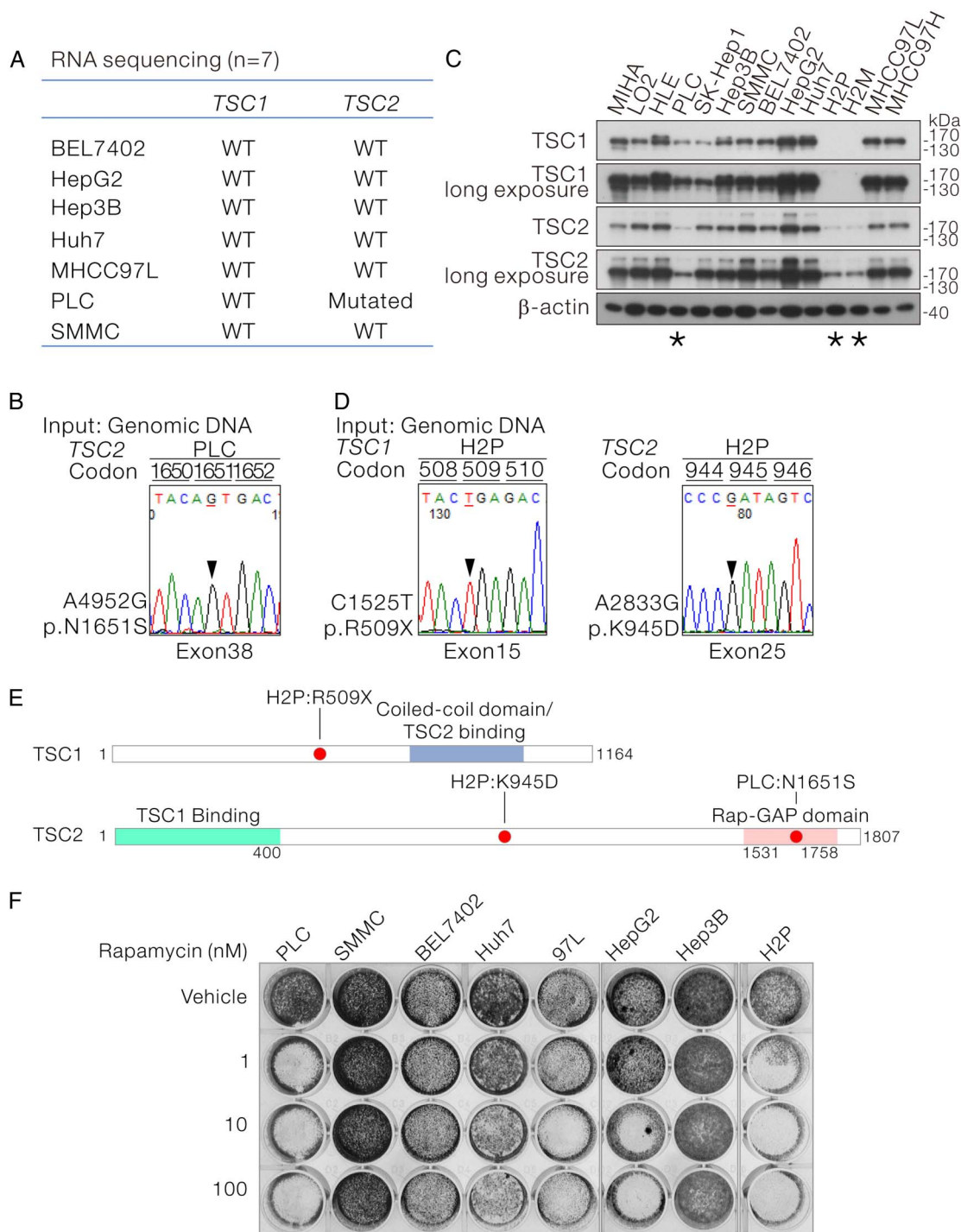


Figure 5 The mutational status and expression of *tuberous sclerosis complex (TSC)1/2* in a panel of human hepatocellular carcinoma (HCC) cell lines and their sensitivity to mammalian target of rapamycin inhibitor treatment are shown. (A) RNA sequencing revealed that PLC HCC cells carried a *TSC2* mutation. (B) The *TSC2* mutation identified by RNA sequencing in PLC was confirmed by Sanger sequencing at genomic level. (C) Protein expression levels of *TSC1* and *TSC2* in a panel of HCC cell lines were determined by western blotting with the use of *TSC1*-specific and *TSC2*-specific antibodies. PLC, H2P and H2M cells showed relatively low *TSC1* as well as *TSC2* protein expression. H2M was derived from H2P. (D) Sanger sequencing revealed a stop-gain mutation in *TSC1* and a missense mutation in *TSC2* in H2P cells. The stop-gain mutation may account for the loss of *TSC1* protein expression in H2P cells. (E) Schematic diagram showing the *TSC1* and *TSC2* mutants identified in PLC and H2P cells. (F) Eight HCC cell lines with defined mutational status of *TSC1/2* were subjected to rapamycin treatment at the indicated concentrations for 4 days, followed by fixation and crystal violet staining for visualisation.

poor prognosis.¹⁰ The inactivation of *TSC1/2* complex has been found to be significantly relevant to HCC development, as elegantly demonstrated by the liver-specific *TSC1* knockout mouse model.^{11 12} Menon *et al* have demonstrated that about 80% of

the *TSC1*-null livers developed spontaneous tumours at the age of 9–10 months and 50% of them resembled HCC. HCC formation in *TSC1* knockout was found to be a result of chronic mTORC1 activation. The involvement of the chronic mTORC1

kinase activity was further supported by the effective blocking of the TSC1-null tumour formation with the early administration of rapamycin at the age of 5 months before the appearance of macroscopic lesion.¹²

In the current study, somatic mutations were detected in known HCC genes including *TP53*, *CTNNB1*, *AXIN1* and *ARID1A*, revealing the significant involvement of genomic aberrations in the relatively better-characterised genes of HCC. In addition, various key components of the mTOR pathway were identified to be altered by somatic mutations, which highlighted its potential importance and possible translational implication through intervention with the use of mTOR inhibitor in susceptible mutant patients. Based on frequency as well as the clinicopathological correlation, *TSC* mutation may likely represent a major single driving factor in hepatocarcinogenesis, which confers at least comparable effect to known HCC drivers such as *TP53*, *CTNNB1*, *AXIN1* and *ARID1A*.

The study reported by Schulze *et al*¹³ and Totoki *et al*¹⁴ are currently the latest and largest one, among the reported NGS-based mutation screening studies. Their findings are based on NGS data of 243 cases and 503 cases, respectively. However, HBV infection only accounted for up to a quarter of their cases while our cohorts were entirely HBV-positive. With our study focusing entirely on HBV-associated HCC, homogeneity of the aetiology hopefully could empower us to achieve better

intra-study consensus, given our limited sample size. We believe such difference in the underlying aetiological risk factor may likely be responsible for the apparently higher frequency of *TSC* mutations detected in our cohorts. Such frequent disruption (>15%) on *TSC* regulation of mTOR activity probably suggests a profound effect of mTOR activation by *TSC* disruption in HBV-associated hepatocarcinogenesis. Intriguingly, in echo with our current findings, we noted two recent studies highlighting the importance of mTOR signalling in HCC. Janku *et al*¹⁵ reported a mutation screening on a confined panel of 182 cancer-related genes. More recently, another study concurrently highlighted the hyperactivation of mTOR signalling in hepatocarcinogenesis. Based on a seemingly retrospective approach in explaining their available clinical trial data on mTORC1 inhibitor everolimus, they provided explanatory data pinpointing on *TSC2* loss-of-function leading to elevated mTOR signalling.¹⁶ More importantly, using HCC cell lines and xenografts, they demonstrated sensitivity to everolimus according to *TSC2* status as assayed by IHC. Their sample collection of Asian HBV-positive HCCs (~20%) frequently identified *TSC2* loss and such patients receiving everolimus tended to have longer overall survival than those receiving placebo. In spite of their nice work in highlighting the therapeutic and prognostic value *TSC2*, the mechanism underlying *TSC2* loss in HCC remains unclear. Beyond what they have reported, our current findings

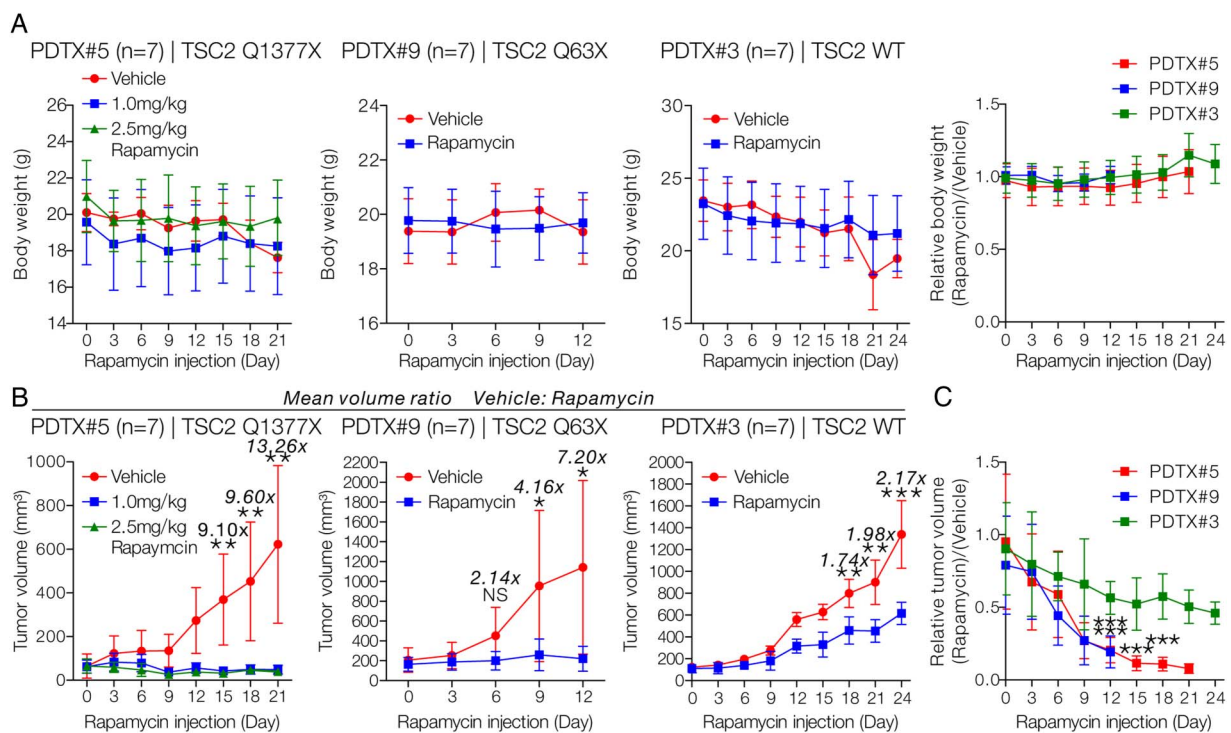


Figure 6 Hepatocellular carcinoma (HCC) patient-derived tumour xenograft (PDX) models with *tuberous sclerosis complex (TSC)2* mutations were more sensitive to mammalian target of rapamycin inhibitor treatment. (A) The graph showing body weight of *TSC2*-mutant (PDX#5 and PDX#9) and *TSC2* wild-type (PDX#3) PDX tumour-bearing mice throughout the treatment. Body weights were measured every 3 days to assess the general toxicity of the injected vehicle and rapamycin. The relative body weights (rapamycin/vehicle) of PDX#5, PDX#9 and PDX#3 mice are shown. (B) The tumour volumes of the PDX tumour-bearing mice subjected to vehicle or rapamycin treatment at 1.0 mg/kg/day, unless stated otherwise, are shown. The volumes of the subcutaneous tumours were measured every 3 days throughout the treatment. The numbers in grey represent the mean volume ratio between the vehicle and rapamycin-treated group at the indicated time points. t-test; **p*<0.05, ***p*<0.01; ****p*<0.001. (C) The relative tumour volumes (rapamycin/vehicle) of PDX#5 and PDX#9 tumours are shown alongside with those of PDX#3. t-test; ****p*<0.001. (D) An overview of the subcutaneous tumours formed and the corresponding dissected tumours at the end point of the experiment is shown. (E) The tumour masses of the dissected tumours at the end point of the treatment are shown. The numbers in grey represent the mean tumour mass ratio between the vehicle and rapamycin-treated groups. t-test; **p*<0.05, ***p*<0.01; ****p*<0.001. (F) The relative tumour masses (rapamycin/vehicle) of PDX#5, PDX#9 and PDX#3 are shown. t-test; ***p*<0.01; ****p*<0.001.

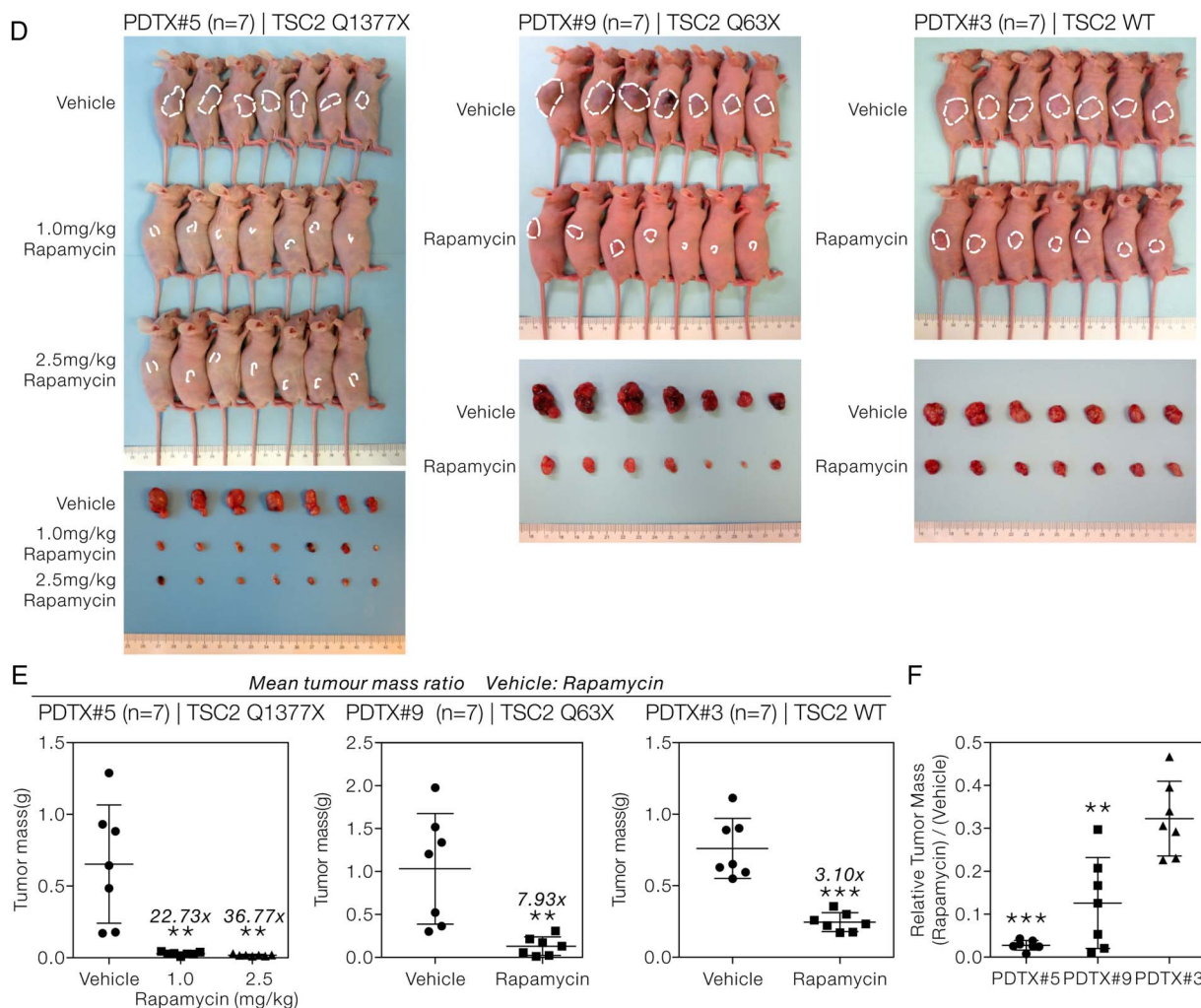


Figure 6 Continued

systematically delineated the comprehensive mutational landscape for mTOR signalling genes and discovered frequent mutations in *TSC1/2* on regulating mTOR signalling. The high frequency of *TSC* mutations has provided key and novel explanation in addressing the underlying molecular mechanism for the *TSC* loss in hyperactivation of mTOR signalling. We further demonstrated, through PDX models carrying *TSC2*-inactivating mutations, that hyperactivation of mTOR signalling via mutational disruption of *TSC* regulation is sensitive to rapamycin treatment. PDXs are established by implanting primary tumours into immunodeficient mice. It provides better conservation and representation of natural tumour heterogeneity and architecture to physiological human tumour. With the use of PDX model, findings of preclinical testing on drug response will be more relevant and predictive than traditional cancer cell line model.¹⁷ Through the perfect combination of both high-throughput NGS-based mutation screening and PDX model, our study demonstrates, with necessary supportive evidence correlating mutational findings with corresponding drug testing, the potential personalised treatment on relevant patients with HCC carrying specific molecular alterations. These preclinical findings open up the possibility for using rapamycin or its subsequent derivatives as an alternative or in complement with sorafenib in treating specific mTOR hyperactivated patients. We believe *TSC* mutations represent one of the major and previously undocumented

mechanisms in leading to mTOR hyperactivation in HBV-associated HCC. Nevertheless, we strongly agree that mTOR inhibition is likely to be a rational therapeutic option for patients demonstrating mTOR hyperactivation, regardless of its underlying mechanism. Therefore, the treatment efficacy of mTOR inhibition treatment would be greatly improved with further exploration and establishment of the stratification strategy on mTOR hyperactivation status not limited to *TSC* mutation.

In summary, our study has substantiated the significance of mTOR signalling in HCC through evidence pinpointing its novel mutational aspect with mutant genes recurrently spotted in multiple cases as well as critical mutants in multiple pathway components. Our findings imply the potentially profound involvement of mTOR signalling in HCC and draw further attention on personalised therapeutic option for a novel molecular subset of patients with susceptible mutant HCC, through the inhibition of mTOR signalling.

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Contributors IOLN and CMW provided study concept and design. DWHH, LKC, MXL and YTC collected and analysed the data. DWHH, LKC, MXL, YTC, IOLN and CMW interpreted the data. LKC, IMJX and YTC performed the experiments. ILOL, DTWY, PWYL, CNT, VWLT, RTPP and TTC collected the patients' samples. LKC, DWHH, IOLN and CMW wrote the manuscript. All authors approved the final version of manuscript.

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