



# **BAP1 mutations define a homogeneous subgroup of hepatocellular carcinoma with fibrolamellar-like features and activated PKA**

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**Background & Aims:** *DNAJB1-PRKACA* fusion is a specific driver event in fibrolamellar carcinoma (FLC), a rare subtype of hepatocellular carcinoma (HCC) that occurs in adolescents and young adults. In older patients, molecular determinants of HCC with mixed histological features of HCC and FLC (mixed-FLC/HCC) remain to be discovered.

**Methods:** A series of 151 liver tumors including 126 HCC, 15 FLC, and 10 mixed-FLC/HCC were analyzed by RNAseq and whole-genome- or whole-exome sequencing. Western blots were performed to validate genomic discoveries. Results were validated using the TCGA database.

**Results:** Most of the mixed-FLC/HCC RNAseq clustered in a robust subgroup of 17 tumors, which all had mutations or translocations inactivating *BAP1*, the gene encoding BRCA1-associated protein-1. Like FLC, *BAP1*-HCC were significantly enriched in females, patients with a lack of chronic liver disease, and fibrotic tumors compared to non-*BAP1* HCC. However, patients were older and had a poorer prognosis than those with FLC. *BAP1* tumors were immune hot, showed progenitor features and did not show *DNAJB1-PRKACA* fusion, while almost none of these tumors had mutations in *CTNNB1*, *TP53* and *TERT* promoter. In contrast, 80% of the *BAP1* tumors showed a chromosome gain

of *PRKACA* at 19p13, combined with a loss of *PRKAR2A* (coding for the inhibitory regulatory subunit of PKA) at 3p21, leading to a high *PRKACA/PRKAR2A* ratio at the mRNA and protein levels.

**Conclusion:** We have characterized a subgroup of *BAP1*-driven HCC with fibrolamellar-like features and a dysregulation of the PKA pathway, which could be at the root of the clinical and histological similarities between *BAP1* tumors and *DNAJB1-PRKACA* FLCs.

**Lay summary:** Herein, we have defined a homogeneous subgroup of hepatocellular carcinomas in which the *BAP1* gene is inactivated. This leads to the development of cancers with features similar to those of fibrolamellar carcinoma. These tumors more frequently develop in females without chronic liver disease or cirrhosis. The presence of PKA activation and T cell infiltrates suggest that these tumors could be treated with PKA inhibitors or immunomodulators.

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## **Introduction**

Fibrolamellar carcinoma (FLC) is a rare subtype of hepatocellular carcinoma (HCC) mostly diagnosed in adolescents and young adults. It was originally defined by specific histological features of both the tumor cells and their stroma, with the presence of abundant fibrosis arranged in a lamellar fashion around deeply eosinophilic large neoplastic hepatocytes, frequent central scar and calcifications.<sup>1,2</sup> FLCs define a specific subgroup of HCC since they have peculiar clinical features compared to classical HCC, such as a young age at onset between 10 to 35 years old, a balanced sex ratio, an absence of underlying liver disease or risk factors and a better prognosis, with 80% survival at 5-years after resection.<sup>3,4</sup> Biologically, FLCs show a high number of mitochondria and progenitor features, suggesting that the tumor cells

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are blocked at a specific stage of differentiation with hepatocellular (HEPAR1), biliary (CK7) and CD68 co-expressed markers.<sup>1,5</sup> In 2014, Honeyman and colleagues discovered a specific 400 kb chromosome deletion at chromosome 19 in FLC leading to a recurrent chimeric *DNAJB1-PRKACA* gene fusion.<sup>6</sup> *DNAJB1* encodes HSP40, a member of the heat shock protein family, while *PRKACA* codes for the cAMP-dependent protein kinase (PKA) catalytic subunit alpha; the chimeric gene results in *PRKACA* catalytic domain overexpression and subsequent PKA activation. In addition, rare FLC without *DNAJB1-PRKACA* fusion were identified in patients with Carney disease due to *PRKAR1A* germline mutations that also led to PKA activation and a similar phenotype.<sup>7</sup> In contrast, PKA activation is only rarely identified in HCC (<1% *GNAS* mutations) or in cholangiocarcinoma (around 6% of *GNAS* mutations and rare fusions of *PRKACA*, *PRKACB* and *PRKAR1B*).<sup>8,9</sup>

Frequently, FLC diagnosis can be difficult and tumors with histological features of both HCC and FLC have been described as mixed-FLC/HCC.<sup>10–12</sup> In comparison with FLC, mixed-FLC/HCC patients were older, all above 35 years, and had a poor prognosis. Moreover, transcriptomic analyses showed a different profile of expression in the mixed-FLC/HCC and a lack of *DNAJB1-PRKACA* fusion.<sup>13,14</sup> Therefore, mixed-FLC/HCC should be better defined in the phenotypic/molecular diversity of liver tumors, in particular to identify similarities and differences with FLC of the young and other HCC subtypes.<sup>12</sup>

In this study, to identify specific molecular driver(s) of the mixed-FLC/HCC subgroup of tumors, we performed an integrated genomic analysis using RNA sequencing (RNAseq) and whole-genome- or whole-exome sequencing (WGS/WES) of 151 liver tumors classified as HCC, FLC and mixed-FLC/HCC by pathological review.

## Material and methods

### Patients and tumors

We assembled a series of 151 patients (LICA-FR cohort) enriched with 15 FLC, 10 mixed-FLC/HCC cases and including 126 HCC controls;<sup>8,15</sup> genomic data (WGS or WES and RNAseq) and data from pathological review were available for all cases (see below). The study was approved by the local Ethics Committee (CCPPRB Paris Saint-Louis IRB00003835), and informed consent was obtained in accordance with French legislation for all patients. Tumor and corresponding non-tumor samples were frozen at -80°C after tumor resection and all tumor samples were primary tumors except 8 samples collected at relapse; clinical features are summarized in Table 1. For validation, we used 345 tumors (339 HCC, 4 FLC, 2 mixed-FLC/HCC) from the TCGA (The Cancer Genome Atlas) cohort,<sup>16</sup> whose clinical features are also described in Table 1.

### Pathological review

Multiple slides of the same tumor were reviewed by at least 2 liver pathologists for several histological criteria previously described<sup>11,17,18</sup> including: tumor differentiation (WHO grade and Edmonson grade), vascular invasion (microscopic), tumor architecture (macrotrabecular, microtrabecular, pseudoglandular), abundant fibrous stroma (>20%), steatosis, histological patterns (scirrhous, macrotrabecular massive), lymphocytic inflammation (>20%), tumor invasion (biliary tract, perineural) and clear cell presence. HCC containing at least 1 area with FLC-like features were annotated as mixed-FLC/HCC as previously described<sup>11</sup>

(Fig. S1). For the TCGA cohort, histological features were reviewed by at least 2 liver pathologists from the virtual slides available online via cBioPortal (<http://www.cbioportal.org/>). Tertiary lymphoid structures were annotated on hematein-eosin-safran slides as in<sup>19,20</sup> for a subset of the LICA-FR cohort (55 tumors) and all tumors from the TCGA cohort.

### Genomic sequencing

A total of 151 tumors and their corresponding non-tumor tissues were sequenced by WES (n = 115 including 43 new cases) or WGS (n = 36 including 3 new cases) as previously described.<sup>8,21,22</sup> For samples without WGS, targeted analysis of *TERT* promoter was performed with Sanger (n = 100) and/or miSeq (n = 38) sequencing as previously described,<sup>8</sup> while *BAP1* was re-sequenced with miSeq technology in 24 samples (the list of primer sequences is provided in Table S1). Copy number analysis was performed as previously described<sup>22</sup> and manually corrected with the help of the GAP tool.<sup>23</sup>

### RNAseq and transcriptomic analyses

mRNAs were extracted from 151 tumor (including 64 new cases) and 3 non-tumor tissues and sequenced using Illumina TruSeq or Illumina TruSeq Stranded mRNA kit, libraries were sequenced by IntegraGen (Evry, France) on an Illumina HiSeq 2,000 or 4,000 paired-end 75 bp or 100 bp reads as previously described.<sup>24</sup> Fastq files were aligned to the reference human genome GRCh38 using TopHat2.<sup>25</sup> Reads mapping to multiple locations were removed and we used HTSeq<sup>26</sup> to obtain the number of reads associated with each gene in the Gencode v27 database, restricting reads to protein-coding genes, pseudogenes, antisense and lincRNAs (n = 58,288). We used the Bioconductor DESeq2 package<sup>27</sup> to import raw HTSeq counts for each sample into R statistical software and applied variance stabilizing transformation to the raw count matrix to obtain an expression matrix without variance-mean dependence (vst matrix). FPKM scores (number of fragments per kilobase of exon model and millions of mapped reads) were calculated by normalizing the count matrix for the library size and the coding length of each gene. We used the area under the ROC curve (AUC) to identify and remove 2,404 genes with a significant batch effect (AUC >0.95 between one sequencing project and others). Unsupervised hierarchical clustering was done using Cosine distance and Ward method on most 5,000 differentially expressed genes from the vst matrix as previously described.<sup>24</sup>

Tumors were classified in the G1-G6 classification as previously described for the LICA-FR cohort<sup>28</sup> and the TCGA cohort.<sup>29</sup> We used the Bioconductor *limma* package<sup>30</sup> to test for differential gene expression between 2 groups of RNAseq samples of interest. All genes expressed in at least 5 samples (FPKM>0) were considered for the differential expression analysis. We applied a q-value threshold of ≤0.05 to define differentially expressed genes. We used an in-house adaptation of the gene-set enrichment analysis (GSEA) method<sup>31</sup> to identify gene sets from the MSigDB (v. 6.0) database overrepresented among up- and downregulated genes. Single sample GSEA scores were calculated as gene-set variation analysis (GSVA) enrichment scores, using the GSVA package.<sup>32</sup>

The relative abundance of immune and stromal cell infiltration within tumors was assessed through microenvironment cell population (MCP) scores computed with the MCP-counter method<sup>33</sup> adapted to RNAseq data (exp matrix) after filtering

**Table 1. Clinical, histological and molecular features of tumors stratified by molecular alterations.**

	LICA-FR					TCGA <sup>a</sup>				
	Non-BAP1/ fusPRKACA tumors (n = 118)	BAP1 tumors (n = 18)	p	fusPRKACA tu- mors (n = 15)	p	Non-BAP1/ fusPRKACA tumors (n = 323)	BAP1 tumors (n = 16)	p	fusPRKACA tumors (n = 6)	p
	n/N (%)	n/N(%)		n/N (%)		n/N (%)	n/N(%)		n/N (%)	
Histological Diagnosis										
HCC	116/118 (98)	10/18 (56)	***###	0/15 (0)	†††	323/323 (100)	16/16 (100)	###	0/6 (0)	†††
FLC	0/118 (0)	2/18 (11)	****	13/15 (87)	†††	0/323 (0)	0/16 (0)	##	4/6 (67)	†††
mixed-FLC/HCC	2/118 (2)	6/18 (33)	***	2/15 (13)		0/323 (0)	0/16 (0)		2/6 (33)	†††
Age at sampling (years)	64 (18-90)	51 (27-73)	****	26 (17-36)	†††	61 (20-90)	61 (44-77)	###	22 (17-35)	†††
Female gender	23/118 (19)	12/18 (67)	***	9/15 (60)	††	92/323 (28)	12/16 (75)	***	3/6 (50)	
Alcohol intake	47/116 (41)	5/16 (31)		0/12 (0)	††	107/304 (35)	3/14 (21)		1/4 (25)	
Hepatitis B	39/118 (33)	1/17 (6)	*	0/12 (0)	†	102/304 (34)	2/14 (14)		0/4 (0)	
Hepatitis C	15/116 (13)	0/15 (0)		0/12 (0)		47/304 (15)	1/14 (7)		0/4 (0)	
Without etiology	14/118 (12)	8/16 (50)	***##	12/12 (100)	†††	67/300 (22)	7/13 (54)	*	3/4 (75)	†
Non-tumor liver histology****†††††										
F0-F1	52/118 (44)	16/17 (94)		15/15 (100)		92/192 (48)	9/12 (75)		5/5 (100)	
F2-F3	36/118 (31)	1/17 (6)		0/15 (0)		29/192 (15)	2/12 (17)		0/5 (0)	
F4	30/118 (25)	0/17 (0)		0/15 (0)		71/192 (37)	1/12 (8)		0/5 (0)	
Abundant fibrous stroma	32/115 (28)	13/18 (72)	***#	15/15 (100)	†††	36/323 (11)	6/16 (38)	**	4/6 (67)	††
Tumor steatosis	19/100 (19)	10/15 (67)	***##	2/13 (15)		105/323 (33)	12/16 (75)	***#	1/6 (17)	
Biliary Tract Invasion	2/104 (2)	5/16 (31)	***	1/13 (8)		7/323 (2)	2/16 (13)		0/6 (0)	
Perineural invasion	0/104 (0)	2/15 (13)	*	2/13 (15)	†	0/323 (0)	1/16 (6)	*	1/6 (17)	†
Macrotrabecular massive	13/114 (11)	0/13 (0)		0/15 (0)		62/323 (19)	1/16 (6)		0/6 (0)	
Scirrhous pattern	9/117 (8)	3/18 (17)		0/13 (0)		5/319 (2)	0/16 (0)		0/6 (0)	
Lymphocytic inflammation	23/110 (21)	11/15 (73)	***##	1/12 (8)		70/323 (22)	8/16 (50)	*	2/6 (33)	
Boyault transcriptomic class			***##		††			***		
G1	13/118 (11)	14/18 (78)		3/15 (20)		41/292 (14)	10/16 (63)		1/6 (17)	
G2	17/118 (14)	1/18 (6)		0/15 (0)		46/292 (16)	1/16 (6)		0/6 (0)	
G3	28/118 (24)	1/18 (6)		3/15 (20)		29/292 (10)	0/16 (0)		1/6 (17)	
G4	22/118 (19)	2/18 (11)		9/15 (60)		83/292 (28)	3/16 (19)		3/6 (50)	
G5	21/118 (18)	0/18 (0)		0/15 (0)		17/292 (6)	0/16 (0)		0/6 (0)	
G6	17/118 (14)	0/18 (0)		0/15 (0)		76/292 (26)	2/16 (13)		1/6 (17)	
BAP1 altered	0/118 (0)	18/18 (100)	***###	0/15 (0)		0/323 (0)	16/16 (100)	***###	0/6 (0)	
CTNNB1 mutated	41/118 (35)	1/18 (6)	*	1/15 (7)	†	92/323 (28)	1/16 (6)		0/6 (0)	
TP53 mutated	47/118 (40)	2/18 (11)	*	0/15 (0)	††	107/323 (33)	3/16 (19)		0/6 (0)	
TERT altered	63/116 (54)	0/17 (0)	***	2/14 (14)	††	89/169 (53)	0/8 (0)	**	2/4 (50)	
DNAJB1-PRKACA fusion	0/118 (0)	0/18 (0)	###	15/15 (100)	†††	0/323 (0)	0/16 (0)	###	6/6 (100)	†††

FLC, fibrolamellar carcinoma; HCC, hepatocellular carcinoma.

Wilcoxon test, trend  $\chi^2$  test,  $\chi^2$  test and Fisher exact test were used respectively for continuous, ordinal, categorical and binary data.

\*BAP1 vs. non-BAP1/fusPRKACA; #BAP1 vs. fusPRKACA; †fusPRKACA vs. non-BAP1/fusPRKACA.

###, \*\*\*, ††† p <0.001; ##, \*\*, †† p <0.01; #, \*, † p <0.05.

<sup>a</sup>For the TCGA series, only 1 or 2 slides were available for histological review.

out genes expressed in hepatocytes (the detailed list of genes used for each population is available in Fig. S2).

### Immunoblotting

Proteins were extracted from frozen tissues samples using modified Laemmli lysis buffer (50 mM Tris pH = 6.8, 2% SDS, 5% glycerol, 2 mM DTT, 2.5 mM EDTA/EGTA) supplemented with 2x phosphatase and protease inhibitor cocktail (#78444, Thermo Fisher Scientific, Waltham, MA, USA), 2 mM Na<sub>3</sub>VO<sub>4</sub> (#P0758S, BioLabs, Ipswich, MA, USA) and 10 mM NaF (#674141, Sigma Aldrich, St. Louis, MO, USA), homogenized by Qiagen TissueLyser II and boiled for 10 min. Protein concentration was measured with the BCA assay kit (Pierce Biotechnology, Rockford, IL, USA). Equal amounts of protein were deposited on polyacrylamide gel (Bio-Rad, Hercules, CA, USA), separated by electrophoresis, transferred on 0.2  $\mu$ m nitrocellulose membrane (Bio-Rad) and incubated at 4°C with the following primary antibodies: anti-BAP1 (sc-28383 c4, Santa Cruz Biotechnologies, Dallas, TX, USA), anti-PKA-C $\alpha$  (ab76238, Abcam, Cambridge, UK) and anti-

PKA-R2 (ab32514, Abcam, Cambridge, UK) at 1:10,000 dilution. Anti-mouse (#7076, Cell Signaling) or anti-rabbit (#7074, Cell Signaling) IgG horseradish peroxidase (HRP) linked secondary antibodies were used at 1:2,000 dilution. Proteins were detected using SuperSignal West Pico Plus kit (#34580, Thermo Fisher Scientific) and the signal was captured by the ChemiDoc XRS system. Quantification was done by measuring the intensity of each band using Image Lab software (Bio-Rad) and normalized by the Ponceau whole lane charge evaluated with ImageJ software (National Institute of Health, Bethesda, MD, USA).

### Immunohistochemistry

Immunohistochemistry was performed on formalin-fixed paraffin-embedded tumor tissues with the Leica Bond automated stainer. The percentage of EpCAM positive tumor cells was assessed in 52 tumors from the LICA-FR series stained with an EpCAM monoclonal antibody (Dako, Santa Clara, California, Clone Ber-Ep4, dilution 1/50). Quantitative scores of infiltration by T cells and B cells were assessed in 41 tumors with antibodies

against CD3 (Dako, Clone F7.2.38, dilution 1/50) and CD20 (Dako, Clone L26, Dilution 1/500) respectively, with a separate estimation of positive cells within the tumor stroma and within the tumor parenchyma.

### Statistical analysis

For statistical analysis of gene expression data, R version 3.3.2 (R Development Core Team, R: A language and environment for statistical computing. R Foundation for Statistical Computing, Vienna, <http://www.R-project.org>) and Bioconductor version 3.4 were used. Wilcoxon, Fisher or  $\chi^2$  statistical tests were applied with respect to the type of variable. Survival analysis was performed in patients treated by R0 liver resection (n = 112) as previously described<sup>8</sup> including 5 patients with FLC without good quality RNAseq data available. We assessed overall survival defined by the interval between surgery and death (whatever the cause), and survival curves were represented using the Kaplan-Meier method compared with the Log-Rank test. Univariate analysis was performed using the Cox model. A *p* value <0.05 was considered significant.

### Data availability

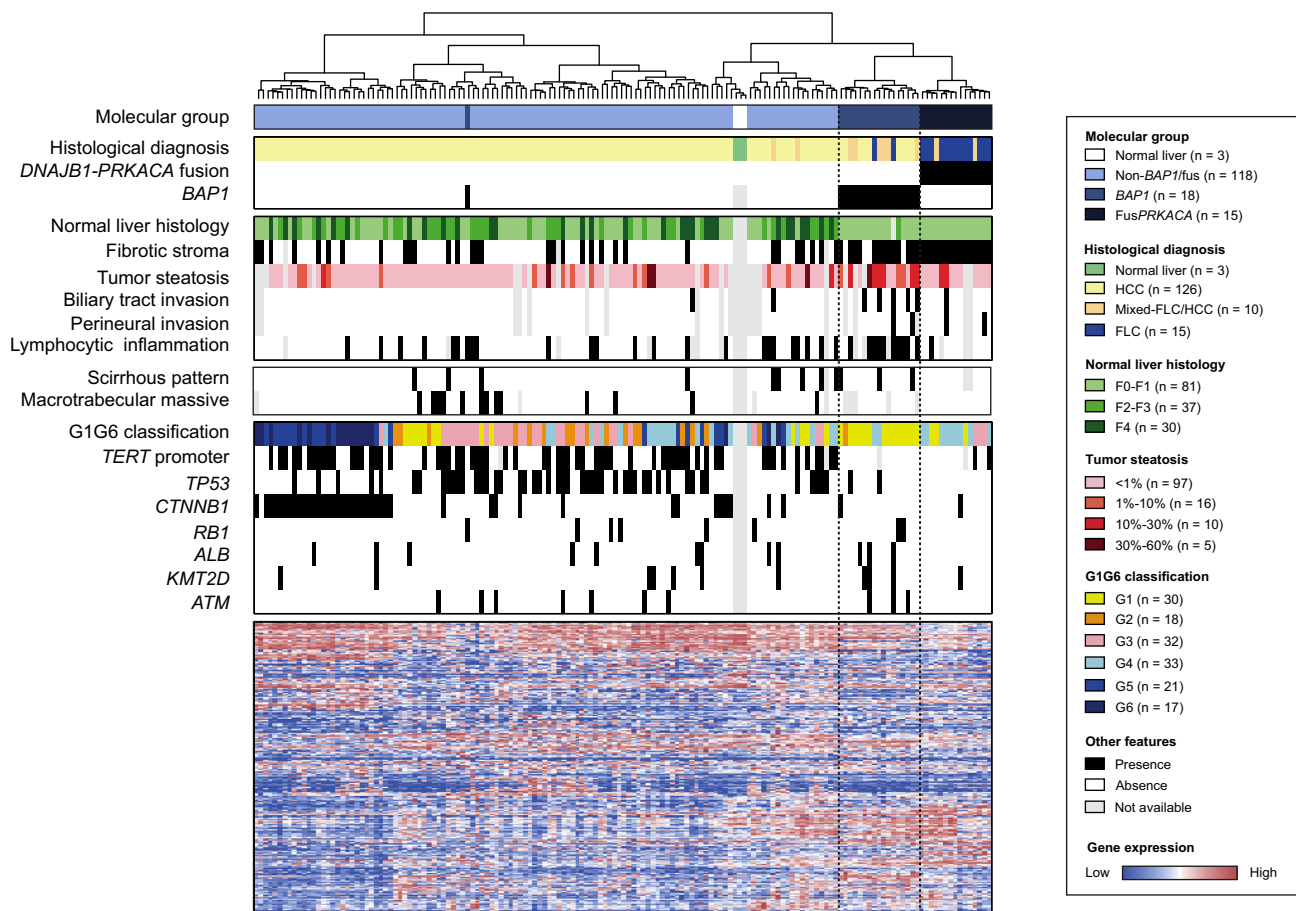
The sequencing data of the LICA-FR cohort reported in this paper have been deposited to the EGA (European Genome-phenome

Archive) database (RNAseq accession [EGAS00001002879], [EGAS00001001284] and [EGAS00001003837]; WES accessions [EGAS00001000217], [EGAS00001001002], [EGAS00001003063], [EGAS00001000679] and [EGAS00001003837]; WGS accessions [EGAS00001002408], [EGAS00001000706], [EGAS00001002888] and [EGAS00001003837]), through the ICGC (International Cancer Genome Consortium) data access committee. The sequencing data from the TCGA cohort were retrieved from <http://www.cbiportal.org/>.

## Results

### FLC and mixed-FLC/HCC cluster into 2 distinct transcriptomic subgroups of tumors

We performed RNA sequencing of 151 liver tumor samples which included 126 HCC, 15 FLC and 10 mixed-FLC/HCC, defined by pathological review (Fig. S1) and with clinical features described in Table 1. Out of 15 FLC, 13 clustered together with 2 mixed-FLC/HCC in a robust subgroup of 15 tumors (Fig. 1). Interestingly, all 15 patients in this cluster were young (age min = 17 years; max = 36 years, mean = 26 years) and all the tumors harbored the *DNAJB1-PRKACA* fusion (Fig. 1). Six out of the 8 remaining mixed-FLC/HCC clustered in a second group of tumors also including 2 FLC and 9 HCC (Fig. 1). This cluster of 17 tumors highly enriched



**Fig. 1. FLC cluster together and are divided between *BAP1*-driven and *DNAJB1-PRKACA*-driven tumors.** Hierarchical clustering based on the expression of the 5,000 genes with the higher variability in RNAseq analysis of 151 liver tumors and 3 non-tumor-liver samples. The top heatmaps show clinical, histological and molecular annotation of the samples, while the lower heatmap shows the expression pattern of the 5,000 genes. FLC, fibrolamellar carcinoma; RNAseq, RNA sequencing. (This figure appears in color on the web.)



**Table 2. Detailed *BAP1* alterations in the 18 patients from the LICA-FR series.**

Case #	Gender	Age	Histological Diagnosis	Etiology / background	Non-tumor liver	<i>BAP1</i> genomic alteration (GRCh37, chr3)	<i>BAP1</i> protein change	<i>BAP1</i> copy number variation
#794T <sup>a</sup>	M	73	HCC	Hemochromatosis	F0-F1	52443600del	E31fs	Focal del
#1010T	F	53	HCC	Alcohol	F0-F1	52436869_52436870delinsAA	K637*	Focal del
#3894T	M	56	HCC	Alcohol	F0-F1	52443876C>A	E7*	Focal del
#3907T	M	39	HCC	Alcohol	F0-F1	52441270del	A167fs	Focal del
#2135T	F	57	HCC	Alcohol / HBV / NASH	F0-F1	52441301del + 52436304T>G	N157fs + *730C	
#2211T	F	37	HCC	Chronic intrahepatic obstructive cholestasis	F0-F1	52439814_52439830del	VLEANR295fs <sup>b</sup>	Focal del
#228T	M	48	HCC	Without etiology	F0-F1	52440294_52440295insTT	Q253fs	Focal del
#1182T	F	51	HCC	Without etiology	F0-F1	52442618_52442627del	PA42fs (splice)	large del
#800T	M	73	HCC	Without etiology	F2-F3	52441229del	F181fs	Chr3p del
#141T	F	67	HCC	Without etiology	F0-F1	52441252T>C	Y173C	Focal del
#412T	F	51	FLC	n.a.				Homozygous del
#411T	F	65	FLC	Alcohol	F0-F1			Homozygous del
#3919T	F	54	mixed-FLC/HCC	n.a.	F0-F1	Inversion (3;3)	Frameshift fusion	Focal del
#4211T	F	40	mixed-FLC/HCC	Without etiology	F0-F1	Translocation t(2;3)	Frameshift fusion	Chr3p del
#026T	F	38	mixed-FLC/HCC	Without etiology	F0-F1	52439136del	P370fs <sup>b</sup>	Focal del
#255T	F	39	mixed-FLC/HCC	Without etiology	F0-F1	52441473T>C + 52443758G>A	K127E + G13G (splice)	Focal del
#187T	M	27	mixed-FLC/HCC	Without etiology	F0-F1	52441991_52441992del	K120fs <sup>b</sup>	Focal del
#906T	F	50	mixed-FLC/HCC	NASH	F0-F1	52443580del	K38fs	Focal del

F0-F1: no fibrosis; F2-F3: mild fibrosis; F4: cirrhosis.

FLC, fibrolamellar carcinoma; HCC, hepatocellular carcinoma; NASH, non-alcoholic steatohepatitis; n.a., not available.

<sup>a</sup>Of note, patient #794T was found outside the cluster of 17 *BAP1* altered tumors (Fig. 1) but was later included in the group of *BAP1* tumors for further analysis.

<sup>b</sup>3 mutations were not detected in the first analysis of whole exome sequencing data but were later identified in target sequencing of *BAP1* with a higher depth.

in mixed-FLC/HCC was located in proximity to the FLC cluster, but patients were older (age min = 27 years; max = 73 years, mean = 51 years) including the 2 FLC that developed at 51 years and 65 years. Interestingly all 17 of these tumors lacked the *DNAJB1-PRKACA* fusion but showed alterations in the *BAP1* gene. Only 1 HCC mutated for *BAP1* (#794T), without FLC features, was outside this FLC/HCC cluster. Finally, only 2 mixed-FLC/HCC, not mutated for *BAP1* nor harboring *DNAJB1-PRKACA* fusion, were distributed outside the 2 clusters (Fig. 1).

In agreement with the tumor suppressor function of *BAP1* in various tumor types,<sup>16,34–37</sup> *BAP1* alterations were predicted to inactivate the gene either by somatic mutations (9 frameshift, 2 nonsense, 1 splice site, 2 missense and 1 nonstop), by gene fusion in 2 cases (*DAG1-BAP1* in #3919T and a complex event leading to both *BAP1-LINCO1460* and *RAB3GAP1-BAP1* fusions in #4211T, see Fig. S3), or by homozygous deletion in 2 tumors (Table 2). In all tumors, *BAP1* alterations were biallelic with 2 mutations in 1 case (#2211T) or a deletion of the second allele of *BAP1* (Table 2).

Since no FLC carrying the *DNAJB1-PRKACA* fusion showed *BAP1* alterations, we define 3 distinct groups of tumors: altered for *BAP1* (*BAP1* tumors), with *DNAJB1-PRKACA* fusion (*fusPRKACA* tumors) or without either alterations (non-*BAP1/fusPRKACA* tumors), as represented in Fig. 1 (Molecular group annotation).

### ***BAP1* altered hepatocellular carcinomas show distinct clinical and histological features**

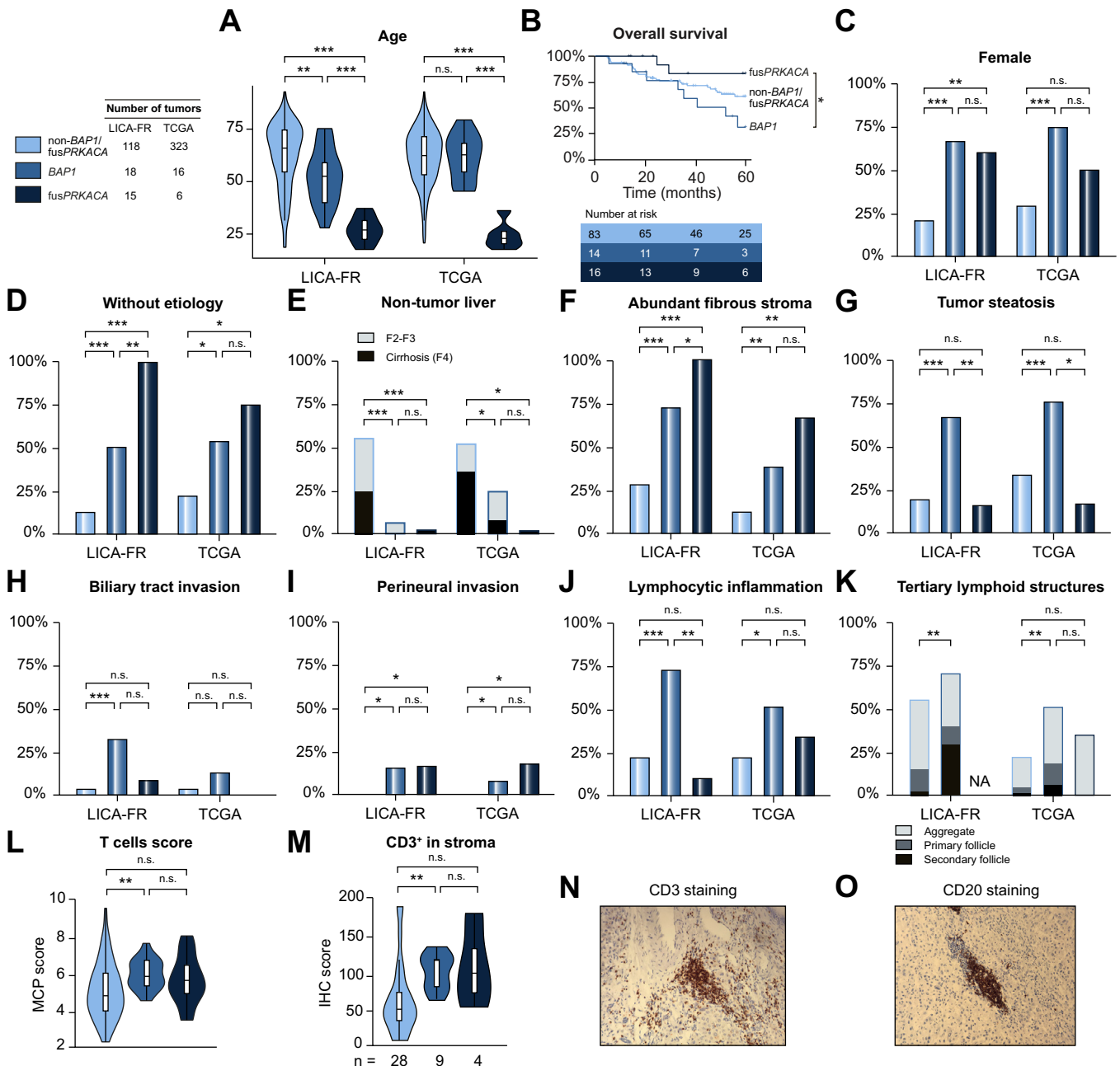
In our cohort (LICA-FR), patients with *BAP1* tumors ( $n = 18$ ) were younger (median 51 years) than patients with non-*BAP1/fusPRKACA* tumors ( $n = 118$ , median 64 years,  $p = 0.006$ ) but older than patients with *fusPRKACA* tumors ( $n = 15$ , median 26 years,  $p = 3.3e-6$ , Fig. 2A). Compared to non-*BAP1/fusPRKACA* tumors, *BAP1* tumors were more frequent in females (67% vs. 19%,  $p = 9.7e-5$ ), in non-fibrotic liver (F0-F1), and in patients without known etiologies of HCC (50% vs. 12%,  $p = 0.0008$ , Fig. 2C-E and Table 1). Patients with *BAP1* tumors had similar overall survival as those with non-*BAP1/fusPRKACA* HCC, whereas patients with *fusPRKACA* HCC had a better prognosis

( $p = 0.02$  in log-rank test, Fig. 2B). All of these clinical relations, except younger age, were also found in the TCGA cohort that included 16 *BAP1* tumors and 6 *fusPRKACA* tumors out of 345 HCC (Fig. 2A-E and Table 1). Of note, a 67-year-old female patient in TCGA harbored both a *DNAJB1-PRKACA* fusion and a *BAP1* mutation in the tumor and was excluded from the statistical analysis.

*BAP1* tumors were enriched in mixed-FLC/HCC (6 out of 18), characterized by an abundant fibrous stroma (72%), intratumor steatosis (67%), biliary tract invasion (31%), perineural invasion (13%), and a high lymphocytic infiltration (73%) (Fig. 1 & 2F-J, Table 1). Tertiary lymphoid structures were frequently identified in *BAP1* tumors (70%) ranging from simple aggregate up to secondary follicles harboring a clear germinal center as previously described in HCC<sup>20</sup> (Fig. 2K). The MCP-counter method<sup>33</sup> applied to RNAseq data showed a high component of the microenvironment in *BAP1* tumors, enriched in T and B lymphocytes, endothelial cells and myeloid dendritic cells when compared with non-*BAP1/fusPRKACA* tumors (Fig. 2L, Fig. S2). In accordance with these results, CD3 immunohistochemistry revealed a higher infiltration of T cells in the stroma of *BAP1* tumors compared to non-*BAP1/fusPRKACA* tumors (Fig. 2M,N). Infiltrated CD20<sup>+</sup> B cells were also observed within *BAP1* tumors but in levels comparable to non-*BAP1/fusPRKACA* HCC (Fig. 2O and Fig. S2). In the TCGA cohort, we confirmed that *BAP1* tumors were highly fibrous, steatotic, enriched in perineural invasion and with frequent lymphocytic infiltration organized in tertiary lymphoid structures (Fig. 2F-K and Table 1).

### ***BAP1* tumors demonstrate a specific genomic profile with frequent *PRKACA* gain and *PRKAR2A* deletion**

Analysis of the profile of gene mutations and chromosome alterations in *BAP1* tumors showed a significant exclusion from alterations in the 3 most frequent drivers of HCC, namely *TERT* promoter, *CTNNB1* and *TP53*<sup>22</sup> (Fig. 1 and Table 1). This exclusion was confirmed in the TCGA cohort and also observed in *DNAJB1-PRKACA* fusion tumors (Fig. 1 and Table 1). In contrast, *BAP1*

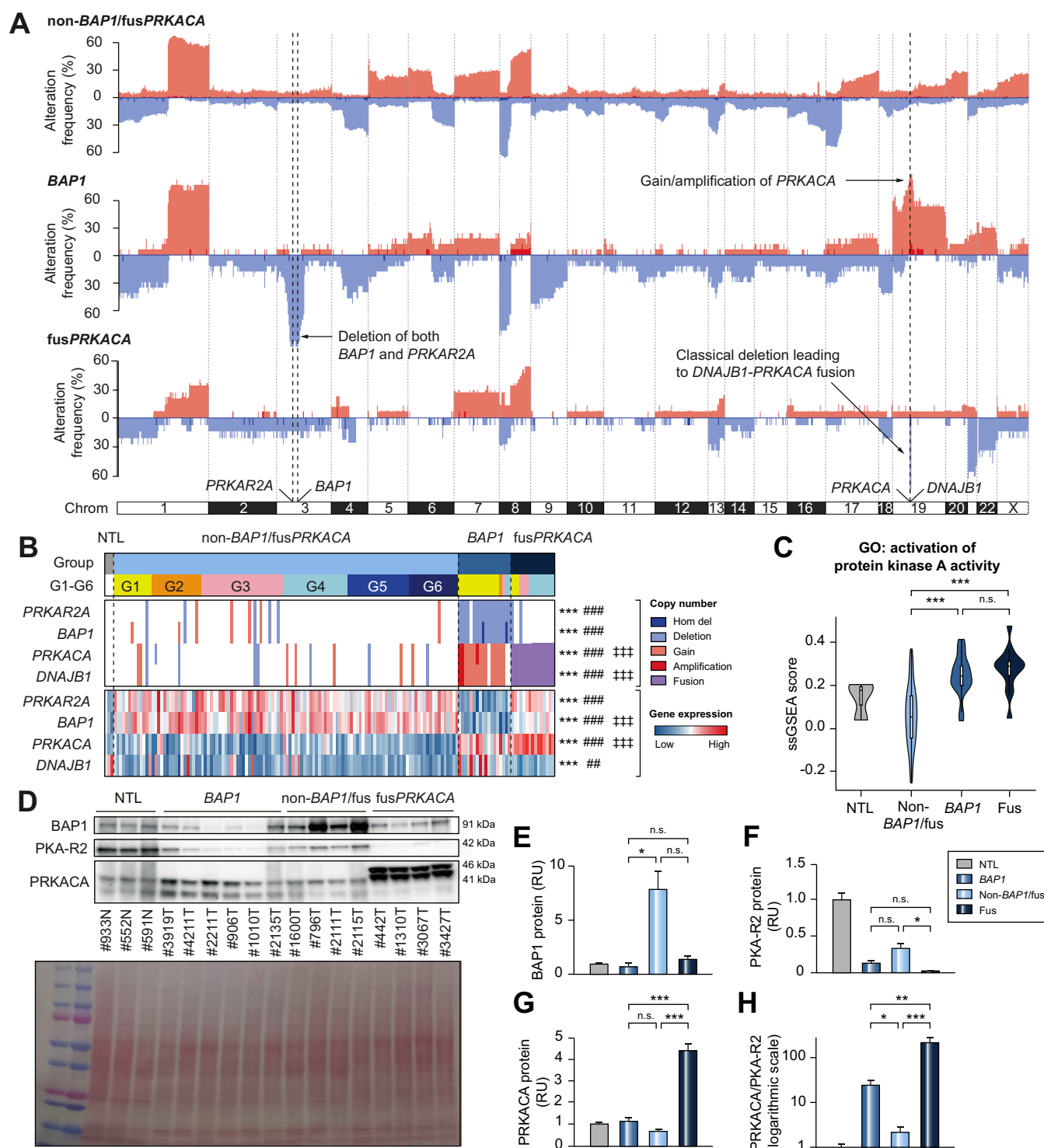


**Fig. 2. Clinical and histological features of BAP1, fusPRKACA and non-BAP1/fusPRKACA tumors.** (A) Distribution of age at surgery. (B) Kaplan-Meier plot showing the overall survival in the LICA-FR series. (C-E) Repartition of female gender (C), absence of liver disease etiology (D) and non-tumor liver histology (F2-F3: mild fibrosis; F4: cirrhosis) (E). (F-K) Histological review of abundant fibrous stroma (F), tumor steatosis (G), biliary tract invasion (H), perineural invasion (I), lymphocytic inflammation (J) and tertiary lymphoid structures (K). (L) T cell score calculated with the MCP-counter method applied to RNAseq data of the LICA-FR series. (M) Quantification of T cell abundance in tumor stroma with immunohistochemistry in a subset of tumors from the LICA-FR series. (N, O) Representative images of CD3 (N) and CD20 (O) staining in BAP1 tumors (#411T and #412T respectively), showing the aggregation of T and B cells within aggregate type tertiary lymphoid structures. Wilcoxon test, trend  $\chi^2$  test, Fisher exact test and Log-rank test were used respectively for continuous (A, L), ordinal (C, K), binary (B, D, F-J) and survival data (E): \*\*\* $p < 0.001$ , \*\* $p < 0.01$ , \* $p < 0.05$ . MCP, microenvironment cell population; RNAseq, RNA sequencing. (This figure appears in color on the web.)

tumors were slightly enriched in *RB1*, *KMT2D*, *ATM* and *ALB* mutations ( $n = 3$  for each gene, Fig. 1) but these associations did not reach significance.

In order to find alternative driver events associated with *BAP1* alterations in HCC, we compared the frequency of copy number alterations between the 3 molecular groups of tumors. In 15 out

of the 18 BAP1 tumors (83%) we identified a specific recurrent chromosome gain at the 19p13 locus centered on the *PRKACA* gene found in only 6% of the non-BAP1/fusPRKACA tumors ( $p = 3e-12$ ) and in none of the fusPRKACA tumors (Fig. 3A-B). In addition, deletions at chromosome 3p21 identified in the BAP1 tumors encompassed both *BAP1* and *PRKAR2A* (coding for



**Fig. 3. Alternative copy number alterations activate the PKA pathway in BAP1 tumors.** (A) Frequency of copy number alterations in the 3 molecular groups of HCC. (B) Heatmap representation of copy number alterations and relative gene expression for *PRKAR2A*, *BAP1*, *PRKACA* and *DNAJB1* assessed by RNAseq. Statistical comparisons with exact Fisher test (copy number alterations) and Wilcoxon test (gene expression): \*BAP1 vs. non-BAP1/fusPRKACA, #BAP1 vs. fusPRKACA, ‡fusPRKACA vs. non-BAP1/fusPRKACA. (C) Comparison of single sample GSEA scores for the gene set GO: Activation of PKA activity between the 3 molecular groups of tumors. (D) Western-blot of BAP1, PKA-R2 and PRKACA in normal liver samples (NTL, n = 3) and in different liver tumors: BAP1 (n = 6), non-BAP1/fusPRKACA (n = 4), fusPRKACA (n = 4). In fusPRKACA tumors, the higher mass of the bands stained by the PRKACA antibody corresponds to the already described DNAJB1-PRKACA chimeric protein. Bottom image represents Ponceau coloration. (E-H) Quantification of protein expression of BAP1 (E), PKA-R2 (F), PRKACA (G) and of relative PKA activation measured by the ratio between PRKACA and PKA-R2 (H), compared with Wilcoxon test. \*\*\*, ###, ‡‡‡ p < 0.001; \*\*, ## p < 0.01; \*p < 0.05. GO, gene ontology; GSEA, gene-set enrichment analysis; HCC, hepatocellular carcinoma; NTL, non-tumor liver; RNAseq, RNA sequencing. (This figure appears in color on the web.)

PKA-R2 $\alpha$ , a negative regulatory subunit of the cAMP-dependent protein kinase PKA) genes distant by 3.5 Mb (94% vs. 4% in non-BAP1/fusPRKACA tumors,  $p = 2 \times 10^{-16}$ , Fig. 3A-B and Fig. S4). In agreement with these findings, RNAseq data showed significantly lower *PRKAR2A* and higher *PRKACA* gene expression in BAP1 tumors compared to non-BAP1/fusPRKACA tumors and these results were confirmed at the protein level (Fig. 3B,D-F). A significantly increased ratio of *PRKACA* to PKA-R2 proteins, reflecting PKA activity, was monitored in both BAP1 and fusPRKACA groups of tumors compared to non-BAP1/fusPRKACA HCC (Fig. 3H). Accordingly, PKA activity assessed by single sample GSEA was increased in both BAP1 and fusPRKACA tumors (Fig. 3C). These results suggest that like FLC with *DNAJB1-PRKACA* fusion, the PKA pathway is activated in BAP1 tumors but via an alternative mechanism associated with *PRKACA* chromosome gains and *PRKAR2A* deletions (Fig. S4).

### BAP1 and fusPRKACA tumors share common proliferation and differentiation programs, distinct from other hepatocellular tumors

At the transcriptomic level, 78% of the BAP1 tumors were classified in the G1 subgroup of HCC, known to be associated with progenitor features,<sup>17,28</sup> compared to only 11% of the non-BAP1/fusPRKACA tumors ( $p = 9.5 \times 10^{-9}$ ) and 20% of the fusPRKACA FLC and these results were confirmed in TCGA (63% vs. 14%,  $p = 7.0 \times 10^{-5}$ , Table 1). Single sample GSEA revealed that BAP1 and fusPRKACA tumors were highly enriched for stem cell and neuronal features, vasculature development, extracellular matrix and epithelial-mesenchymal transition compared to non-BAP1/fusPRKACA HCC (Fig. 4A). FusPRKACA tumors appeared to be less proliferative than non-BAP1/fusPRKACA tumors, as illustrated by lower levels of cell cycle genes such as *CCNB1*, *PCNA* or *BIRC5*, while the tendency toward lower proliferation in BAP1 tumors did not reach significance (Fig. 4B).

Interestingly, expression of the 3 TGF- $\beta$  ligands was increased in both BAP1 and fusPRKACA tumors (Fig. 4B), together with an enrichment in the signature of TGF- $\beta$  signaling in fibroblasts (Plasari TGF $\beta$ 1 Targets 10hr Up, Fig. 4A). In contrast, a signature of TGF- $\beta$  activation in hepatocytes defined by Coulouarn *et al.*<sup>38</sup> was not retrieved in BAP1 nor fusPRKACA tumors, suggesting that activation of the TGF- $\beta$  pathway in fibroblasts but not in tumor hepatocellular cells could be at the root of the fibrotic phenotype in both groups of tumors.

In accordance with the enrichment in stem cell features detected by GSEA, BAP1 and fusPRKACA tumors shared high expression of hepatic stem cell genes such as *EPCAM*, *VIM* or *THY1* (CD90) (Fig. 4B). Immunohistochemistry performed on a subset of tumors confirmed the higher percentage of EpCAM-positive progenitor cells within both BAP1 tumors and fusPRKACA tumors while this staining was absent in most non-BAP1/fusPRKACA tumors (Fig. 4C, D). Furthermore, we also monitored high expression of markers of the common hepato-pancreatic progenitor<sup>39,40</sup> such as *PDX1* or *SOX17* (Fig. 4B), 2 markers which have previously been detected by immunohistochemistry in most FLC samples.<sup>5</sup> Among the differentiation markers, we observed a significant decrease of hepatocyte-specific genes *ALB*, *PROX1* or *HNF4A* and a significant increase of cholangiocyte-specific gene *KRT7* in fusPRKACA compared to BAP1 or non-BAP1/fusPRKACA tumors (Fig. S5). Also, several markers of pancreatic lineage were overexpressed in BAP1 and/or fusPRKACA tumors, but at various levels in the 2 groups of tumors. For

instance, among the pancreatic markers, high expression of *PDX1*, *PAX6*, *PAK3*, and *MNX1* was identified in BAP1 and fusPRKACA tumors while *NEUROG3* (NGN3), *INSM1* (IA-1), *PTF1A*, *TRIM50*, *GP2* and *TGIF2* overexpression was restricted to BAP1 tumors and only fusPRKACA tumors overexpressed the pancreatic/neuroendocrine gene *PCSK1* (Fig. 4B and Fig. S5). Other neuroendocrine genes such as *CALCA*, *NTS*, *DNER* or *SSTR5* were overexpressed with different patterns in the 2 groups of tumors (Fig. S5). Moreover, we observed a high expression of genes coding for proteins involved in neural infiltration and guidance, such as neuron guide molecules (*NGF*, *NTF3*, *BDNF*) and their binding receptors expressed on neurons (TrkA-C (*NTRK1-3*) and p75NTR (*NFGR*), Fig. S5), possibly accounting for the enrichment in perineural invasion in both BAP1 and fusPRKACA tumors (Fig. 2I). In line with a possible neural infiltration, other neuron expressed receptors such as UNC5A-D were found significantly overexpressed in BAP1 or fusPRKACA tumors (Fig. S5).

Lastly, the higher expression of the hepato-pancreatic progenitor marker *PDX1* and the lack of expression of pancreatic-committed progenitor markers such as IA-1 or *PTF1A* in fusPRKACA compared to BAP1 tumors, suggest a hepato-pancreatic progenitor-like program in fusPRKACA tumors and a more pancreatic-engaged program in BAP1 tumors (Fig. 4B and Fig. 5).

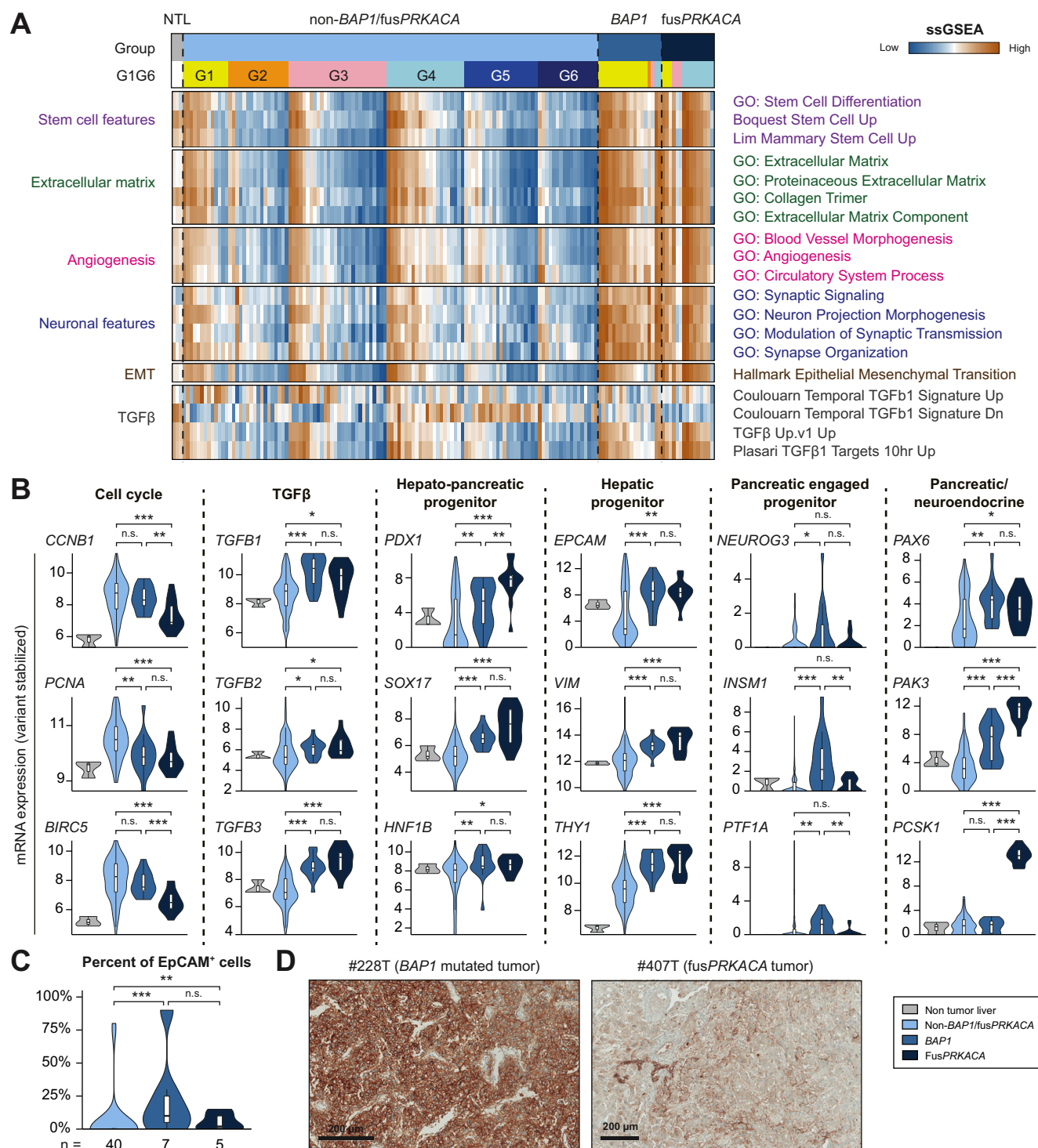
### Discussion

In this study, we showed that *BAP1* alterations delineate a specific subgroup of HCC with common clinical, histological and molecular features (Fig. 5A). *BAP1* is a deubiquitinating enzyme active in both the cytosol, where it controls the stability of different proteins, and in the nucleus, where it targets H2A histones as part of the polycomb group repressive deubiquitinase complex, which is involved in development and stem cell pluripotency.<sup>41,42</sup> *BAP1* is described as a tumor suppressor since it is lost in different tumors including cholangiocarcinoma (around 25%) and HCC (around 5%).<sup>16,34–37</sup> However *BAP1* was recently shown to also have an anti-apoptotic role in the liver,<sup>42</sup> which could explain our observation of an increased expression of *BAP1* in HCC compared to normal liver (Fig. 3B,D-E). Here, we found that the BAP1 tumors include most of the mixed-FLC/HCC tumors and show several clinical and histological similarities with the classical FLC together with a common PKA pathway activation.

Fibrolamellar features in liver tumors are already known to be related to PKA activation through 3 different mechanisms: (i) the *DNAJB1-PRKACA* fusion in FLC,<sup>6</sup> (ii) inactivating mutations in *PRKAR1A* in rare FLC developed in Carney complex patients<sup>7</sup> and (iii) activating mutations in *GNAS* (leading to production of cAMP and subsequent activation of PKA) identified in rare hepatocellular adenomas characterized by fibrolamellar-like patterns.<sup>43</sup> Here, we discovered a fourth mechanism of PKA activation in BAP1 tumors resulting from recurrent gains of *PRKACA* and deletions of *PRKAR2A*, encoding respectively a catalytic subunit and an inhibitory regulatory subunit of PKA, with consequences at the mRNA and protein levels (Fig. 3 and Fig. S4).

An important characteristic of the *DNAJB1-PRKACA* and BAP1 tumors is their age distribution starting with FLC in the second and third decade, then BAP1 HCC occurring before non-BAP1/fusPRKACA HCC (Fig. 5A). This gradient could be related to the cell of origin of the malignant transformation since FLC has been proposed to originate from the biliary tree stem cell,<sup>5</sup> a recently discovered hepato-pancreatic progenitor,<sup>39,40</sup> in agreement with

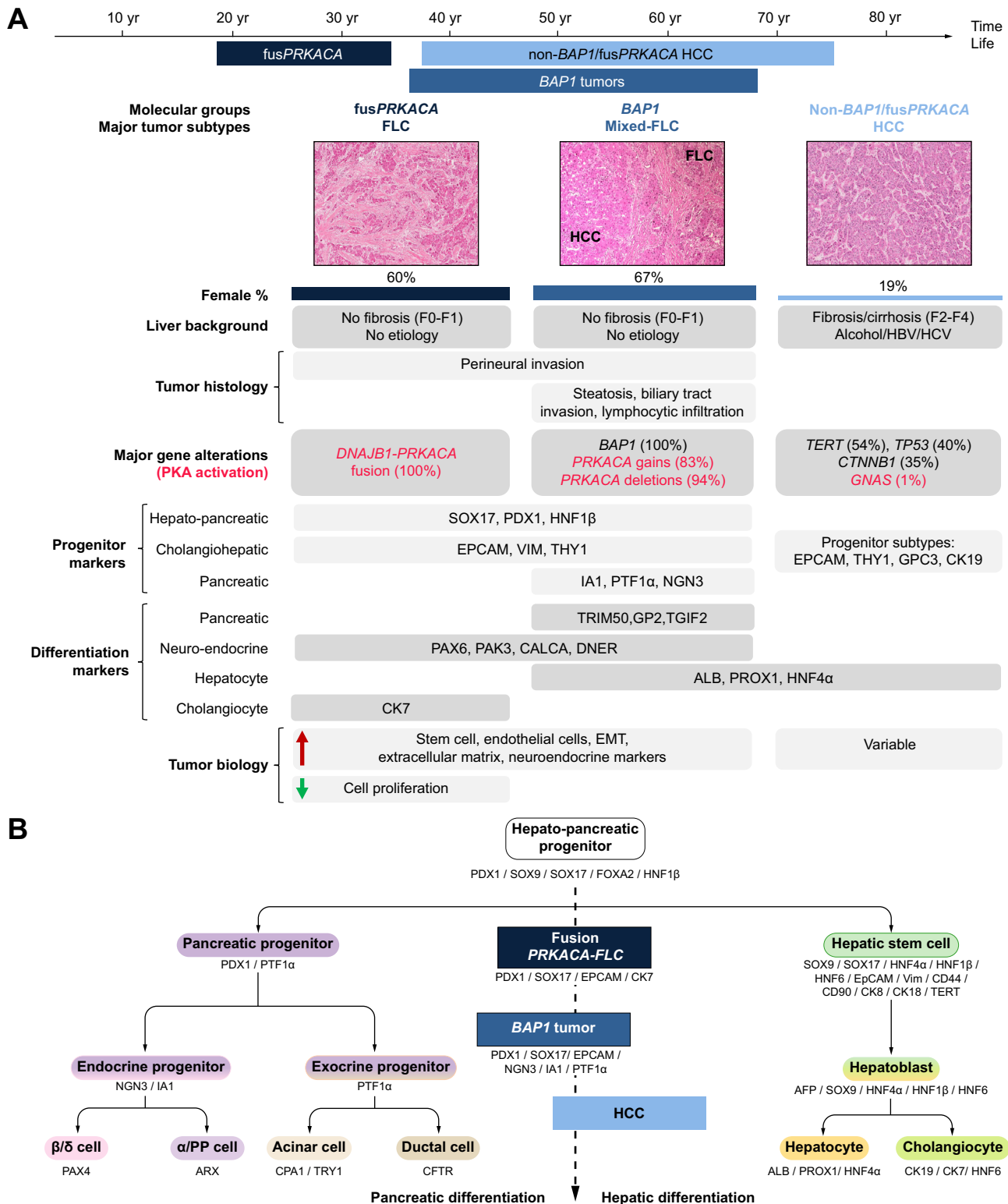




**Fig. 4. Transcriptomic characterization of BAP1 and fusPRKACA tumors.** (A) Heatmap of single sample GSEA for 3 normal liver samples and the different molecular groups of liver tumors ordered by G1-G6 classes. (B) RNAseq expression of representative cell cycle genes, TGFβ ligands as well as representative markers of the different progenitors found in the hepato-pancreatic lineage and of pancreatic / neuroendocrine markers. (C) Immunohistochemistry reveals a higher percentage of EpCAM positive tumor cells in both BAP1 and fusPRKACA tumors. (D) Representative images of EpCAM staining show the lighter staining in fusPRKACA tumors compared to BAP1 tumors. Wilcoxon test: \*\*\* $p < 0.001$ , \*\* $p < 0.01$ , \* $p < 0.05$ . GSEA, gene-set enrichment analysis. (This figure appears in color on the web.)

the hepato-pancreatic progenitor phenotype we identified in both fusPRKACA and BAP1 tumors (Fig. 5B). BAP1 loss may promote a dedifferentiation towards a progenitor phenotype since BAP1 silencing in the Huh7 HCC cell line induces an

increase in stemness marker expression, e.g. EPCAM or PROM1.<sup>44</sup> Similarly, CRISPR-based loss of BAP1 in human liver organoids increases the expression of progenitor markers while reducing markers of liver function and ultimately epithelial homeostasis,



**Fig. 5. Summarized characteristics of fusPRKACA and BAP1 tumors compared to non-BAP1/fusPRKACA HCC and relation to the common hepato-pancreatic lineage.** (A) A recap of the most significant results in terms of histological, clinical and molecular features was represented. Age was represented from the 1<sup>st</sup> to 9<sup>th</sup> deciles. (B) Schematic differentiation program from the common hepato-pancreatic progenitor, adapted from Lanzone *et al.*<sup>40</sup> FusPRKACA FLC are thought to be directly derived from hepato-pancreatic progenitors found in the young liver while BAP1 tumors have a more pancreatic-engaged program. FLC, fibrolamellar carcinoma; HCC, hepatocellular carcinoma. (This figure appears in color on the web.)

possibly via a direct regulation of transcription by BAP1 through its known role in the polycomb deubiquitinase complex.<sup>42</sup> In the TCGA cohort, the unique patient with HCC harboring both *DNAJB1-PRKACA* fusion and *BAP1* inactivation was old (67 years old), suggesting that the progenitor phenotype induced by BAP1 loss could be required for the oncogenic effect of PKA activation in an old liver. This is in line with our observation of a co-occurrence of BAP1 inactivation and PKA activation through copy number alterations. Remarkably, 2 independent teams recently reported the presence of *DNAJB1-PRKACA* fusions in rare pancreatic and biliary neoplasms, thus reinforcing the link between the oncogenic activation of PKA and the hepato-pancreatic progenitor lineage, while challenging the exclusivity between FLC and the *DNAJB1-PRKACA* fusion.<sup>45,46</sup>

Of note, HCC usually lacks lymph node involvement or perineural invasion, commonly found in other epithelial tumors such as pancreatic adenocarcinomas<sup>47,48</sup> or cholangiocarcinoma.<sup>49,50</sup> Conversely, there is a high rate of lymph node metastasis in FLC (up to 70%)<sup>51</sup> and here we identified an enrichment of perineural invasion in BAP1 and fusPRKACA tumors across the 2 series (Table 1). This enrichment could be a consequence of the overexpression of genes encoding neuron guidance molecules (*NGF*, *NTF3*, *BDNF*) that allow the recruitment and growth of neurons expressing axonal guidance receptors (TrkA-C, p75NTR, UNC5A-D, see Fig. S5).

Strikingly, BAP1 tumors are never mutated in the *TERT* promoter (in both LICA-FR and TCGA cohort) while this alteration is found in 30–60% of HCC.<sup>16,52</sup> This could also be a consequence of the progenitor state of the tumor cells associated with BAP1 loss, since *in vitro* experiments suggest that BAP1 overexpression can repress *TERT* transcription<sup>53</sup> and progenitors cells are supposed to maintain their telomeres throughout replication without requiring mutations. This would also explain the exclusion between *DNAJB1-PRKACA* fusion and *TERT* alteration, following the hypothesis that the cell of origin of FLC is a progenitor.<sup>5</sup>

While it has been suggested that endocrine/pancreatic features were specific of FLC and not found in mixed-FLC/HCC,<sup>13</sup> here we show that both fusPRKACA and BAP1 tumors express high levels of neuroendocrine and pancreatic markers but with different patterns (Fig. S5). These different profiles of expression could reflect different stages of differentiation along the hepato-pancreatic lineage in the 2 groups of tumors, as a consequence of their different cell of origin, as discussed above (Fig. 5B). Moreover, an association between neuroendocrine features and abundant fibrous stroma has already been described.<sup>54</sup>

Interestingly, BAP1 mutations are recurrently identified in several tumor types including uveal or cutaneous melanoma, mesothelioma, renal cell carcinoma, mesothelioma and lung cancers.<sup>55</sup> In 2013, a pan-cancer study defined a typical morphology of BAP1-mutated cells as “rounded or polygonal cell shape with abundant amphophilic or eosinophilic cytoplasm”.<sup>56</sup> Interestingly, these features are also retrieved in FLC<sup>1,4</sup> as well as in BAP1 liver tumors (in both FLC and HCC components). This, along with the abundant fibrous stroma, hinders the distinction between BAP1 and fusPRKACA tumors based solely on histology in our cohort of tumors and in other reports.<sup>13,57</sup> These observations argue for the use of molecular characterization to distinguish BAP1 tumors not only from the fusPRKACA FLC but also from scirrhous HCC, another type of highly fibrous liver tumor usually not mutated in BAP1 (Fig. 1 and Table 1). However, it is worth noting that the detection of BAP1 mutations is

challenging due to the high level of stromal contamination: in our series, 3 out of the 15 BAP1 mutations were not found at first in the analysis of whole exome data, but were later detected in target sequencing of BAP1 with a higher depth.

From a clinical perspective, our observations of similarities between fusPRKACA and BAP1 tumors may be in favor of developing common therapeutic strategies. Indeed, the over-activation of PKA in both groups of tumors argues that potential future treatments targeting PKA, if successful in FLC, could be repositioned to also combat BAP1 tumors. From a therapeutic perspective, the 2 groups of tumors could benefit from anti-angiogenic drugs such as sorafenib<sup>58</sup> due to their common enrichment in markers of angiogenesis and endothelial cells (Fig. 4A and Fig. S2). Of note, a link between BAP1 alterations and angiogenesis was also recently described in uveal melanoma.<sup>59</sup> Finally, as BAP1 HCC are highly infiltrated by lymphocytes (Fig. 2J), a feature also described in BAP1-mutated peritoneal mesothelioma,<sup>60</sup> they can be considered as good candidates for immunotherapy. Of note, despite this higher lymphocytic infiltration, we did not monitor a difference in the tumor mutational burden of BAP1 tumors compared to non-BAP1/fusPRKACA tumors, while both groups of tumors had more mutations than fusPRKACA tumors (Fig. S2B).

In conclusion, we characterized a new molecular subgroup of HCC, driven by BAP1 loss of function and PKA activation in the context of hepato-pancreatic progenitor de-differentiation, associated with a specific pathological subtype of tumors, including abundant fibrous stroma, steatosis, lymphocyte infiltration, perineural and biliary tract invasion, which develop mainly in female patients without cirrhosis or chronic liver disease.

## Abbreviations

AUC, area under the ROC curve; BAP1, BRCA1-associated protein 1; FLC, fibrolamellar carcinoma; GO, gene ontology; GSEA, gene-set enrichment analysis; HCC, hepatocellular carcinoma; MCP, microenvironment cell populations; NASH, non-alcoholic steatohepatitis; NTL, non-tumor liver; PKA, cAMP-dependent protein kinase; RNAseq, RNA-sequencing; WES, whole-exome sequencing; WGS, whole-genome sequencing.

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## Conflict of interest

The authors declare no conflicts of interest that pertain to this work.

Please refer to the accompanying ICMJE disclosure forms for further details.

## Authors' contributions

Study concept and design: JZR, TZH, AN. Acquisition of data: JZR, TZH, AN, BG, SC, BN, GC, QB, LM, GM, JYC, JFB, GA, JCN, PBS, MZ,

AB, VP, JC, SI. Analysis and data interpretation: TZh, AN, SC, QB, LM, JZR. Manuscript writing: JZR, TZh, AN and all. Obtained funding: JZR.

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### Supplementary data

Supplementary data to this article can be found online at <https://doi.org/10.1016/j.jhep.2019.12.006>.

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Author names in bold designate shared co-first authorship

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