

1 **Translating ‘-omics’ results into precision medicine for hepatocellular carcinoma**

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20 Competing interests statement

21 The authors declare no competing interests.

22 Abstract

23 A large-scale comprehensive analysis of hepatocellular carcinoma (HCC) based on the
24 integration of six distinct data platforms has pinpointed novel oncogenic processes and
25 prognostic subgroups. These findings confirm previously identified molecular subclasses and
26 fuel the need for a clear strategy of precision medicine in HCC.

27 *Refers to Cancer Genome Atlas Research Network. Comprehensive and integrative genomic*
28 *characterization of hepatocellular carcinoma. Cell 169, 1327–1341.e23 (2017).*

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30 The molecular landscape of HCC has changed dramatically over the past decade, aided by the
31 advent of next-generation sequencing technologies that have uncovered the most frequently
32 mutated oncogenic drivers (TERT promoter, TP53, CTNNB1), chromosomal aberrations (1q,
33 8p, high-level gains of 11q13 and 6p21) and dysregulated signalling pathways (RAS– MAPK,
34 Wnt, mechanistic target of rapamycin (mTOR), IGF2)^{1,2}. After thoroughly analysing >1,000
35 cases, the landscape of mutations and targetable drivers in HCC has been defined². In
36 addition, in an attempt to replicate the success obtained in proof-of-concept trials, such as
37 crizotinib in ALK-rearranged lung cancers among others, great effort has been dedicated to the
38 identification of subgroups of patients with specific molecular traits and tumour phenotypes².
39 Nonetheless, these advancements in the understanding of the molecular oncogenic drivers
40 have not yet been translated into precision- medicine-driven trials¹. In fact, effective targeted
41 therapeutic options for patients with advanced HCC remain scarce and include the multityrosine
42 kinase inhibitors sorafenib (first-line therapy)³, lenvatinib, just reported to be noninferior to
43 sorafenib, and regorafenib (second-line therapy)⁴.

44 In an effort to gain further insights into the underlying oncogenic processes and potential
45 therapeutic targets, investigators from The Cancer Genome Atlas (TCGA) network have now
46 taken the next step and performed large-scale molecular subtyping of HCC tumours, particularly
47 in US patients⁵, thereby complementing previous efforts with European⁶ and Japanese
48 patients⁷. Through the integrative analysis of DNA somatic mutations and copy number
49 aberrations (n = 363 HCCs) with DNA methylation, proteomic, mRNA and microRNA expression
50 profiling (n = 196), the highly powered analysis elegantly unveils novel potential oncogenic
51 processes, such as metabolic reprogramming, and prognostic subgroups, such as those with
52 isocitrate dehydrogenase 1 (IDH1), IDH2 and TP53 signatures⁵. Owing to the large sample
53 size, the study not only confirms the most significantly mutated genes (TERT (44%), TP53
54 (31%), CTNNB1 (27%), ARID1A (7%)) previously reported^{6,7}, but also identifies low-rate
55 mutations in eight novel candidate drivers (prevalence 1–4%), including genes altered in other
56 cancers, such as LZTR1, EEF1A and SMARCA4 (REF. 5). Perhaps more interesting, the
57 analysis suggests the existence of three prognostic molecular subgroups (termed iCluster1–3;
58 FIG. 1). In particular, a TP53 signature associated with chromosomal instability and poor
59 prognosis could further improve clinically relevant clustering of HCC, whereas IDH mutations in
60 four tumours unveils a molecular subgroup with stem-cell-like features and close genomic
61 similarity to cholangiocarcinoma⁵.

62 Taken together, these data provide important insights into the genomic landscape of HCC and
63 represent a notable comprehensive integrative genomic characterization of this neoplasm.
64 Nonetheless, the clinical effect of such findings remains to be elucidated. The multiplatform
65 clustering represents a solid confirmation of proposed molecular classifications, as the
66 molecular traits and prognostic clusters show a high similarity to major subgroups previously
67 reported (proliferation and nonproliferation)², thereby further refining the paradigm of HCC
68 molecular classification (FIG. 1). For example, the iCluster1 subgroup — characterized by high

69 expression of proliferation marker genes and poor prognosis — highly resembles the previously
70 reported proliferation subgroup², whereas the characteristics of the iCluster2 subgroup
71 (CTNNB1 mutations, less microvascular invasion) recall those of the nonproliferation class.
72 Furthermore, except for mutations in TERT and CTNNB1, and promoter hypermethylation of
73 CDKN2A, all pathway alterations seem evenly distributed among the three clusters, failing to
74 provide sufficiently distinct multilevel molecular characterization and guide future treatment
75 decision making. Similarly, the prognostic value of the distinct subgroups (iCluster1, IDH1/2,
76 TP53) need to be further investigated, carrying out logistic regression analyses in fully
77 annotated datasets and extensively validated.

78 In terms of future therapeutic efforts, the authors highlight several potentially targetable drivers.
79 This goal is certainly the major challenge, as we previously reported that HCC has few
80 targetable drivers that account for less than one-third of patients with HCC, as opposed to
81 cholangiocarcinoma, in which FGFR2 fusion proteins and IDH mutations are present in ~30%
82 and 20% of patients, respectively^{1,2,6,8}. In fact, most recurrently altered genes in HCC (TERT,
83 TP53, CTNNB1) remain as unactionable targets, whereas the few targetable alterations occur
84 only in a small fraction of patients (<10%)¹. The first biomarker-driven clinical trials have
85 recently emerged in HCC. For example, FGFR4 inhibitors are being tested (ClinicalTrials.gov;
86 NCT02508467) in patients with high-level amplifications of chromosome 11q13 (FGF19), with
87 more trials expected to follow¹. In this regard, investigators of the TCGA network propose the
88 use of MDM4 inhibitors in patients with wild-type TP53 and elevated MDM4 expression, or IDH
89 inhibitors in patients with IDH1 or IDH2 mutations⁵. If this novel approach is confirmed in
90 experimental studies, it can be added to the armamentarium of therapeutic strategies to be
91 tested in early clinical trials.

92 Activating mutations in IDH1 and/or IDH2 have been frequently reported (~20%) in intrahepatic
93 cholangiocarcinoma and result in the acquisition of abnormal enzymatic activity that leads to
94 altered cell differentiation and survival⁸. By contrast, IDH1 or IDH2 mutations have been rarely
95 reported in HCC (<1%) and the data reported by TCGA (4 of 196 mutations; 2%) is in line with
96 previous reports^{5–7}. The relevance of these mutations towards HCC has been somewhat
97 challenged because, as in the latest study, they always occurred in cholangiocarcinoma-like
98 HCCs. Herein, the authors⁵ identify a subgroup of HCC (~10%) with an expression profile
99 similar to the IDH-mutated HCCs that resemble the subgroup of mutant IDH1 or IDH2
100 intrahepatic cholangiocarcinoma with stem-celllike features and poor prognosis signatures of
101 HCC⁸. These findings further fuel the hypothesis that liver cancers might share a common
102 progenitor precursor, at least in the subset of tumours with progenitor-like features and poor
103 outcome⁸.

104 As in other solid tumours, a new treatment paradigm is emerging. Recent results suggest that
105 nivolumab, a monoclonal antibody against programmed cell death protein 1 (PD1) that
106 modulates the immune system, produces durable responses in advanced HCCs (objective
107 response rate of 20% and median survival of 16 months)⁹. However, clinical benefit is not

108 related to PDL1 (the PD1 ligand) status on tumour cells⁹, highlighting the need to identify
109 alternative biomarkers to select ideal candidates for immunotherapy. To this end, the
110 observation by TCGA investigators that 22% of patients with HCC display high or moderate
111 levels of lymphocyte infiltration is of great interest⁵. This discovery is consistent with data
112 recently reported by our group defining the 'immune class' of tumours in ~27% of patients with
113 HCC, which is characterized by high infiltration of immune cells, expression of PD1 and PDL1,
114 and active IFN γ signalling¹⁰. Further investigation of the antitumour immune responses and the
115 interplay between cancer cells and the microenvironment will be critical for understanding if this
116 subgroup of patients might benefit from these therapies. In conclusion, genomics have
117 improved the understanding of the biology of HCC, but this knowledge has not yet been
118 translated into clinical practice. This study further fuels the concept that investigators are
119 striding down the right path towards precision medicine in HCC.

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Figure 1. Molecular classification of HCC. The figure shows the overlap between 3 iClusters identified from the analysis conducted by the The Cancer Genome Atlas (TCGA) Network (a)5 and the two major clusters previously proposed by Zucman-Rossi et al. (b)2. Bold text indicates common characteristics between the clusters of both proposals. See Zucman-Rossi et al.2 for details on subclasses termed S1–S3 and Cluster A or B. AFP, α -fetoprotein.

A)	iCluster		
	iCluster1	iCluster2	iCluster3
Clinical features	<ul style="list-style-type: none"> • Asian ethnicity • High-grade tumours • Macrovascular invasion • Worse outcome 		<ul style="list-style-type: none"> • Low-grade tumours • Less microvascular invasion • Better outcome
DNA somatic alterations	<ul style="list-style-type: none"> • BAP1 mutations 	<ul style="list-style-type: none"> • High chromosome instability • Chromosome17p loss • CDKN2A hypermethylation • TERT, CTNNB1 and TP53 mutations 	
Prognostic gene signatures	<ul style="list-style-type: none"> • IDH1/2 signature • S2 subtype 		<ul style="list-style-type: none"> • CDKN2A hypermethylation • TERT mutations • CTNNB1 mutations
B)	Proliferation		Non-Proliferation
	Progenitor-like	Hepatocyte-like	Hepatocyte-like
Clinical features	<ul style="list-style-type: none"> • HBV • High AFP • Poor differentiation • Vascular invasion • Worse outcome 		<ul style="list-style-type: none"> • HCV • Low AFP • Well–moderate differentiation • Less vascular invasion • Better outcome
DNA somatic alterations	<ul style="list-style-type: none"> • Chromosome 11q13 amplification (FGF19) 	<ul style="list-style-type: none"> • Poor differentiation • Vascular invasion • Worse outcome 	<ul style="list-style-type: none"> • CTNNB1 mutations
Prognostic gene signatures	<ul style="list-style-type: none"> • EPCAM • S2 subtype • Hepatoblastoma C2 • Hepatoblast-like • Cluster A • Vascular invasion 	<ul style="list-style-type: none"> • Late TGFβ • S1 subtype • Cluster A 	<ul style="list-style-type: none"> • S3 subtype • Cluster B

