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Mutant IDH inhibits HNF4 α to block hepatocyte differentiation and promote biliary cancer

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AUTHOR CONTRIBUTIONS

S.K.S. and C.A.P. contributed equally to the study. S.K.S., C.A.P., K.S.G., M.S.N. and S.G. carried out the experiments involving hepatoblasts and mouse models. K.R. and S.R. performed computational analysis on gene expression data. J.F. performed IHC on tissue sections. E.A.A. and K.W. assisted with the generation of the IDH mutant mice. V.D. analyzed the histology from the murine liver specimens. C.W. and U.A. carried out the experiments involving the HNF4 α KO mice. D.S., H.C., O.M., and J.M.L. performed the GSEA analysis on human IHCC samples. A.X.Z., A.F.H., and C.R.F. were involved in the study design. K.Y., K.S., J.T., J.P.M., and C.G. developed and provided the AGI-5027 compound and measured 2HG in our samples. S.K.S., C.A.P., and N.B. designed the experiments and wrote the paper. N.B. supervised the studies. All authors discussed the results and commented on the manuscript.

AUTHOR INFORMATION

K.Y., K.S., J.T., J.P.M., and C.G. are employees of Agios Pharmaceuticals. All other authors have no financial conflict of interest.

Abstract

Mutations in Isocitrate dehydrogenase 1 (*IDH1*) and *IDH2* are among the most common genetic alterations in intrahepatic cholangiocarcinoma (IHCC), a deadly liver cancer^{1–5}. Mutant IDH proteins in IHCC and other malignancies acquire an abnormal enzymatic activity allowing them to convert alpha-ketoglutarate (α KG) to 2-hydroxyglutarate (2HG), which inhibits the activity of multiple α KG-dependent dioxygenases, and results in alterations in cell differentiation, survival, and extracellular matrix maturation^{6–10}. However, the molecular pathways by which IDH mutations lead to tumour formation remain unclear. Here we show that mutant IDH blocks liver progenitor cells from undergoing hepatocyte differentiation through the production of 2HG and suppression of HNF4 α , a master regulator of hepatocyte identity and quiescence.

Correspondingly, genetically engineered mouse models (GEMMs) expressing mutant IDH in the adult liver show aberrant response to hepatic injury, characterized by HNF4 α silencing, impaired hepatocyte differentiation and markedly elevated levels of cell proliferation. Moreover, mutant IDH and activated Kras, genetic alterations that co-exist in a subset of human IHCCs^{4,5}, cooperate to drive the expansion of liver progenitor cells, development of premalignant biliary lesions, and progression to metastatic IHCC. These studies provide a functional link between IDH mutations, hepatic cell fate, and IHCC pathogenesis, and present a novel GEMM of IDH-driven malignancy.

Gain-of-function *IDH1/IDH2* mutations occur in ~25% of IHCCs^{1,3–5} but have not been identified in hepatocellular carcinomas (<http://www.sanger.ac.uk/cosmic>) — liver malignancies that exhibit bile duct and hepatocyte differentiation, respectively. To examine the role of IDH mutations in liver tumourigenesis we isolated mouse hepatoblasts (HBs), which are embryonic progenitors that give rise to hepatocytes and bile duct cells and show correspondence to adult liver progenitors^{11,12}. HBs expressing mutant IDH1 (R132C, R132H) or IDH2 (R140Q, R172K) produced increased 2HG, but exhibited morphology and proliferation rates indistinguishable from vector and IDH wild type (WT) controls (Extended Data Fig. 1a–d). However, unlike control HBs, which underwent hepatocyte differentiation when transferred from collagen-coated plates to uncoated plates¹³, forming hepatocyte clusters, decreasing proliferation, and activating a large program of hepatocyte-specific genes including *Adh1* and *Aldob*, IDH mutant cells were refractory to differentiation (Fig. 1a–d, Extended Data Fig. 1e–g). IDH1-R132C and IDH2-R172K caused the most pronounced effects, correlating with relative 2HG levels. Treatment of R132C-expressing HBs with ML309 (AGI-5027), a specific inhibitor of mutant IDH1¹⁴, attenuated 2HG production (Extended Data Fig. 1h) and restored hepatocyte differentiation (Fig. 1e–f). Conversely, differentiation of WT HBs was counteracted by (R)- or (S)-2HG *octyl*-esters (Extended Data Fig. 1i–j). In contrast to the complete inhibition of hepatocyte differentiation, mutant IDH did not impair biliary differentiation of HBs in matrigel (Fig. 1g, Extended Data Fig. 1k–l). Thus, mutant IDH specifically blocks hepatocyte lineage progression through 2HG production.

To uncover the molecular program underlying these defects, we examined the effect of mutant IDH1/2 on the transcriptome of HBs grown on collagen. Transcriptional profiles of mutant IDH 1 and 2 clustered together and Gene Set Enrichment Analysis (GSEA) demonstrated reduced expression of targets of HNF4 α — a master transcriptional regulator of hepatocyte differentiation¹² — and of HNF1 α which acts downstream of HNF4 α ¹⁵.

Moreover, canonical HNF4 α and HNF1 α binding sites were strongly enriched at the promoters of differentially expressed genes (Fig. 2a, Extended Data Fig. 2a–c).

HNF4 α has multiple isoforms expressed from separate promoters. The P2 promoter (encoding *Hnf4a7-9*) is active in hepatoblasts and gradually extinguished in adult hepatocytes, whereas the P1 promoter (encoding *Hnf4a1-6*) is hepatocyte-specific¹⁶. *Hnf4a7-9* mRNA and protein were reduced in IDH-mutant HBs, as was expression of HNF4 α targets (Extended Data Fig. 2d–g). Moreover, under hepatocyte differentiation conditions, mutant IDH completely inhibited the pronounced induction of HNF4 α 1-6 and its target OCLN that is observed in control cells (Fig. 2b–c, Extended Data Fig. 2h). Mutant IDH or *octyl-2HG* treatment blocked *Hnf4a1-6* mRNA induction, whereas AGI-5027 restored *Hnf4a1-6* levels in R132C-expressing cells (Extended Data Fig. 2i–k). Histone H3 lysine-4 trimethylation (H3K4Me3) is associated with active transcription and was specifically reduced at the P1 promoter in R132C HBs, consistent with the observed silencing of *Hnf4a1-6*, whereas the repressive marks, H3K27me3 and H3K9me3, were unaffected (Extended Data Fig. 2l–m and data not shown). Significantly, HNF4 α knockdown impaired hepatocyte differentiation of WT HBs without inhibiting biliary differentiation, whereas ectopic HNF4 α expression rescued differentiation of IDH-mutant cells (Fig. 2d–h, Extended Data Fig. 2n–o, 3a–b). Thus, mutant IDH alters the epigenetic state of the P1 promoter — through targeting either direct regulators of the locus or more upstream factors — and prevents induction *Hnf4a1-6*, thereby blocking hepatocyte lineage progression. Notably, HNF4 α and HNF1 α have critical anti-proliferative and tumour suppressor functions in the adult liver^{17–20}, suggesting the relevance of this pathway to mutant IDH-mediated tumourigenesis and prompting us to extend our studies *in vivo*.

We generated transgenic mice with doxycycline-inducible expression of IDH2-R140Q or IDH2-R172K (*Tet-R140Q*, *Tet-R172K* strains) specifically in adult hepatocytes — R140Q was detected in virtually all hepatocytes and R172K showed more scattered expression, and liver 2HG levels were elevated (Extended Data Fig. 4a–d, 5a). Since mutant IDH blocks liver progenitors from undergoing hepatocyte differentiation *in vitro*, we sought to address whether it acts analogously *in vivo* to specifically override differentiation from a progenitor cell state, or conversely, whether it broadly alters homeostasis of mature hepatocytes. Although normally quiescent, the liver has extensive regenerative capacity following injury involving replication of mature hepatocyte and biliary cells, or activation of bipotential progenitors (oval cells) that may arise from either lineage^{11,21}. In the absence of injury, *Tet-R140Q* mice were healthy up to 48 weeks, and had normal liver histology, marker expression, proliferation, and liver function (Fig. 3d, Extended Data Fig. 5b, and data not shown). By contrast, pronounced defects in restoration of hepatocyte differentiation were observed in mice fed a diet containing 3,5-diethoxycarbonyl-1,4-dihydrocollidin (DDC) for 5 days then switched to normal diet for 3 weeks (Fig. 3a), a protocol causing hepatocyte cell death and transient oval cell activation^{21,22}. Hepatocyte markers including HNF4 α were downregulated 3–10-fold, while biliary markers were unchanged, and proliferation was increased >40-fold relative to WT controls (Fig. 3b–d). Despite this depletion of mature hepatocytes, no changes were seen in parameters of liver function (Extended Data Fig. 5c–d and data not shown), consistent with the persistence of hepatocytes surviving short-term

DDC treatment and the established capacity of reduced hepatocyte numbers to maintain normal physiology.

Serial analyses of WT and R140Q livers revealed comparable numbers of proliferating periductal HNF4 α ⁻/CK19⁻ oval cells at 1 week, and resolution of this population after 3 weeks (Extended Data Fig. 6a–b, and Fig. 3e–f). However, R140Q livers exhibited prominent induction of proliferating non-periductal cells with hepatocyte morphology but reduced or absent HNF4 α expression (HNF4 α ⁺ and HNF4 α ⁻/CK19⁻), which persisted after 3 weeks (Fig. 3e–f, Extended Data Fig. 6a–d). Similar but more tempered phenotypes were seen in *Tet-R172K* mice, consistent with focal transgene expression (Extended Data Fig. 6e–f). Thus, mutant IDH specifically blocks restoration of hepatocyte differentiation following acute liver injury, leading to aberrant proliferation in the hepatic parenchyma. As HNF4 α levels increase in liver progenitors undergoing hepatocyte commitment^{23,24}, these proliferating HNF4 α -low/absent cells appear to be committed progenitors (derived from de-differentiated hepatocytes or oval cells) whose differentiation to hepatocytes is subverted by mutant IDH2. The transgene was not expressed in Sox9⁺ oval cells, precluding assessment of effects on these earlier progenitors.

We developed an additional transgenic strain (*LSL-R172K*) expressing human IDH2-R172K in Sox9⁺ biliary cells but not in hepatocytes (Fig. 3g, Extended Data Fig. 7a–b). These animals displayed normal liver histology, gene expression, and proliferation at 3 months (Extended Data Fig. 7c and data not shown). However, by 20 months of age there was pronounced accumulation of Hnf4 α ⁻/Sox9⁺ oval cells expressing R172K >25 μ m away from any bile duct or portal structure (zones 2/3) (Fig. 3g). Collectively, our results suggest that mutant IDH2 abrogates differentiation of adult progenitors (activated spontaneously during aging or by injury), specifically blocking hepatocyte lineage progression.

These findings are concordant with our observations in HB cells and suggest that failed HNF4 α induction could contribute to the liver phenotypes caused by mutant IDH *in vivo*. In this regard, acute HNF4 α deletion in hepatocytes is reported to provoke hepatocyte differentiation defects and, upon diethylnitrosamine (DEN) treatment, oval cell accumulation and formation of tumours showing hepatocellular carcinoma (HCC) and IHCC morphology²⁰. To expand upon potential parallels with IDH-mutant mice, we characterized these phenotypes in further depth. Significantly, the HCC lesions in DEN-treated *HNF4a* conditional KO mice were uniformly HNF4 α ⁺, indicating that they arose from cells that escaped deletion of the locus (Extended Data Fig. 8a). By contrast, Sox9⁺ oval cells and CK19⁺ IHCCs were HNF4 α -negative and were never observed in DEN-treated controls (Extended Data Fig. 8b–c). Thus, HNF4 α ablation in DEN-treated livers drives progenitor expansion and progression specifically to IHCC. These findings establish *Hnf4a* as an IHCC tumor suppressor and are consistent with HNF4 α acting downstream of mutant IDH in liver growth control.

The capacity of mutant IDH to silence *Hnf4a* and impair differentiation would be expected to confer sensitivity to transformation by additional oncogenic lesions. In this regard, IDH and KRAS mutations exist concurrently in human IHCC^{4,5} and AML²⁵. Previously, we showed that Kras^{G12D} expression in mouse liver causes mixed IHCC/HCC with long

latency, a phenotype accelerated by p53 deletion²⁶. Intercrossing *LSL-R172K*, *Kras^{G12D}* and *Alb-Cre* mice revealed dramatic oncogenic cooperation, with 6/6 *Alb-Cre; LSL-R172K; Kras^{G12D}* animals developing poor body condition and palpable liver tumours between 33 and 58 weeks (mean 47.3 weeks; Fig. 4a). Multifocal liver masses with splenic invasion and peritoneal metastases were observed and demonstrated to be IHCC by histopathologic analysis, CK19 staining, and lack of reactivity for the hepatocyte/HCC marker, Hep Par1 (Fig. 4b). By contrast, only 1/7 *Alb-Cre; Kras^{G12D}* mice sustained a tumour by 70 weeks (mean survival = 81.6 weeks), and solely HCC were detected (Extended Data Fig. 8d). Tumour 2HG levels in R172K mice were comparable to those in IDH-mutant human IHCC¹ (Extended Data Fig. 8e).

In humans, IHCC is thought to develop from precursor lesions, including biliary intraepithelial neoplasias (BillIN)². Aberrant oval cell proliferation also precedes liver cancer development in murine models²⁷. Notably, in all *Alb-Cre; LSL-R172K; Kras^{G12D}* mice analyzed (N=6), the adjacent liver exhibited oval cell expansion and a graded series of BillIN-like lesions, which were Sox9⁺/CK19⁺, and expressed the IDH2-R172K transgene at physiologic levels (Fig. 4c, Extended Data Fig. 9a–b, 10a). Importantly, neither *Alb-Cre; Kras^{G12D}* nor *Alb-Cre; Kras^{G12D}; p53^{Lox/+}* livers²⁶ showed oval cell expansion, and BillIN were found in only 2/8 *Alb-Cre; Kras^{G12D}; p53^{Lox/+}* mice. Thus, IDH2-R172K and *Kras^{G12D}* cooperatively incite activation of hepatic progenitors and multistage IHCC progression.

In summary, we present a novel GEMM driven by mutant IDH that exhibits the hallmarks of human IHCC. Mutant IDH blocks hepatocyte differentiation from progenitors *in vitro*, and regulates hepatic regeneration, progenitor cell expansion, and IHCC pathogenesis *in vivo*. Collectively, our findings are consistent with a model whereby mutant IDH subverts the HNF4 α -mediated hepatocyte differentiation/quiescence program in proliferating hepatocytes or bipotential progenitors, creating a persistent pre-neoplastic state primed for transformation by additional oncogenic mutations, and leading to adenocarcinoma specifically with a biliary phenotype (Fig. 4d). While lineage-tracing studies are required to fully define the impact of IDH mutations on different liver cell types, this model predicts that IDH-mutant IHCC may have progenitor-like features, and that IDH mutations occur early in disease pathogenesis as observed in glioblastoma and AML^{28,29}. Accordingly GSEA revealed that IDH-mutant tumors have strong enrichment of a hepatic stem cell expression signature (Extended Data Fig. 10b).

Defining the biologic functions of mutant IDH is of immediate significance as IHCCs are resistant to current treatment. Our GEMM provides an autochthonous context for ‘co-clinical trials’ to help determine the best way to deploy IDH inhibitors and identify biomarkers of response, thereby informing clinical decision-making in this deadly disease.

METHODS SUMMARY

Cell culture

HB cells were prepared from WT mice at embryonic day 14 and subjected to hepatocyte and bile duct differentiation as described¹³. For proliferation assays, cells were plated in

duplicate on collagen-coated or uncoated 6 well plates. Cells were trypsinized and counted by trypan-blue exclusion.

Mice

Mice were housed in pathogen-free animal facilities. Studies were approved by the Subcommittee on Research Animal Care at Mass. General Hospital (protocol 2005N000148). The Tet-R140Q, Tet-R172K, and LSL-R172K transgenic mice and other strains are presented in the Methods Section. For DDC experiments, mice were maintained on 200 µg/mL doxycycline-containing water. Mice were fed with 0.1% DDC-containing chow (F4643, Bio-serv, Frenchtown, NJ) from days 2–7. Mice were then switched to normal chow until harvest. DEN experiments were performed as described²⁰.

Statistics

Results are expressed as mean ±s.d. unless otherwise specified. Significance was analyzed using 2-tailed Student's *t* test. A p-value of less than 0.05 was considered statistically significant.

METHODS

Cell culture

HB cells were prepared from WT mice at embryonic day 14 and immortalized by plating at clonal density¹³. HBs were maintained in HB media [DMEM/F-12 (Gibco Life Technologies, Grand Island NY) containing 10% fetal bovine serum, 1% penicillin-streptomycin, 50ng/mL epidermal growth factor, 30 ng/mL insulin-like growth factor II (PeproTech, Rocky Hill, NJ), 10 µg/mL insulin (Roche, Mannheim, Germany)] on plates coated with rat tail collagen (BD Biosciences, Bedford, MA) in a humidified atmosphere with 5% CO₂ at 37°C. For IDH1 experiments, culture media was supplemented with 25 ng/mL of doxycycline (d9891, Sigma-Aldrich). For hepatocyte differentiation assays, 5×10⁶ HB cells were cultured on uncoated 10 cm tissue culture dishes in HB cell medium for up to 5 days. Pictures were taken 2–5 days after plating. For bile duct differentiation (matrigel) assays, 0.5 mL of Basement Membrane Matrix (BD) was coated onto 6 cm tissue culture dishes and allowed to set for 1h. Then 0.5×10⁶ HB cells were added to the plate in HB cell media supplemented with 100 ng/mL recombinant mouse hepatocyte growth factor (HGF) (R&D Systems, Minneapolis, MN). Tubules were counted after 24hrs. For gene expression analysis, cells were isolated after 10 days. For proliferation assays, cells were plated in duplicate on collagen-coated 6 well dishes (1×10⁴/well) or uncoated 6 well plates (1×10⁵/well) in culture medium. Adherent and non-adherent cells were harvested, trypsinized and counted by trypan-blue exclusion using a Countess Automated Cell Counter (Invitrogen) 24, 72 or 120 hrs later. Negative mycoplasma contamination status of all cell lines and primary cells used in the study was established using LookOut Mycoplasma PCR Kit (Sigma, MP0035).

AGI-5027

AGI-5027 (ML309) is a small molecule (phenyl-glycine scaffold) inhibitor of IDH1 R132C and R132H (IC₅₀=30 nm and 68 nm respectively) that does not affect WT IDH1 activity

(IC₅₀ >36 μM and was developed by NIH Chemical Genomics Center and Agios Pharmaceuticals¹⁴.

Mice

Mice were housed in pathogen-free animal facilities. All experiments were conducted under protocol 2005N000148 approved by the Subcommittee on Research Animal Care at Massachusetts General Hospital. Mice were maintained on mixed 129SV/C57Bl/6 background. Data presented include both male and female mice. All mice included in the survival analysis were euthanized when criteria for disease burden were reached.

Albumin-Cre transgenic mice—This strain³⁰ harbors a transgene in which the mouse albumin enhancer/promoter drives Cre recombinase. Cre activity is inefficient at birth, but leads to progressive deletion of floxed sequences in all liver lineages by 4–6 weeks of age.

Rosa26-LSL-rtTA³¹ mice—In this strain, the doxycycline-responsive reverse tetracycline transactivator (rtTA) is knocked into the transcriptional start site at the ubiquitously expressed Rosa26 locus and is preceded by a lox-stop-lox (LSL) cassette.

Kras^{G12D} mice³²—This allele consists of a mutant Kras^{G12D} allele knocked into the endogenous Kras locus, preceded by an LSL cassette.

IDH mutant transgenic mouse models—To generate transgenic mice, the R140Q and R172K mutations were introduced into human IDH2 cDNA (Origene, Rockville, MD # SC319226, accession# NM_002168) using the Quickchange kit (Agilent Lexington, MA #200521) per the manufacturer's instructions. Two different transgenic targeting approaches were used.

Doxycycline inducible models: To generate the doxycycline-inducible *Tet-R140Q* and *Tet-R172K* strains (Extended Data Fig. 4), IDH2-R140Q cDNA was cloned into the pBS31 Prime transgenic targeting vector (Thermo Scientific Open Biosystems, #MES4487). A modified version of pBS31 containing a floxed stop cassette was used for the IDH2-R172K mice. The targeting vectors were co-electroporated into C2 mouse embryonic stem cells (Thermo Scientific Open Biosystems, #MES4305) with a plasmid expressing FLPE recombinase (pCAGGS-FlpE, Thermo Scientific Open Biosystems, Waltham MA, #MES4488) as described³³. This system involves single copy integration of the transgene downstream of the Collagen-1 locus, and within the liver, results in expression in hepatocytes but not in bile ducts³³. ES cells were screened for integration of the transgene by PCR and correctly targeted ES cells were injected into C57Bl/6 blastocysts. Chimeras were crossed to the *Albumin-Cre* strain³⁰, and offspring were successively crossed with *Rosa26-LSL-rtTA*³¹, and *LSL-Kras^{G12D}* mice³². We confirmed the expected expression of the R140Q (Extended Data Figure. 4b–c) and R172K transgenes (Extended Data Fig. 4d) in the adult hepatocytes and lack of expression in bile ducts. **Stably expressed model:** To generate mice with a conditionally active IDH2-R172K allele (LSL-R172K), human IDH2-R172K was cloned into a modified version of the PGK-ATG-Frt vector (Open Biosystems, Waltham MA, #MES4490) containing the CAGGS promoter for stable expression

(Extended Data Fig 7a)³⁴. Gene targeting and chimeric mouse generation was as above. This strain was successively crossed with Albumin-Cre and *LSL-Kras^{G12D}* animals. This transgene was specifically expressed in bile ducts and oval cells (Fig. 3g and Extended Data Fig. 7b). We did not observe developmental anomalies in these mice, although the inefficiency of recombination induced by the Alb-Cre strain in neonates and the restricted activity of the transgene in this system precludes definitive assessment of potential effects of mutant IDH2 on the embryonic liver.

DDC treatment

For DDC experiments, 4-week old mice were treated with 200 µg/mL doxycycline-containing water. 2 days later, mice were fed with 0.1% DDC-containing chow (F4643, Bioserv, Frenchtown, NJ) for 5 days. The mice were then switched to normal chow and maintained on doxycycline-containing water until harvest 1 or 3 weeks later. Randomization was done according to genotype and blinding was applied during histological analysis. No mice were excluded from the analysis. Sample sizes were chosen to achieve statistical significance yet use the fewest animals possible to minimize suffering.

Statistics

Results are expressed as mean ±s.d. between two technical replicates, unless otherwise specified. Significance was analyzed using 2-tailed Student's *t* test. A p-value of less than 0.05 was considered statistically significant.

Plasmids

Human wild-type IDH1 cDNA (Accession# NM_005896) was obtained from Origene and subcloned into pRetro-Puro using EcoRI and BamHI fragments. Human wild-type IDH2, R140Q and R172K cDNA (Origene) were subcloned into pRetro-puro and pMSCV-blast (derived by replacing the puromycin resistance gene from pMSCV-puro with a blasticidin resistance gene) (both from Clontech, Mountain View CA) using EcoRI and XhoI. Human IDH1 R132C was generated from wild-type IDH1 using QuikChange Lightning kit (Agilent Technologies, Santa Clara, CA) and primers 5'-GATGGGTAAAACC TATCATCATAGGTTGTCATGCTTATGGGGATCAATAC-3' for sense and 5'-GTATTGATCCCCATAAGCATGACAACCTATGATGATAGGTTTTACCCATC-3' for antisense. pLVX-Tet-On was obtained from Clontech (Mountain View, CA). Murine *Hnf4a* was obtained from Addgene (Cambridge, MA) and cloned into pRetro-blast (derived by replacing the puromycin resistance with blasticidin) as a BglII-EcoRI fragment. Lentiviral (pLKO.1) *Hnf4a* shRNA vectors TRCN0000026154, target sequence: 5'-CGACAATGTGTGGTAGACAAA-3' and TRCN0000026216, target sequence: 5'-GCAGATTGATGACAATGAATA-3' were used as shHnf4a#1 and shHnf4a#2, respectively, and were obtained from the Broad Institute TRC shRNA library. pLKO.1 shRNA with target sequence 5'-GCAAGCTGACCCTGAAGTTCAT-3' was used as negative control shRNA. *Hnf4a* resistant to shHnf4a#2 was generated using QuikChange Lightning kit and primers 5'-GCCCTTCCAAGAGCTGCAGA TCGACGATAACGAATATGCCTGCCTCAAAGCC-3' for sense and 5'-

GGCTTTGAGGCAGGCATATTCGTTATCGTCGATCTGCAGCTCTTGGAAGGGC-3'
for antisense.

Immunoblot analysis

Cell extracts were prepared in 1x RIPA buffer (150mM NaCl, 1% IGEPAL, 0.1%SDS, 50mM Tris, 0.5% DOC) supplemented with a protease inhibitor cocktail (Complete, Roche Applied Science, Indianapolis, IN) and phosphatase inhibitors (Phosphatase Inhibitor Cocktail Sets I and II, Calbiochem, San Diego, CA) and quantified by BCA Protein Assay (Thermo Scientific, Rockford, IL). 30 µg protein was resolved on 9% SDS-PAGE gels and transferred onto PVDF membranes (GE Healthcare Life Sciences, Pittsburgh, PA). Membranes were blocked in TBS with 5% non-fat milk and 0.1% Tween and probed with anti-IDH1 polyclonal antibody (3997S, Cell Signaling, Danvers, MA), anti-IDH2 polyclonal antibody (ab84726, Abcam, Cambridge, MA), anti-occludin (71-1500, Invitrogen), anti-HNF4α (1-6) monoclonal antibody (ab41898, Abcam), anti-HNF4α(1-6)/NP2A1 monoclonal antibody (PP-K9218-00, R&D Systems, Minneapolis, MN), anti-HNF4α(7-9) monoclonal antibody (PP-H6939-00, R&D Systems), or anti-βactin monoclonal antibody (A5316, Sigma-Aldrich, St. Louis, MO) as loading control. Bound proteins were detected with horseradish-peroxidase-conjugated secondary antibodies (Vector Biolaboratories, Burlingame, CA) and SuperSignal West Pico Luminol/Enhancer Solution (Thermo Scientific).

RNA analysis

Total cellular RNA was extracted using RNeasy Mini Kit (Qiagen, Valencia, CA). cDNA synthesis was performed with the QuantiTect Reverse Transcription Kit (Qiagen) with 1µg total RNA. Sense and antisense for amplification of target genes included: *Alb* (5'-CATGCCAAATTAGTGCAGGA-3' and 5'-GCTGGGGTTGTCATCTTTGT-3'); *Aldob* (5'-TGTCTGGAGGTATGAGTGAGG-3' and 5'-CTGGGTTGCCTTCTTGTTC-3'); *Adhl* (5'-GTGACTTGTGTGAAACCAGGT-3' and 5'-GCTACAAAAGTTGCTTTCCGGG-3'); *Ggt1* (5'-CTTGTGCGAGGTGTTCTGC-3' and 5'-GCATAGTCACCGTCTCTCCTT-3'); *Bgp* (5'-CAAAAGGAGGCCTCTCAGAT-3' and 5'-GCTGAGGGTTTGTGCTCTGT-3'); *Hnf4α(1-6)* (5'-GGTAGGGGAGAATGCGACTC-3' and 5'-AAACTCCAGGGTGGTGTAGG-3'); *Foxm1* (5'-ATCGCTACTTGACATTGGACCA-3' and 5'-GATTGGGTCGTTTCTGCTGTG-3'); *Krt19* (5'-TGCTGGATGAGCTGACTCTG-3' and 5'-AATCCACCTCCACACTGACC-3'); *Onecut1* (5'-GGCAACGTGAGCGGTAGTTT-3' and 5'-TTGCTGGGAGTTGTGAATGCT-3'); *Arg1* (5'-TTGGGTGGATGCTCACACTG-3' and 5'-GTACACGATGTCTTTGGCAGA-3'); *C2* (5'-GGAACCCATTTGCCGACAG-3' and 5'-GGCCCAAACCTTTTGTGTCAGAAG-3'); *C7* (5'-GCAGGAAAGTGTTCAGCGG-3' and 5'-CATGACCGTAAGTATCCGTGAG-3'); *C9* (5'-CATGCCGTGACCGAGTAGC-3' and 5'-TCACAGAGTCCGTTGTAGAAG-3'); *Krt7* (5'-CACCCGGAATGAGATTGCG-3' and 5'-GCACGCTGGTTCTTCAAGGT-3'); *Sprr1a* (5'-TTGTGCCCCCAAACCAAG-3' and 5'-GGCTCTGGTGCCTTAGGTTG-3'); *Tr* (5'-CACCAAATCGTACTGGAAGACA-3' and 5'-GTCGTTGGCTGTGAAAACCAC-3'); *ApoB* (5'-TGGCTCTGATCCCAAATCCCT-3'

and 5'-GCTGCTCCTTGGCAGTATTTAA-3'); *Cyp3a13* (5'-GACCACAAGCAGTGCTCTTTC-3' and 5'-GCAGGGTATCATAGGTGGCAG-3').

Gene expression profiling and gene-set enrichment analysis

Gene expression of HBs expressing IDH1 WT, IDH1 R132C, IDH2 WT, R172K and empty vector controls (N=2 cultures for each condition) grown on collagen-coated plates, as well as IDH1 R132C and empty vector controls grown on uncoated plates, was evaluated using Affymetrix Mouse 430Av2 DNA microarrays (DFCI Microarray core facility). Raw expression values were processed and normalized using RMA in the R Bioconductor package. This dataset is available in GEO (GSE57002). Differentially expressed genes in IDH1 R132C and IDH2 R172K expressing HBs were identified using the signal-to-noise metric. Gene Set Enrichment Analysis (GSEA) of the expression data was used to uncover the molecular program accounting for the differentiation defects. GSEA was performed using two libraries from version 3.1 of the molecular signature database (<http://www.broadinstitute.org/gsea/msigdb/index.jsp>): the c2 curated gene sets from online pathway databases, PubMed publications, knowledge of domain experts and the c3 motif gene sets. Pairwise GSEA analysis such as shown in Fig. 2a was performed by creating ranked lists of genes using the log₂ ratio of mutant IDH samples to vector or WT control and running GSEA in the ranked list mode. The heat map in Fig. 2a presents the gene-sets that distinguish IDH1 R132C or IDH2 R172K as compared to cells expressing WT IDH1 or IDH2 or EV. Each column represents pairwise analysis of HB cells expressing mutant IDH (IDH1 R132C or IDH2 R172K) with either EV (left columns) or WT IDH (right columns) control cells for two independent replicates of each sample. All other results were obtained using GSEA to rank genes according to signal-to-noise ratio between mutant IDH samples and controls. Statistical significance for GSEA results were obtained from permuting gene sets (1000 permutations). Gene sets of 'Hepatocyte Genes' for the GSEA results shown in Extended Data Fig. 1g were created from expression data from Shin, et al. 2011³⁷. The expression data was downloaded from GEO (GSE28891) in series matrix form and loaded into R. Undifferentiated, differentiated hepatocytes, and primary hepatocyte samples were selected from GSE28891 (4 samples of each type for a total of 12). Within that sample subset, the normalized signal intensities were thresholded to a minimum value of 10 and features were filtered out if they had less than 3 fold difference between minimum and maximum values or had absolute differences less than 50 between minimum and maximum values (leaving 21277 features out of 37908). A t-test was performed between the undifferentiated and the combined differentiated and primary hepatocyte samples and p-values from the t-test were corrected for multiple hypothesis testing using the Benjamini-Hochberg correction (in R using the Bioconductor multtest package). This left 206 features up and 407 down in the hepatocyte direction with an adjusted BH p-value < 0.01 which are represented by 133 and 311 unique gene symbols respectively. 96 of these genes were represented on the murine Affymetrix array. The feature list was made into a gene set labeled as 'Hepatocyte Genes' and is shown in Supplementary Table 1.

Chromatin Immunoprecipitation

5×10⁶ EV, IDH1 WT or R132C-expressing HBs were transferred from collagen-coated to uncoated plates for 5 days and fixed in 1% formaldehyde for 10 minutes at 37°C. Cross-

linking was terminated by the addition of glycine at a final concentration of 125mM for 5min. Cells were then harvested and washed twice with ice-cold PBS. Chromatin extraction, DNA sonication, and immunoprecipitation were performed using a Chromatin Immunoprecipitation (ChIP) Assay Kit (17-295, Millipore, Temecula, CA) and ChIPab+ Trimethyl-Histone H3 (Lys4) (17-614, Millipore) or Tri-Methyl-Histone H3 (Lys4) Antibody (Cell Signaling, #9727S) validated antibody. Sense and antisense for amplification of target genomic regions included: *Hhex* (5'-GAAGGAGCCTGACCCTTTCC-3' and 5'-ATCAGCAGCGTGCCTACTC-3'); *Hoxa10* (5'-AACAGTAAAGCTTCGCCGGA-3' and 5'-AGTTCAGAAGGTCAGCCTGC-3'); *Hnf4a* P1 (5'-AACATGGCCCTATCTTCGGG-3' and 5'-AAACGCACACCGCTATGTTG-3').

Histology and Immunostaining

Tissue samples were fixed overnight in 4% buffered formaldehyde, and then embedded in paraffin and sectioned (5 µm thickness) by the DF/HCC Research Pathology Core. Hematoxylin & eosin staining was performed using standard methods. For immunohistochemistry, unstained slides were baked at 55°C overnight, deparaffinized in xylenes (2 treatments, 6 min each), rehydrated sequentially in ethanol (5 min in 100%, 3 min in 95%, 3 min in 75%, and 3 min in 40%), and washed for 5 min in 0.3% Triton X-100/PBS (PBST) and 3 min in water. For antigen unmasking, specimens were cooked in a 2100 Antigen Retriever (Aptum Biologics Ltd, Southampton, UK) in 1X Antigen Unmasking Solution, Citric Acid Based (H-3300, Vector Laboratories), rinsed 3 times with PBST, incubated for 10 min with 1% H₂O₂ at room temperature to block endogenous peroxidase activity, washed 3 times with PBST, and blocked with 5% goat serum in PBST for 1h. Primary antibodies were diluted in blocking solution as follows: anti-R172K (26163, New East Biosciences) 1:100, anti-R140Q (26165 New East Biosciences) 1:100, anti-IDH2 (NBP2-22166, Novus Biologicals) 1:100, anti-HNF4α monoclonal antibody (PP-K9218-00, R&D Systems) 1:250, anti-CK19 (Troma3) 1:100; anti-Sox9 (ab5535, Millipore), 1:300; or anti-Ki67 (ab15580, Abcam), 1:100 and incubated with the tissue sections at 4°C overnight. Specimens were then washed 3 times for 3 min each in PBST and incubated with biotinylated secondary antibody (Vector Laboratories) in blocking solution for 1h at room temperature. Then, specimens were washed 3 times in PBST and treated with ABC reagent (Vectastain ABC kit #PK-6100) for 30 min, followed by 3 washes for 3 min each. Finally, slides were stained for peroxidase for 3 min with the DAB (Di-amine-benzidine) substrate kit (SK-4100, Vector Laboratories), washed with water and counterstained with hematoxylin. Stained slides were photographed with an Olympus DP72 microscope. For Immunofluorescence studies of tissue specimens, antigen unmasking was performed in 1X Antigen Retrieval Buffer, Tris-EDTA Buffer, pH 9.0 (ab93684, Abcam), rinsed briefly with dH₂O, washed for 5min in PBS, followed by 5 min in 0.05% Tween-20/TBS (TBST). Specimens were then blocked using 0.5% blocking reagent (FP1020, PerkinElmer) diluted in TBS (TNB) for 1h and incubated in primary antibodies at 4°C overnight in TNB, followed by 3 min washes in TBST and 1h incubation in secondary antibodies (1:400) diluted in TNB. Finally, specimens were rinsed 3 × 5 min in TBST and mounted using mounting media with DAPI (H-1500, Vectashield Vector Laboratories). For cell culture staining, samples were fixed in 4% paraformaldehyde (Fisher Scientific) in PBS for 20 min followed by washing four times in PBS. Residual paraformaldehyde was removed with three

5-min washes with 100 mM glycine in PBS. Cells were permeabilized with 0.3% Triton X-100/PBS and blocked for 30 min with blocking buffer (5% bovine serum albumin, 0.2% Triton X-100, 0.05% Tween 20, PBS). Coverslips were incubated with primary (1:100) and secondary (1:1000) antibodies diluted in blocking buffer for 1 h and 40 min, respectively, at room temperature, and nuclei were counterstained with 4',6-diamidino-2-phenylindole. Coverslips were mounted with immu-mount (Thermo-Shandon, Pittsburgh, PA). The following primary antibodies were used: rabbit anti-Sox9 (1:500; Millipore AB5535); goat anti-HNF4 α (SC6556, 1:250; Santa Cruz). Secondary antibodies were conjugated to Alexa-488, 555 or 647 (Life Technologies). Confocal images were captured by a scanning laser confocal microscope (Nikon Eclipse Ti; Nikon) using 40 \times or 60 \times oil lenses and captured using NIS-Elements software (Nikon). Images were processed using ImageJ and Adobe Photoshop CS4. For quantification of signal intensity ratios, channel intensities of individual cells were selected from at least 60 cells per sample from at 3- 5 images using the Measure RGB plugin of ImageJ and exported into Excel for further analysis.

2HG production and measurement

2HG-octyl esters were prepared from commercially available 2HG lactones (CAS# 21461-84-7 (S-) and 53558-93-3 (R-)). Esterification of lactone with 1-octanol and EDCI (CAS# 25952-53-8), followed by opening of the lactone with lithium hydroxide in tetrahydrofuran/water, yielded the 2HG-octyl esters (free carboxylic acid) upon neutralization and chromatographic purification. The sodium salts of both 2HG-octyl esters are available from Toronto Research Chemicals. LC-MS/MS analysis was performed using an AB Sciex 4000 (Framingham, MA) operating in negative electrospray mode. MRM data were acquired for each compound using the following transitions: 2HG (146.9/128.8 amu), 13C5-2HG (151.9/133.8 amu) and 3HMG (160.9/98.9 amu). Chromatographic separation was performed using an ion-exchange column (Bio-Rad Fast Acid Analysis, 9 μ m, 7.8 mm X 100 mm; Bio-Rad). The flow rate was 1ml/min of 0.1 % formic acid in water with a total run time of 4 minutes. Samples were prepared as follows: Tissues were weighed out and homogenized in appropriate volumes of PBS using Tissue Lyser (Qiagen). 10 μ l of homogenate were extracted by adding 200 μ l of methanol with 200 ng/ml 3HMG as internal standard. Cell pellets containing 1 \times 10⁶ cells each were resuspended in specified volumes of 80:20 MeOH:water, centrifuged for 10 minutes at 14,000 rpm. 30 μ l of supernatant were extracted by adding 170 μ l of methanol with 200 ng/ml 13C5-2HG as internal standard. All sample types were then vortexed, centrifuged at 4000 rpm at 5 $^{\circ}$ C and 150 μ l of supernatant transferred to a clean 96-well plate. The samples were dried down and reconstituted in 200 μ l 0.1% formic acid in water, and 10 μ l injected on a column.

Human samples and genomic studies

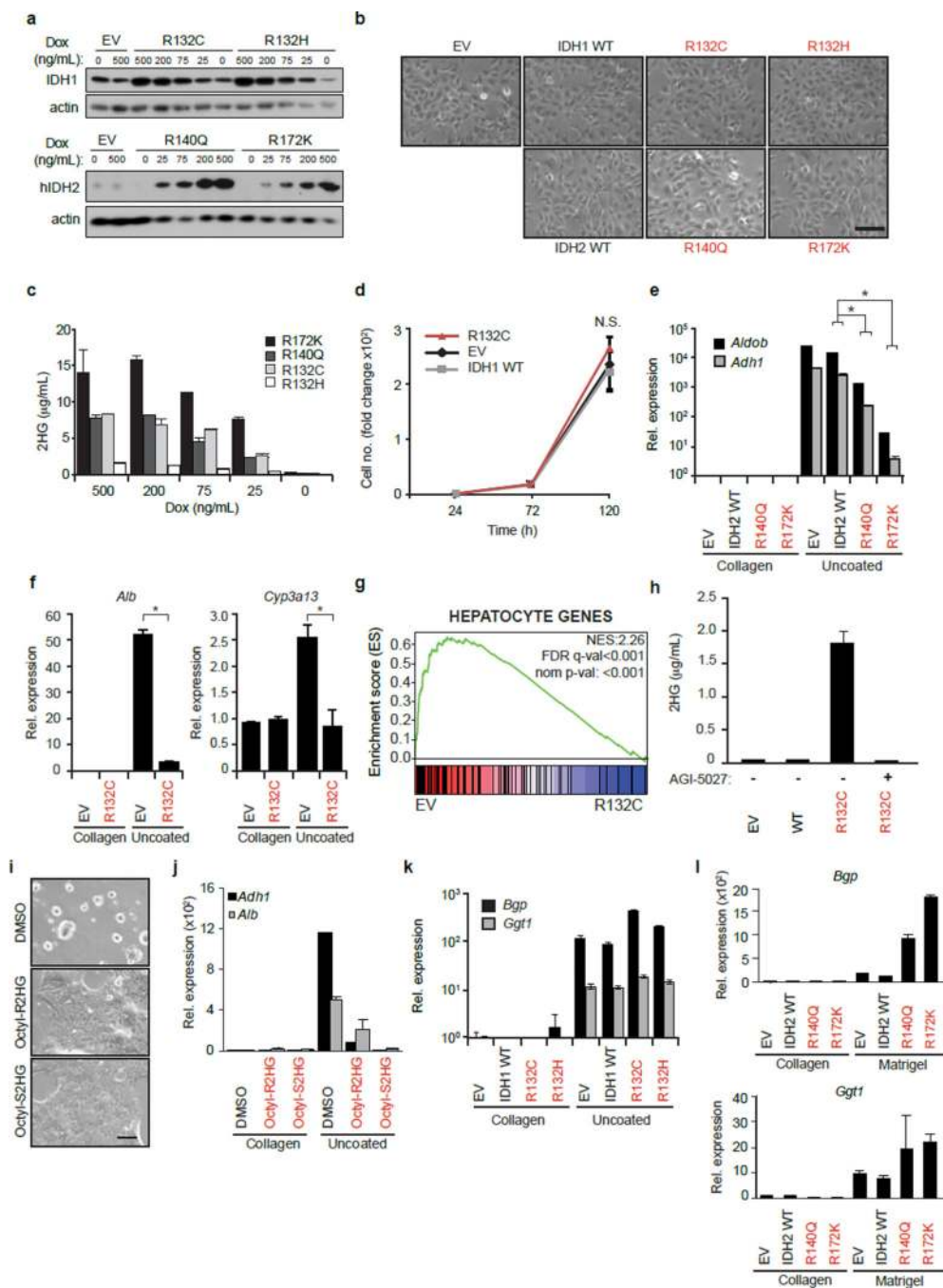
An initial cohort of 149 formalin-fixed, paraffin-embedded (FFPE) samples was obtained from ICC patients resected between 1995 and 2007 at three centers from the HCC Genomic Consortium: IRCCS Istituto Nazionale Tumori (Milan), Mount Sinai School of Medicine (New York), and Hospital Clinic (Barcelona). Pathological diagnosis of ICC was confirmed by two independent liver pathologists (MS and ST). DNA and RNA extraction from human tissue, whole-genome gene-expression profiling (DASL assay Illumina), and the Infinium FFPE restoration kit (Illumina) are extensively described elsewhere³⁶. The study protocol

was approved at each center's Institutional Review Board. A total of 127 samples had available data for both gene expression and DNA copy number changes and were analyzed for molecular characterization to define molecular-based classes. *IDH1* and 2 mutations occurring at Arginine residue 132 and 172 respectively were analyzed by PCR technique using primers 5'-GTGGCACGGTCTTCAGAGA-3' (forward primer) and 5'-TGCTTAATGGGTGTAGATACCAA-3' (reverse primer), and 5'-GCCACACATTTGCACTCTA-3' (forward primer) and 5'-AAGGAAAGCCACGAGACAGA-3' (reverse primer). The PCR amplifications were performed in a volume of 25µL reaction mixture containing 1.5mM MgCl₂, 0.2mM of each dNTP, 0.125mM of each primer and 1U of Platinum Taq DNA Polymerase (Invitrogen). PCR products were purified using the Qiaquick PCR purification kit (Qiagen) and sequenced using an Applied Biosystems 3700 DNA sequencer (ABI PRISM® 3730XL; Applied Biosystems). Good quality sanger sequencing data for both *IDH1* and *IDH2* was obtained for 107 ICC DNA samples and has been included in all the subsequent analyses.

Human Gene Set Enrichment Analysis

Genes, molecular pathways, and gene expression signatures associated with the classes were evaluated using Gene Set Enrichment Analysis (GSEA) for Molecular Signature Database gene sets (MSigDB, www.broadinstitute.org/msigdb). Data analysis was conducted using the GenePattern Analytical Toolkit³⁷, whereas correlation with clinico-pathological parameters was performed with SPSS software® (version 18) as previously described³⁶.

Extended Data



Extended Data Figure 1. Impact of mutant IDH1 and IDH2 on HB cell differentiation
a. Primary HB cells were engineered to express the indicated human IDH alleles or empty vector (EV) under a Dox-inducible system. Lysates from HB cells cultured in the presence of increasing Dox concentrations were analyzed by immunoblot using an antibody that recognizes both murine and human IDH1 (Upper panel) or with an antibody specific to human IDH2 (lower panel); actin is the loading control. Note that 25 ng/ml Dox induces

physiologic levels of IDH1 expression and was used in the experiments shown in Fig. 1 and 2 of the main text.

b. Photomicrographs of cells grown for 2 days on collagen-coated plates in the presence of 25ng/mL Dox.

c. HB cells cultured in the presence of increasing Dox concentrations were analyzed by LC-MS for levels of intracellular 2HG.

d. Growth curve of HBs cultivated on collagen-coated dishes.

e, f. HB cells from **(a)** were grown on collagen-coated or uncoated plates and analyzed for expression of hepatocyte markers by qRT-PCR.

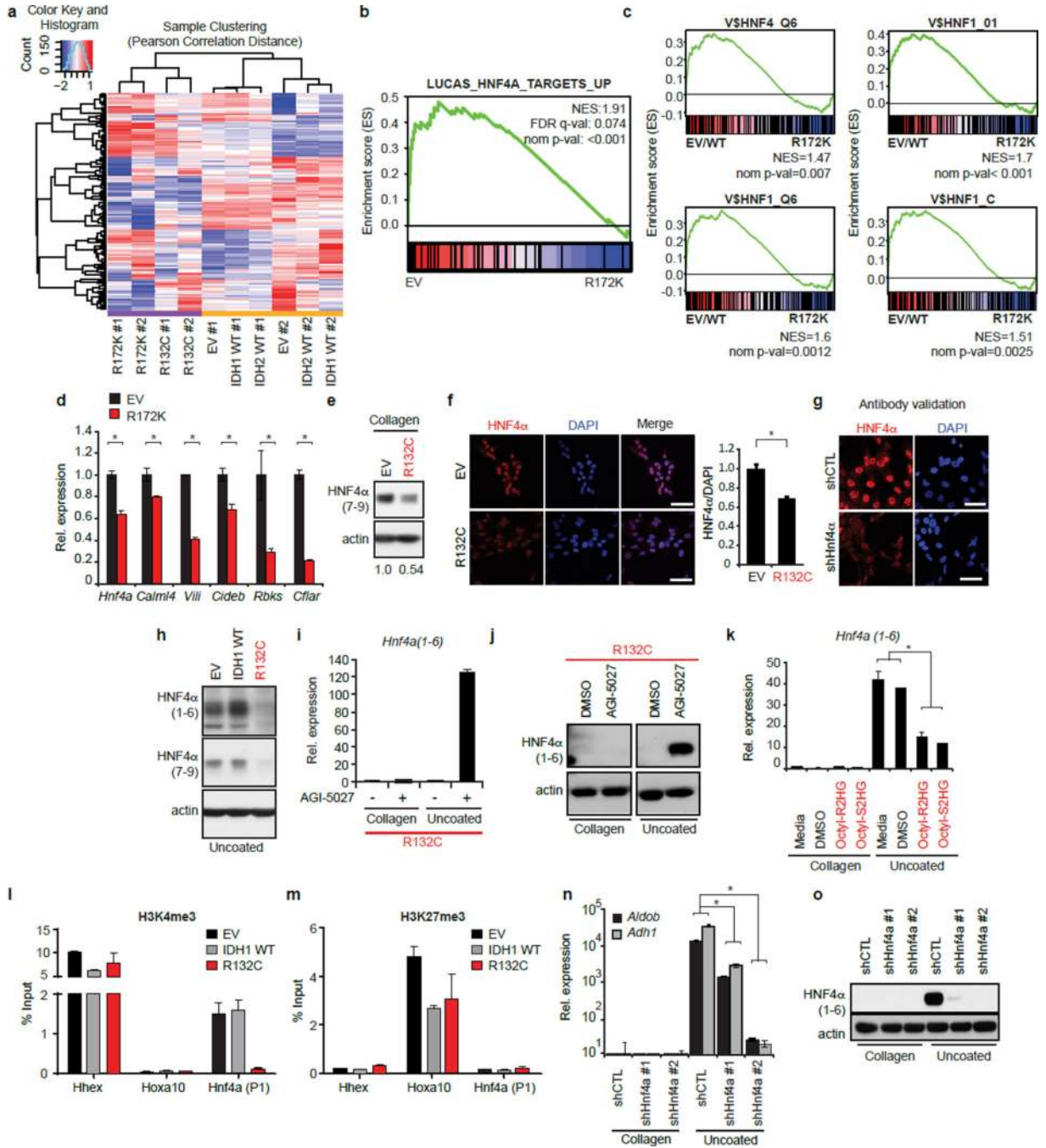
g. Enrichment plot showing downregulation of a hepatocyte gene set (Gene Expression Omnibus, GSE28892) in R132C-expressing cells. NES = Normalized Enrichment Score. FDR = False discovery rate.

h. 2HG levels in HB cells expressing the indicated IDH alleles or EV and treated with AGI-5027 (+) or DMSO vehicle (-).

i, j. WT HBs were treated with 500 μ m octyl-(R) or (S) enantiomers of 2HG or DMSO vehicle, and tested for hepatocyte differentiation upon transfer to uncoated plates by hepatocyte sphere formation **(i)** or qRT-PCR **(j)**.

k, l. HB cells expressing the indicated alleles were tested for biliary differentiation upon transfer to matrigel as assessed by qRT-PCR for the induction of biliary makers *Bgp* and *Ggt1*.

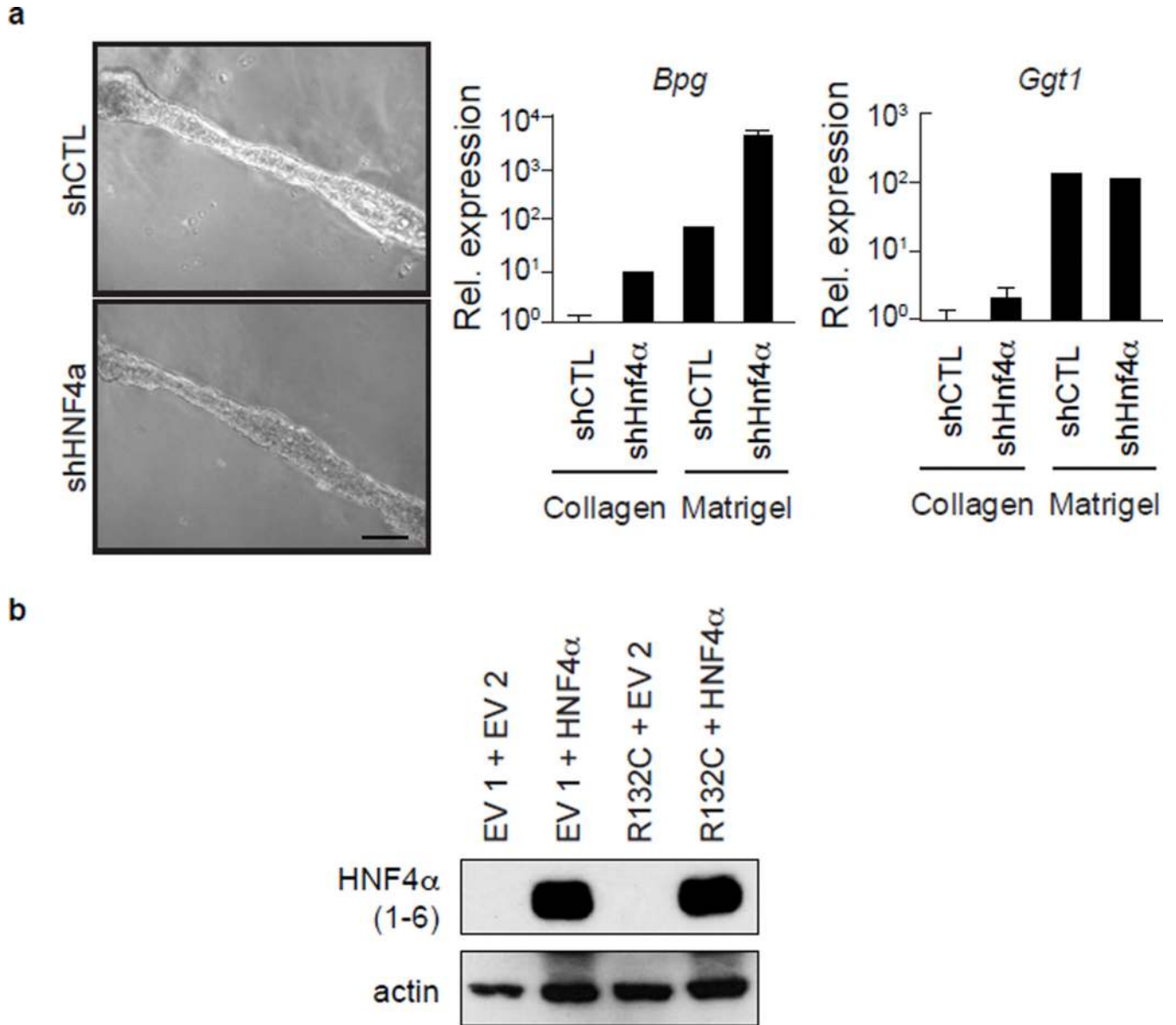
Scale bars, 100 μ m. Error bars indicate \pm s.d. between technical duplicates. * Student's t-test $P < 0.05$. Data are representative of at least 2 independent experiments.



Extended Data Figure 2. Mutant IDH represses the HNF4 α -mediated hepatocyte differentiation program

a–c. Gene expression profiling of HB cells expressing the indicated alleles and grown on collagen. **(a)** Clustering analysis, **(b)** enrichment plot (GSEA) showing downregulation of HNF4 α targets in the IDH mutant cells relative to controls, **(c)** GSEA plots using the collection of *cis* regulatory elements from the Molecular Signatures Database (C3 collection) reveals strong downregulation of genes containing consensus HNF4 α and HNF1 α binding sites in the IDH mutant HB cultures.

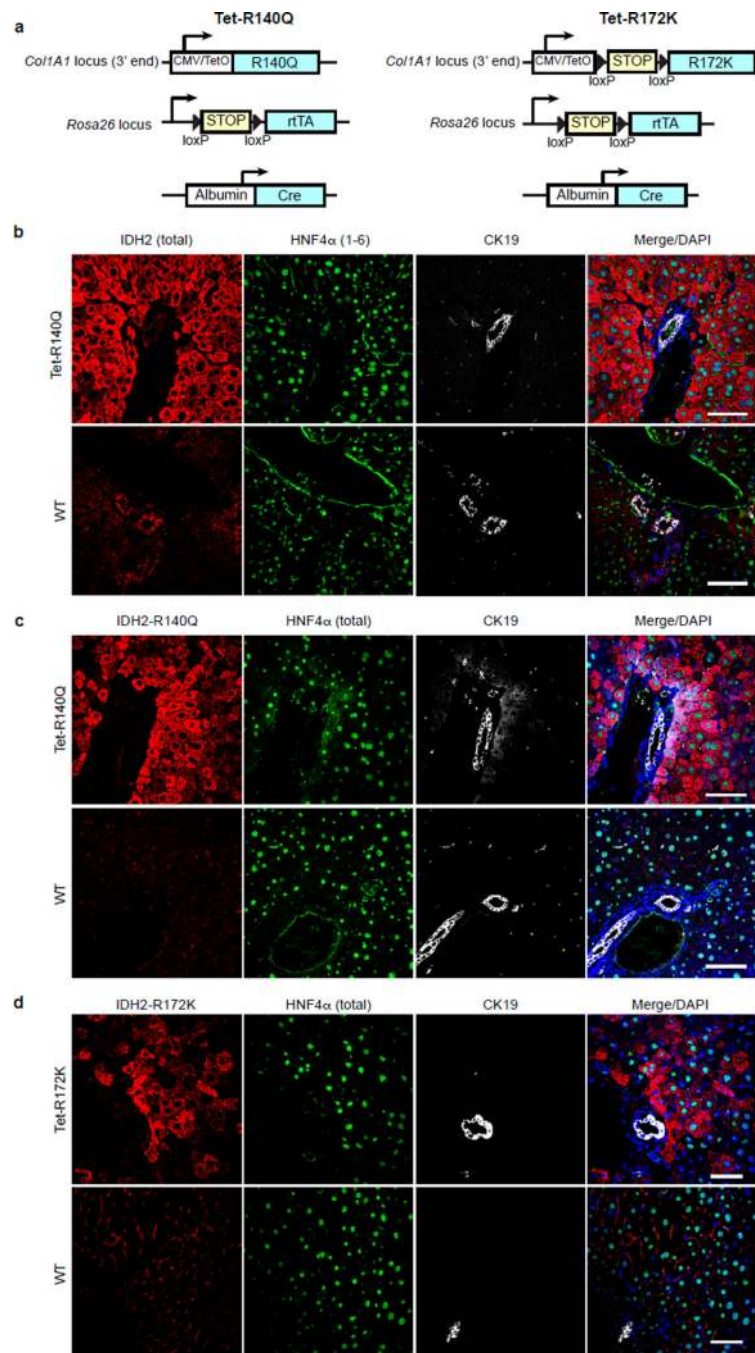
- d.** qRT-PCR showing expression of *Hnf4a* and its target genes in HB cells expressing either EV or IDH2 R172K and grown on collagen-coated plates.
- e.** HNF4 α (7–9) expression (immunoblot) in HB cells grown on collagen-coated plates (quantification of HNF4 α :actin is indicated). Data are representative of 2 independent experiments.
- f, g.** Immunofluorescence (IF) staining for HNF4 α (using an antibody that detects all isoforms) in HB cells expressing EV or IDH1 R132C and grown on collagen (**f**). The chart shows quantification of the ratio of the HNF4 α and DAPI signals. The specificity of the antibody was demonstrated by the diminished staining in cells with knockdown of endogenous HNF4 α (**g**).
- h.** Immunoblot showing that R132C suppresses HNF4 α (1–6) and HNF4 α (7–9) isoforms on uncoated plates.
- i, j.** AGI-5027 restores *Hnf4a*(1–6) induction in R132C-expressing HBs as shown by qRT-PCR (**i**) and immunoblot (**j**). DMSO=vehicle.
- k.** WT HBs were treated with 500 μ m octyl-(R) or -(S) enantiomers of 2HG, DMSO vehicle, or media alone. *Hnf4a*1–6 levels were determined by qRT-PCR.
- l, m.** Cultures of HB cells expressing the indicated alleles were grown on collagen or transferred to uncoated plates for 5 days and subjected to chromatin immunoprecipitation (ChIP) for H3K4me3 (**l**) or H3K27me3 (**m**). Enrichment for the promoter regions of *Hhex* (highly expressed gene in HB cells), *Hoxa10* (transcriptionally silent in HB cells) and P1 *Hnf4a* was measured by qPCR.
- n, o.** Analysis of WT HBs expressing shRNA control (shCTL) or targeting different HNF4a sequences (shHnf4a#1, shHnf4a#2): (**n**) hepatocyte marker expression (qRT-PCR) (**o**) HNF4a immunoblot.
- Error bars indicate \pm s.e.m for (**f**) and \pm s.d. for (**d, i, k-n**) between technical duplicates. Scale bars indicate 50 μ m. Student's t-test * P<0.05.



Extended Data Figure 3. HNF4 α is dispensable for biliary differentiation

a. WT HB cells expressing shRNA control (shCTL) or targeting HNF4 α were tested for ability to undergo biliary differentiation upon transfer to matrigel as assessed by tubule formation 24h after transfer (*left*) and qRT-PCR for induction of the biliary markers *Bpg* and *Ggt1* 10 days after transfer to matrigel (*right*).

b. Immunoblot showing ectopic expression of HNF4 α .1 in HB cells. Error bars indicate \pm s.d. between technical replicates. Scale bar indicates 100 μ m.



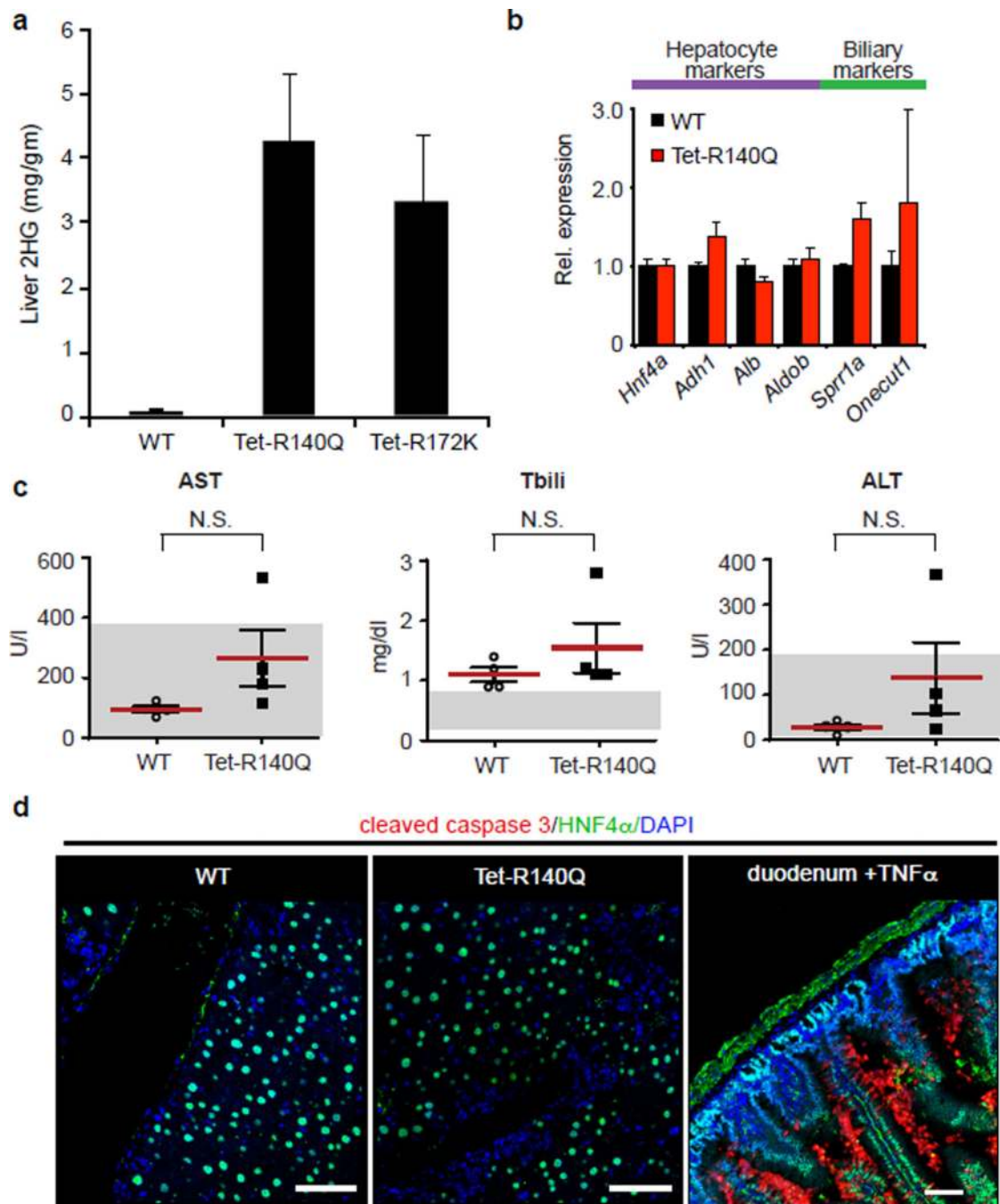
Extended Data Figure 4. Analysis of GEM model with hepatocyte-specific mutant IDH expression

a. Schematic of Dox-inducible IDH2 mutant alleles (See Methods for details). Mice harboring mutant human IDH2 alleles were crossed with *Alb-Cre* and *LSL-rtTA* strains for liver-specific expression.

b–d. Characterization of expression pattern of mutant IDH2 in *Tet-IDH2 R140Q* and *Tet-R172K* GEM models compared to control WT mice, after 4 weeks of doxycycline supplementation reveals hepatocyte-specific expression, consistent with previous models

using this transgenic targeting system⁴⁰. **(b)** IF analysis of *Tet-IDH2 R140Q* and control WT livers using an antibody that detects both endogenous and transgenic IDH2 expression. Note that transgenic IDH2 R140Q is expressed in the hepatocytes which stain for HNF4 α (1–6), but not in the bile ducts which are marked by CK19. **(c)** IF analysis of *Tet-IDH2 R140Q* and control WT livers using an antibody that is specific to IDH2 R140Q, showing an identical pattern of transgene expression.

(d) IF analysis of *Tet-IDH2 R172K* and control WT livers using an antibody that is specific to IDH2 R172K. This allele is also expressed in the hepatocytes, but shows more focal expression compared to R140Q. In **(b)** and **(c)** an antibody to total HNF4 α was used to label hepatocytes. Scale bars = 50 μ m.

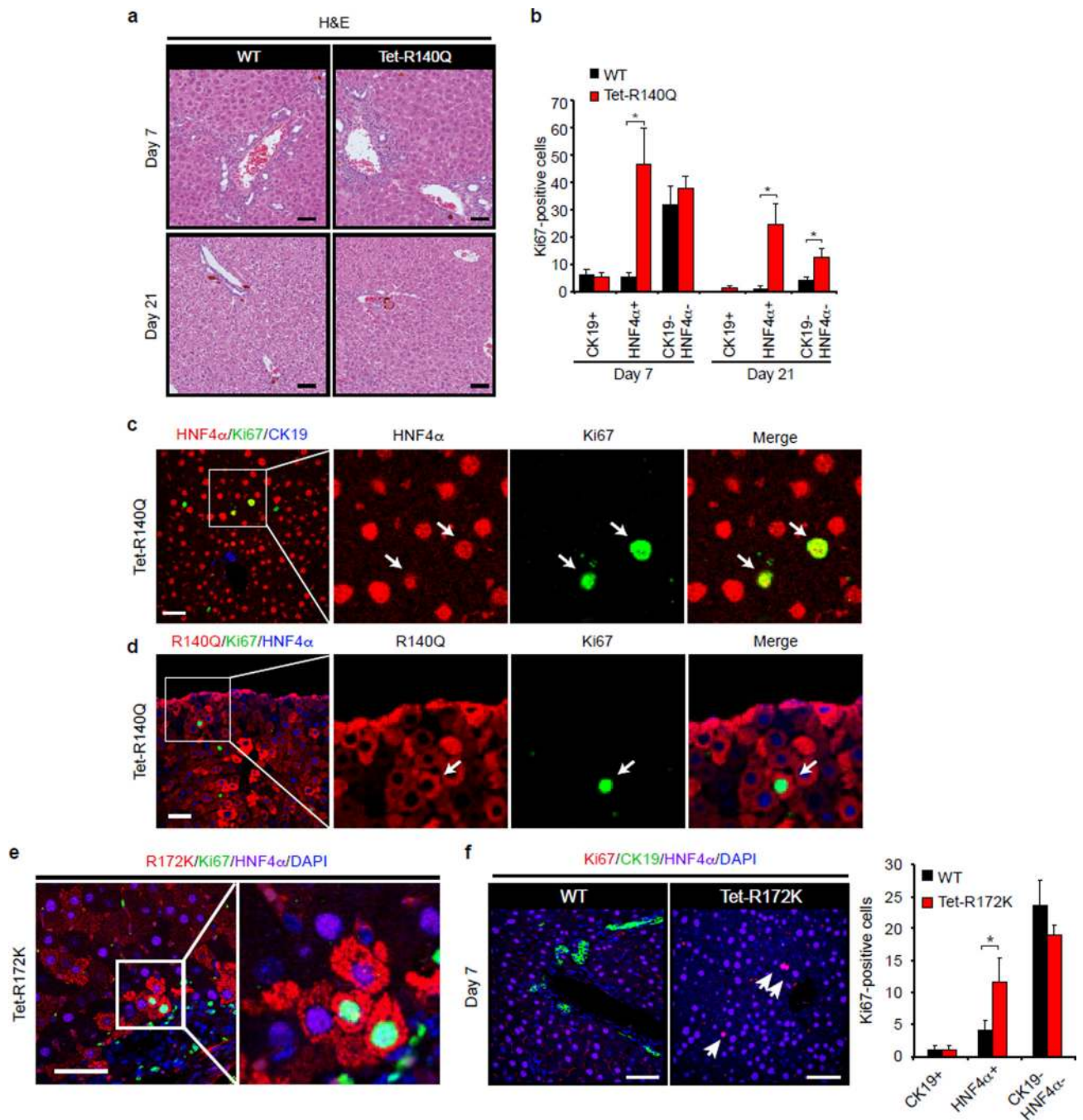


Extended Data Figure 5. Characterization GEM model with hepatocyte-specific mutant IDH expression in the presence or absence of liver injury

a. Measurement of 2HG levels in liver lysates from IDH2 mutant and control mice treated with Dox for 1 month.

b. Uninjured WT and IDH2 R140Q livers exhibit comparable expression of the hepatocyte markers, *Hnf4a*, *Adh1*, *Alb*, and *Aldob* and biliary markers *Sprr1a* and *Onecut1* by qRT-PCR. **c-d.** *Tet-R140Q* mice and littermate controls (*WT*) receiving Dox were fed a DDC-containing diet for 5 days before being switched to normal chow for 1 week (See main text,

Fig. 3a for schematic). Mutant IDH2 does not provoke liver injury as reflected by (c) comparable levels of serum AST, Tbili and ALT, and (d) absence of cleaved caspase 3 staining in *Tet-R140Q* compared to WT mice. Duodenum from a $TNF\alpha$ -treated mouse was used as a positive control for cleaved caspase-3 staining. Scale bars = 50 μ m.



Extended Data Figure 6. Characterization of response to liver injury in GEM model with hepatocyte-specific mutant IDH expression

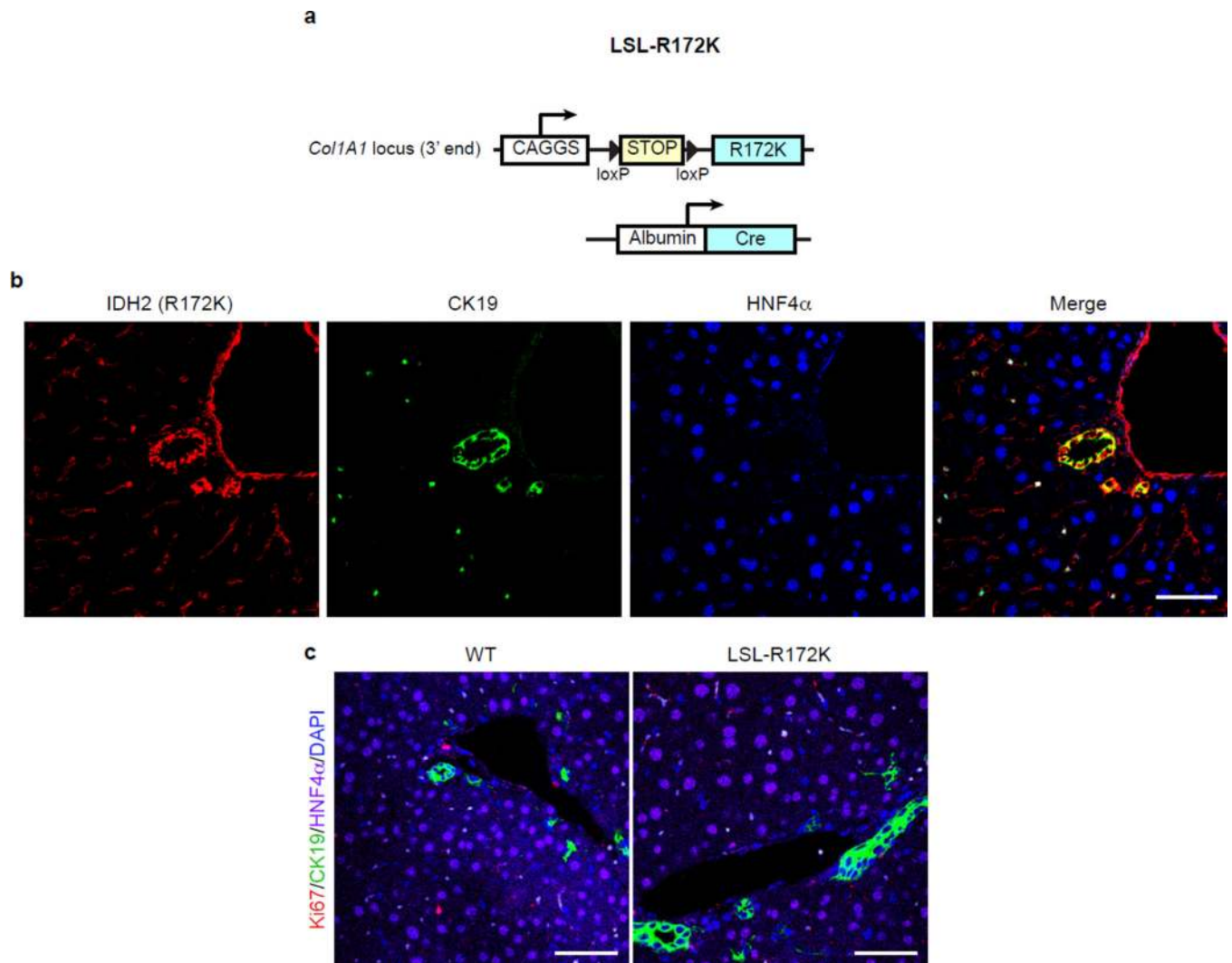
Tet-R140Q or *Tet-R172K* mice and littermate controls (*WT*) receiving Dox were fed a DDC-containing diet for 5 days before being switched to normal chow for 7 or 21 days (See main text, Fig. 3a for schematic).

a. Representative H&E images of livers from *WT* and *Tet-R140Q* mice analyzed at day 7 and 21.

b. Quantification of Ki67-positive cells for indicated markers as shown in main text, Fig. 3e ($N = 3$ mice per group, from at least 5 high-powered field per mouse scored). Error bars, \pm s.e.m. Data from Fig. 3f (day 21) is reproduced here for comparison.

c, d. IF analysis of IDH2 mutant livers showing that Ki-67 co-localizes with HNF4 α (**c**) and R140Q-expressing cells (**d**). As shown in main text, Fig. 3e, these cells express lower levels of HNF4 α compared to *WT* hepatocytes.

e, f. *Tet-R172K* mice and littermate controls (*WT*) receiving Dox were fed a DDC-containing diet for 5 days before being switched to normal chow for 1 week. IF analysis of IDH2 mutant livers shows that Ki-67 co-localizes with HNF4 α and R172K-expressing cells (**e**) and greater numbers of Ki-67⁺,HNF4 α ⁺ cells in *Tet-R172K* compared to *WT* mice (**f**). Error bars indicate \pm s.e.m. between 3 mice; Scale bars, 50 μ m. Student's t-test * $P < 0.05$.

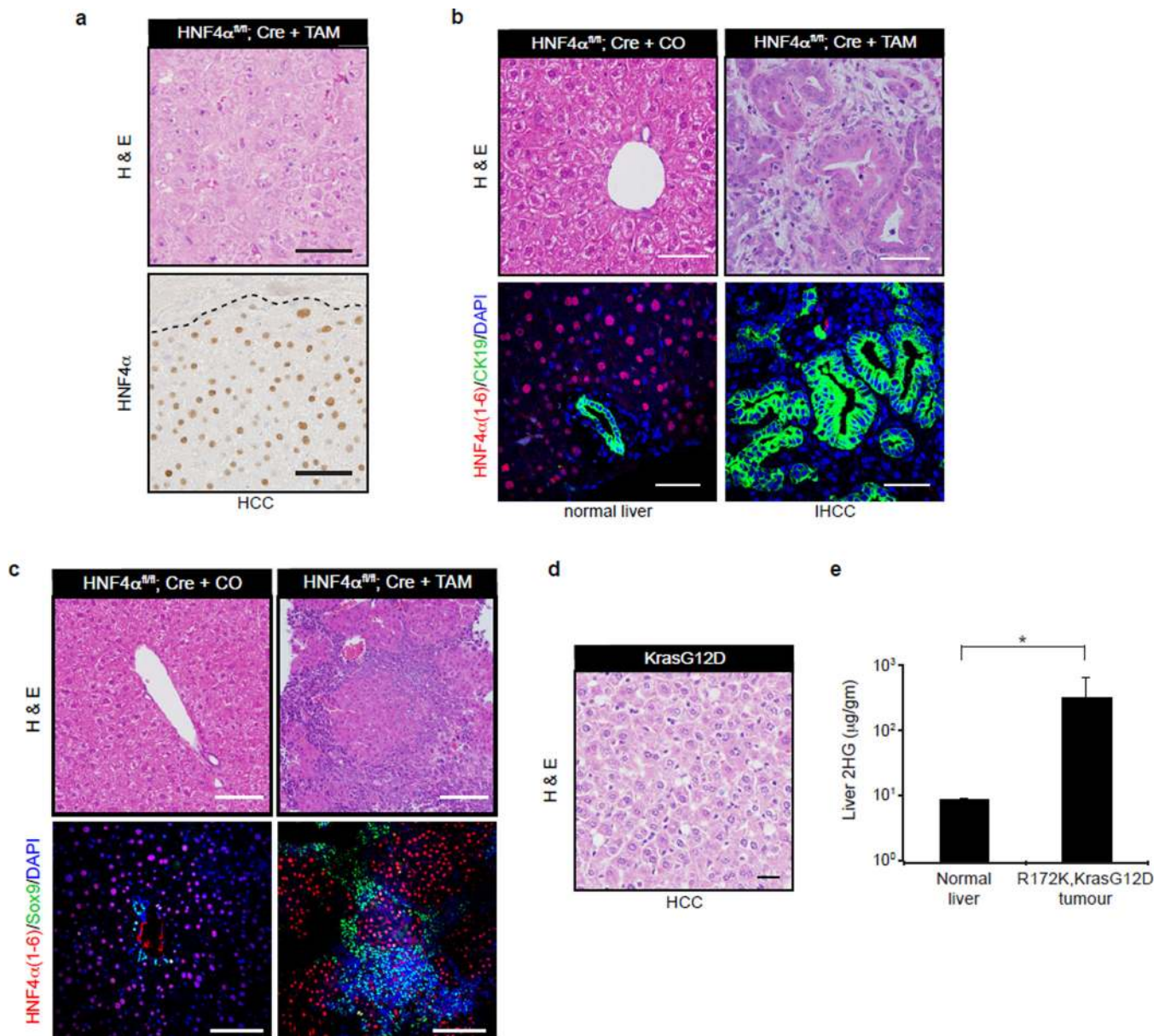


Extended Data Figure 7. Characterization of *LSL-IDH2 R172K* GEMM

a. Schematic of *LSL-IDH2 R172K* GEMM (See Methods for details). Mice harboring the *LSL-IDH2 R172K* allele were crossed with the *Alb-Cre* strain to target expression to the liver.

b. IF analysis revealed specific expression of IDH2 R172K in CK19⁺ biliary cells, whereas hepatocytes were negative.

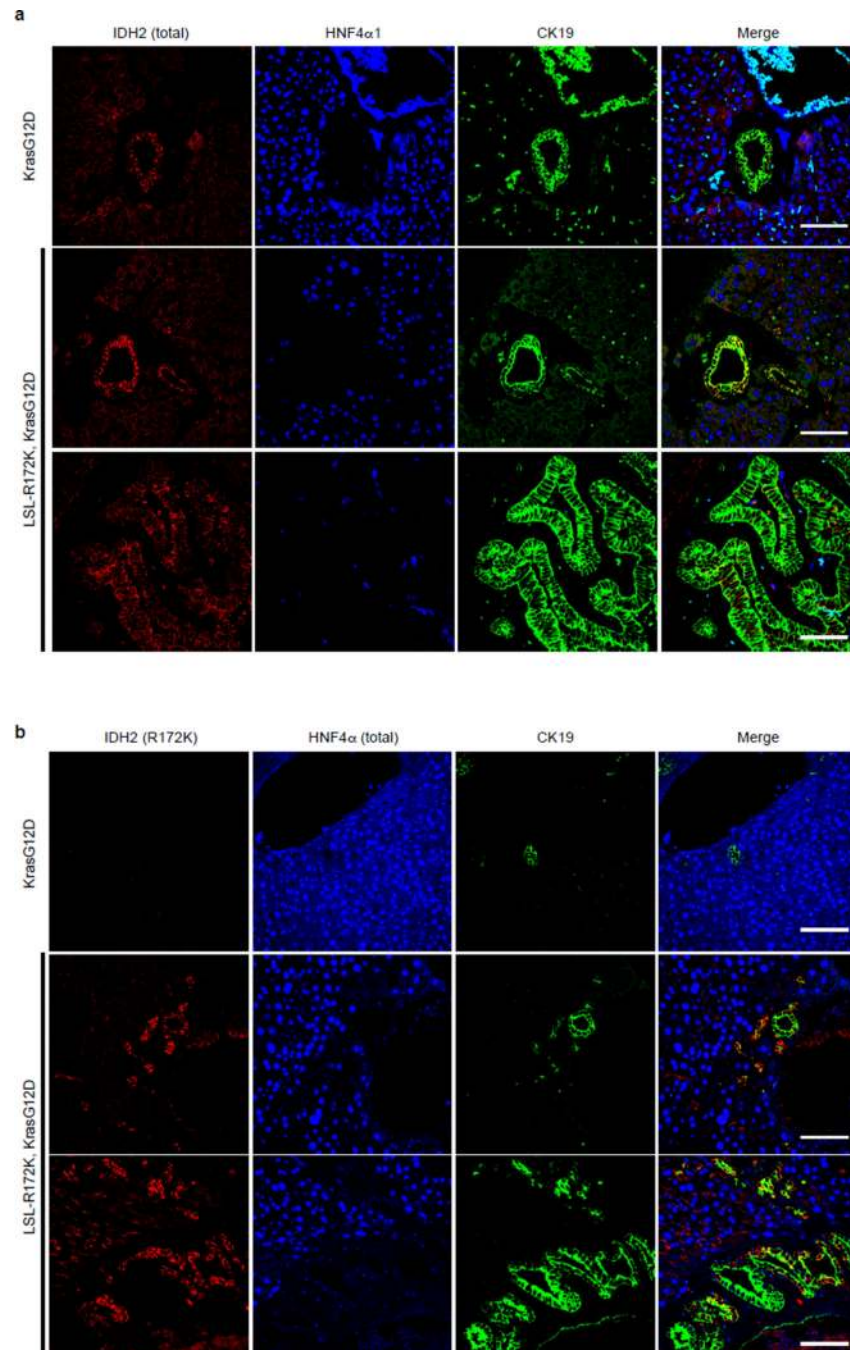
c. IF analysis showing comparable low levels of proliferation (Ki-67) in *LSL-R172K* and littermate control livers at 3 months of age. Scale bars = 50 μ m.



Extended Data Figure 8. Impact HNF4 α ablation on IHCC pathogenesis *in vivo*

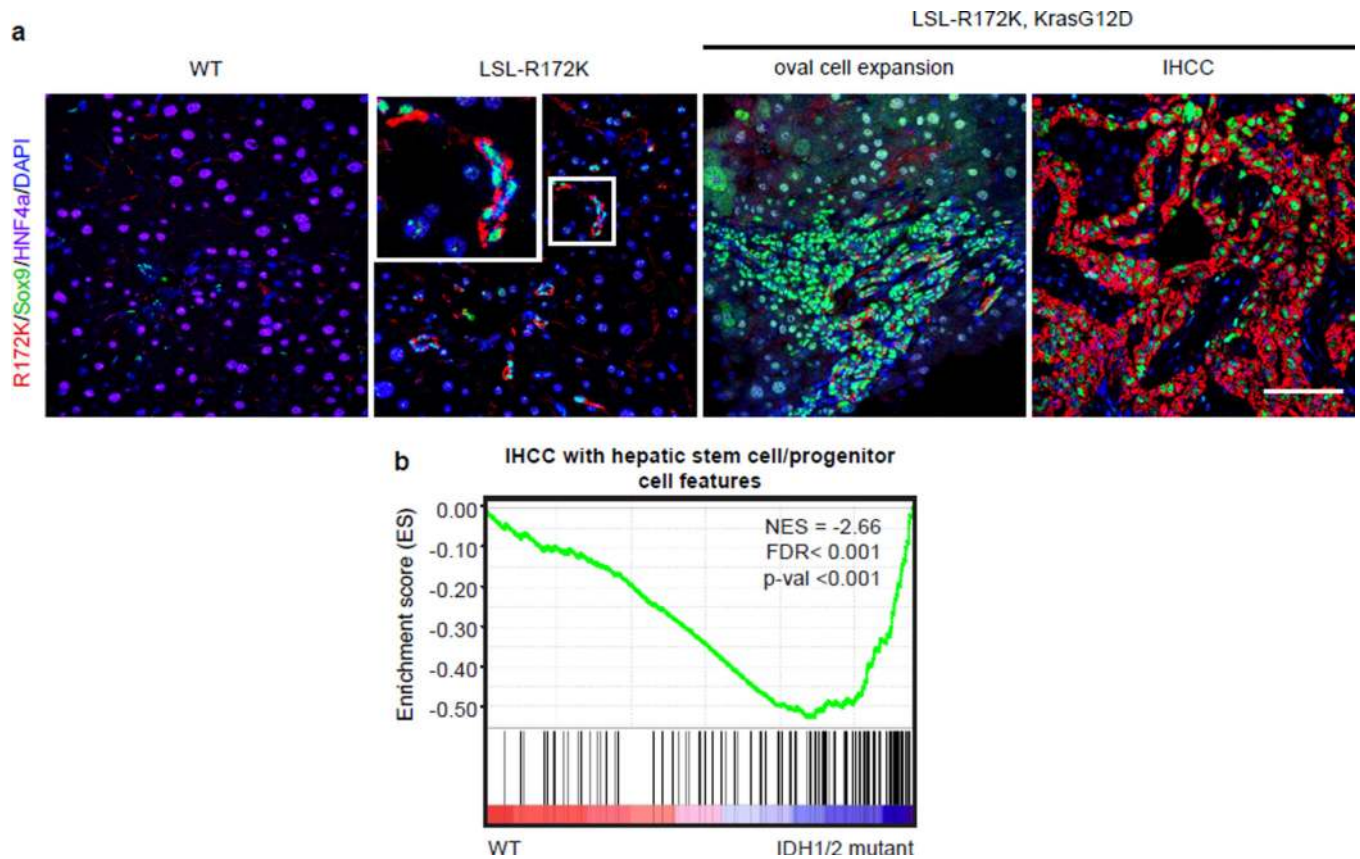
a–c. *Albumin-CreERT2; Hnf4a^{fl/fl}* (HNF4 $\alpha^{fl/fl}$, Cre) mice were treated with diethylnitrosamine (DEN), on post-natal day 15, and subsequently administered Tamoxifen (TAM) or corn oil (CO) control at 8 months of age as described²⁰. DEN is activated to its carcinogenic form by cytochrome P450 (CYP) enzymes, including CYP2E1, specifically in hepatocytes^{38,39}. Livers were harvested two months later and analyzed by H&E, IF and IHC. In *Hnf4a^{fl/fl}, Cre + TAM* livers, HCC arises from HNF4 α^+ cells that have escaped HNF4 α ablation (**a**), while CK19+ IHCC stains negative for HNF4 α (**b**, right panel). Normal liver from control corn oil-treated livers is shown in (**b**, left panel). **c.** Representative IHC (top) and IF images (bottom) show marked expansion of Sox9⁺ oval cells in TAM-injected mice. Surrounding these oval cells are HNF4 α^+ hepatocytes which escaped *Hnf4a* ablation in TAM-injected mice.

d. H&E stain confirming that the liver tumour arising in a *Kras*^{G12D} mouse is an HCC.
e. Measurement of 2HG in liver tumours from *Alb-Cre; LSL-R172K; Kras*^{G12D} mice compared to normal liver from control mice (N=2). Scale bars, 50 μ m. Error bars, \pm s.d. * Student's t-test $P < 0.05$.



Extended Data Figure 9. Expression of mutant IDH2 in the LSL *R172K* GEM model
a, b. IF analysis to characterize expression of IDH2 in the liver of *LSL-R172K; Kras*^{G12D} compound mice. **(a)** Staining with an antibody that recognizes both endogenous

WT and mutant IDH2 shows that endogenous IDH2 is expressed in bile duct in the non-diseased liver from *Kras*^{G12D} mice (*top panels*). In *LSL-R172K; Kras*^{G12D} mice, total IDH2 staining is at near endogenous levels in the normal bile ducts (*middle panels*) and in the BilIN lesions (*bottom panels*). **(b)** IF using an antibody specific to IDH2-R172K showing specific expression of the R172K transgene in CK19⁺ bile ducts (*middle row*) and BilINs (*bottom row*) in *LSL-R172K, Kras*^{G12D} animals. Scale bars = 50 μ m.



Extended Data Figure 10. Stem cell features in IDH mutant murine and human IHCC pathogenesis

a. IDH2 R172K expression using mutant-specific antibodies in livers from *LSL-R172K* and *Kras*^{G12D}, *R172K* compound mice showing specific expression of the R172K transgene in Sox9⁺ oval cells and IHCC. Scale bars = 50 μ m.

b. Normalized enrichment plot of a cohort of 127 human IHCC samples genotyped for IDH status, showing that the subset of tumors with IDH1/IDH2 mutations exhibits enrichment of a gene signature⁴⁰ that identifies IHCCs with hepatic stem cell/progenitor features.

Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

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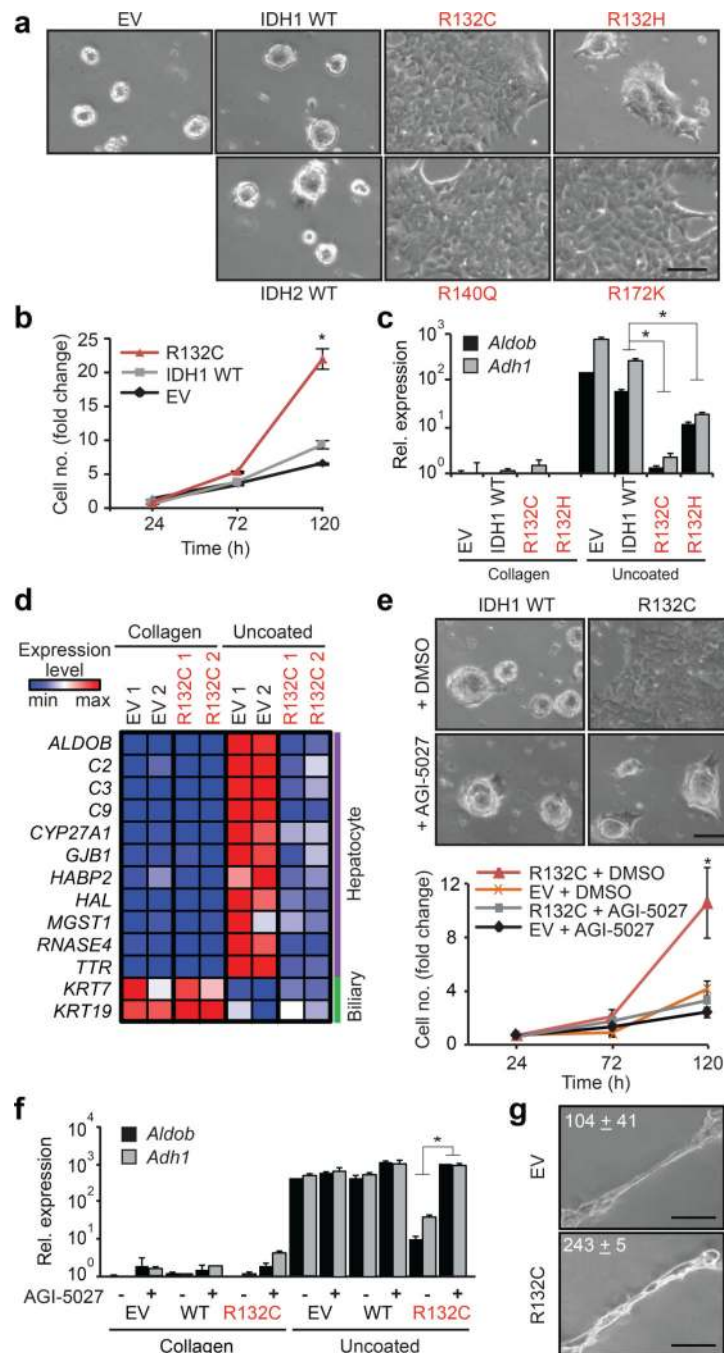


Figure 1. IDH mutant alleles block hepatocyte differentiation

a–d. Hepatoblasts (HBs) expressing empty vector (EV) or the indicated IDH alleles at physiologic levels (see Extended Data Fig. 1a), were transferred to uncoated plates to induce hepatocyte differentiation. **a**, Hepatocyte sphere formation. **b**, proliferation, **c**, hepatocyte marker expression (qRT-PCR). **d**, Heat map of hepatocyte and biliary gene expression. **e,f.** HB cells treated with 2.5 μ M AGI-5027 or DMSO vehicle. **e**, hepatocyte sphere formation (upper panel), proliferation (lower panel). **f**, hepatocyte marker expression.

g. HB cells in matrigel assessed for biliary differentiation. Tubular structures/6 cm dish \pm std. are quantified. *P<0.05. Scale bars, 100 μ m.

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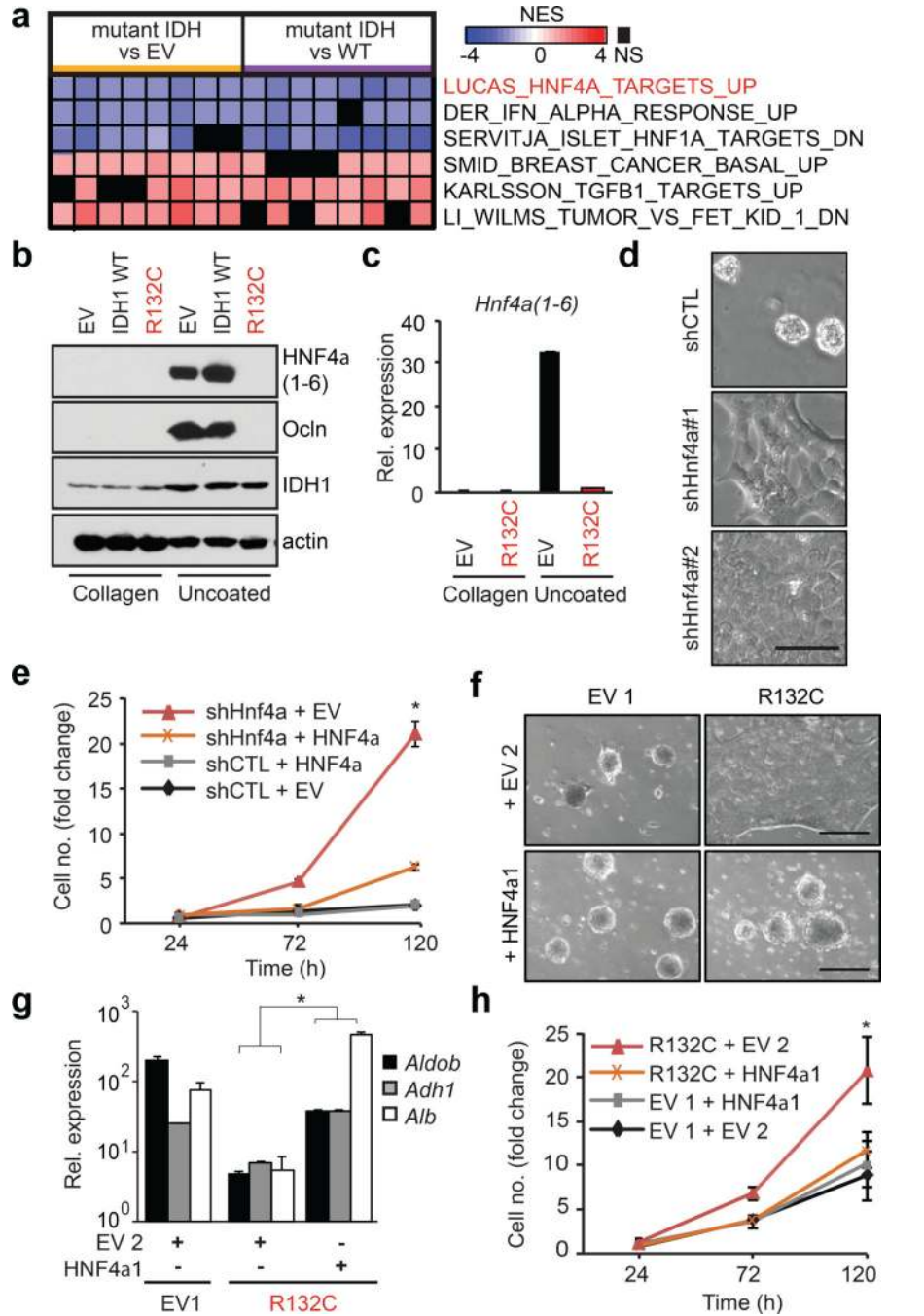


Figure 2. Mutant IDH blocks hepatocyte differentiation by silencing HNF4a

a. Heat map of GSEA showing top-ranked gene-sets distinguishing IDH1-R132C or IDH2-R172K from WT or EV control HBs (pairwise analysis; replicates for each condition; see Methods). NES = Normalized enrichment score.

b,c. HB cells analyzed by (b) immunoblot, and (c) qRT-PCR.

d,e. Analysis of WT HBs expressing the indicated shRNAs (uncoated plates). **d**, Hepatocyte sphere formation. **e**, Proliferation of shRNA-expressing HB cells co-expressing EV or shRNA-resistant *Hnf4a1* cDNA.

f–h. Control and R132C–expressing HBs co-expressing vector control (EV2) or HNF4 α , grown on uncoated plates. **f**, hepatocyte sphere formation, **g**, hepatocyte gene expression, **h**, proliferation. *P<0.05, Scale bar, 100 μ m (**d**), 250 μ m (**f**).

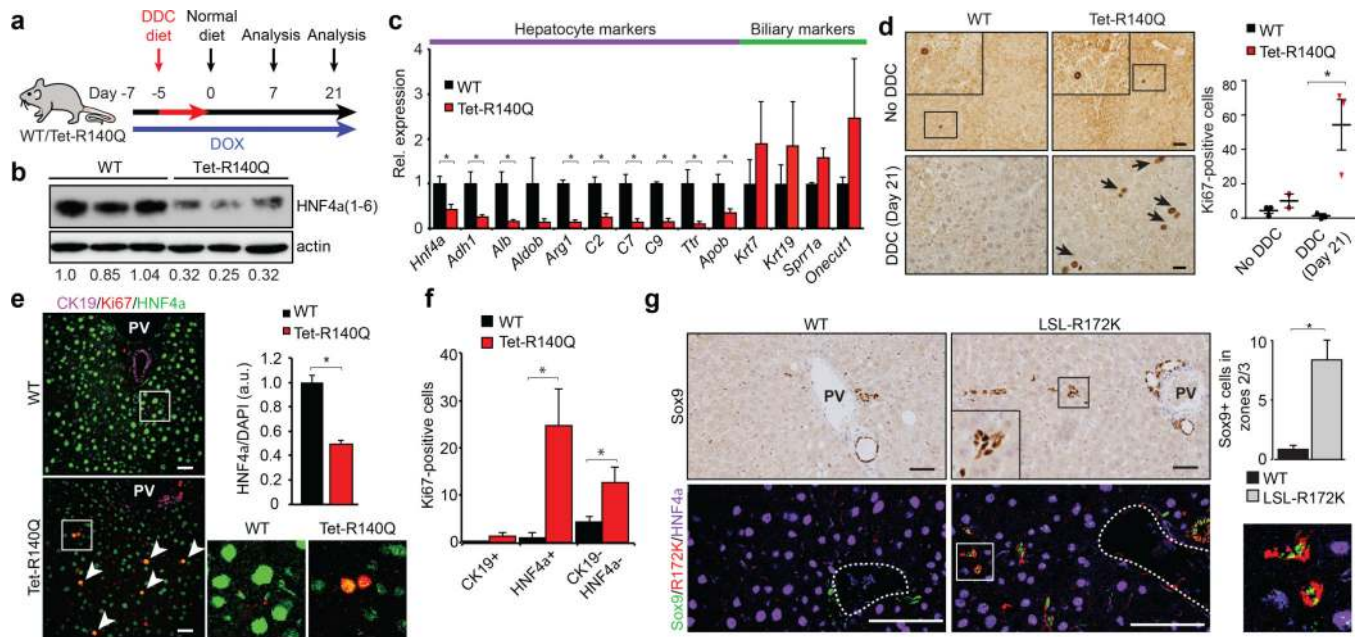


Figure 3. Mutant IDH inhibits hepatocyte differentiation and quiescence of liver progenitors
a. Schematic of DDC study in *Tet-R140Q* (*Tet-R140Q*, *Alb-Cre*, *Rosa26-LSL-rtTA*) and WT littermate controls (*Alb-Cre*, *Rosa26-LSL-rtTA*).
b–f. Livers at day 21. **b.** Immunoblot (HNF4a(1–6):actin is quantified). **c.** qRT-PCR. **d.** Ki-67 staining. Chart: Ki-67⁺ cells/20 high-powered fields. **e,f.** IF analysis. Graph: mean fluorescence intensity of HNF4a:DAPI (125 cells/group were scored). Inset: high power views of boxed regions. **f.** Quantification of Ki-67⁺ cells co-staining for the indicated markers (*N* = 3 mice/group, 5 high-powered fields/mouse).
g. IHC (top) and IF (bottom) of WT and *LSL-R172K* livers at 20 months. Note accumulation Sox9⁺ cells located >25μm away from bile duct or portal structures (dashed-line), which express IDH2-R172K and lack HNF4a. Inset: higher magnification. Chart: quantification. *N* = 3 mice/group; 4 high-powered images/mouse were scored. PV=Portal vein.
 Error bars, \pm s.d. (c) and \pm s.e.m. (d, f, g); Scale bars, 20 μm (d) and 50 μm (e, g).

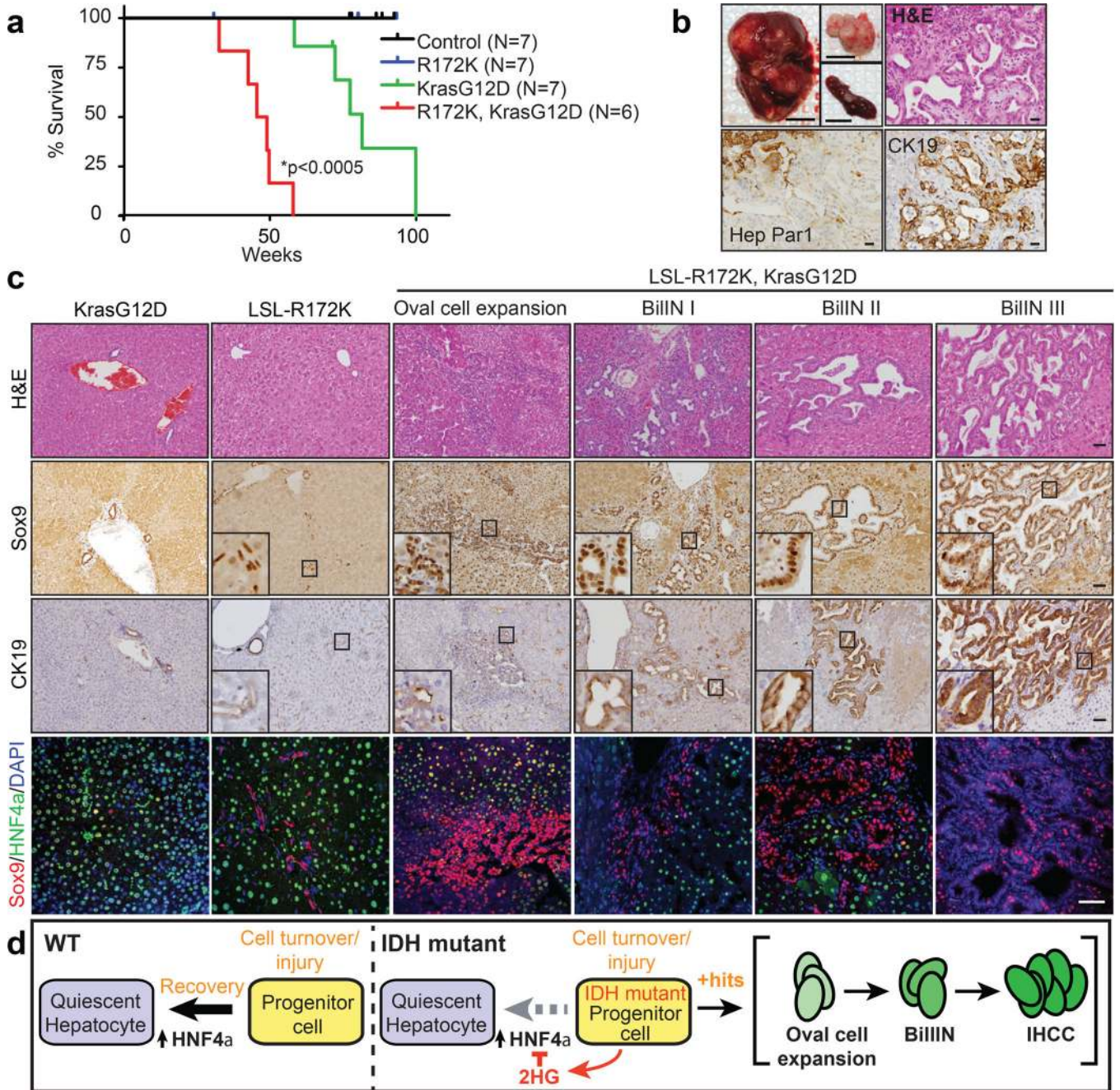


Figure 4. Mutant IDH cooperates with Kras^{G12D} to drive liver progenitor cell expansion and multi-step IHCC pathogenesis

a. Kaplan-Meier analysis showing time until signs of illness necessitated euthanasia. All animals euthanized had liver tumours.

b. *Upper left:* Representative *Alb-Cre;LSL-R172K;Kras^{G12D}* tumor, and peritoneal and spleen metastases (*insets*). *Upper right:* H&E staining showing IHCC histology. *Lower panels:* The tumour is Hep Par1- and CK19⁺ while adjacent hepatocytes stain Hep Par1⁺ and CK19⁻.

c. The livers of *Alb-Cre;LSL-R172K;Kras^{G12D}* animals exhibit oval cell expansion and increasing grades of BilIN, which stain Sox9⁺. CK19 levels increase with higher grade lesions. IF analysis reveals focal accumulation Sox9⁺ oval cells in *Alb-Cre;LSL-R172K* livers and pronounced oval cell expansion in *Alb-Cre;LSL-R172K; Kras^{G12D}* livers.

d. Model for mutant IDH in cholangiocarcinoma pathogenesis. Scale bars, 1cm (**b**, upper left), 50µm (**b-c**).