

Supporting Information

Clinicopathological indices to predict hepatocellular carcinoma molecular classification

Poh Seng Tan, Shigeki Nakagawa, Nicolas Goossens, Anu Venkatesh, Tiangui Huang, Stephen C. Ward, Xiaochen Sun, Won-Min Song, Anna Koh, Claudia Canasto-Chibuque, Manjeet Deshmukh, Venugopalan Nair, Milind Mahajan, Bin Zhang, Maria Isabel Fiel, Masahiro Kobayashi, Hiromitsu Kumada, Yujin Hoshida

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Figure S10. Required sample size in clinical trial and NNT in HCC molecular subclass-targeting therapy.

Table S1

The 30-gene HCC molecular classification signature.

Subclass	GeneID	Symbol	Description
S1	8826	IQGAP1	IQ motif containing GTPase activating protein 1
S1	6282	S100A11	S100 calcium binding protein A11 (calgizzarin)
S1	11031	RAB31	RAB31, member RAS oncogene family
S1	951	CD37	CD37 molecule
S1	10631	POSTN	periostin, osteoblast specific factor
S1	397	ARHGDIB	Rho GDP dissociation inhibitor (GDI) beta
S1	241	ALOX5AP	arachidonate 5-lipoxygenase-activating protein
S1	7805	LAPTM5	lysosomal associated multispanning membrane protein 5
S1	1462	CSPG2	chondroitin sulfate proteoglycan 2 (versican)
S1	10109	ARPC2	actin related protein 2/3 complex, subunit 2, 34kDa
S2	1280	COL2A1	collagen, type II, alpha 1 (primary osteoarthritis, spondyloepiphyseal dysplasia, congenital)
S2	2719	GPC3	glypican 3
S2	174	AFP	alpha-fetoprotein
S2	191	AHCY	S-adenosylhomocysteine hydrolase
S2	6894	TARBP1	Tar (HIV-1) RNA binding protein 1
S2	1820	ARID3A	AT rich interactive domain 3A (BRIGHT- like)
S2	2261	FGFR3	fibroblast growth factor receptor 3 (achondroplasia, thanatophoric dwarfism)
S2	6599	SMARCC1	SWI/SNF related, matrix associated, actin dependent regulator of chromatin, subfamily c, member 1
S2	6193	RPS5	ribosomal protein S5
S2	1974	EIF4A2	eukaryotic translation initiation factor 4A, isoform 2
S3	10249	GLYAT	glycine-N-acetyltransferase
S3	462	SERPINC1	serpin peptidase inhibitor, clade C (antithrombin), member 1
S3	346	APOC4	apolipoprotein C-IV
S3	4522	MTHFD1	methylenetetrahydrofolate dehydrogenase (NADP+ dependent) 1, methenyltetrahydrofolate cyclohydrolase, formyltetrahydrofolate synthetase
S3	2875	GPT	glutamic-pyruvate transaminase (alanine aminotransferase)
S3	3242	HPD	4-hydroxyphenylpyruvate dioxygenase
S3	710	SERPING1	serpin peptidase inhibitor, clade G (C1 inhibitor), member 1, (angioedema, hereditary)
S3	1798	DPAGT1	dolichyl-phosphate (UDP-N-acetylglucosamine) N-acetylglucosaminophosphotransferase 1 (GlcNAc-1-P transferase)
S3	5105	PCK1	phosphoenolpyruvate carboxykinase 1 (soluble)
S3	3081	HGD	homogentisate 1,2-dioxygenase (homogentisate oxidase)

Table S2

Summary of clinical demographics in 9 HCC datasets used for evaluation of HCC subclass predictive performance of the 30-gene signature compared to the 619-gene signature.

	HCC-A	HCC-B	HCC-C	HCC-D	HCC-E	HCC-F	HCC-G	HCC-H	HCC-I
No. of samples	90	82	60	43	33	31	57	89	118
Sex (male %)	79%	na	73%	na	97%	68%	82%	58%	81%
Age	53 (12)	na	63	na	51 (10)	64 (8)	62 (14)	65 (9)	58 (9)
Etiology									
HBV	59%	83%	18%	14%	97%	32%	30%	-	23%
HCV	9%	5%	67%	26%	-	68%	19%	100%	69%
HBV+HCV	3%	-	-	-	-	-	-	-	1%
Alcohol	6%	-	-	12%	-	-	32%	-	3%
Others	4%	11%	15%	2%	3%	-	5%	-	-
Cirrhosis	50%	na	60	na	82%	na	63%	na	70%
Tumor stage	na	na	I / II / IIIA [*] 22/28/10	na	na	na	na	0/A/B/C [†] 9/57/5/8	I / II / III / IV [*] 35/55/12/4
Histology	G2/3/4 [‡] 8/31/1	na	G1/2/3 [‡] 4/45/10	G1/2/3/4 [‡] 10/22/10/1	M/M+P/P [†] 11/19/2	W/M/P [§] 10/13/8	G1/2/3/4 [‡] 7/51/35/7	W/M/P [§] 20/41/17	W/M/P [§] 24/65/16
Tumor size (cm)	na	na	4.0	na	7.0 [3.0-5.9]	3.1 [2.2-4.3]	7.9 (5.1)	3.5 [2.5-5.6]	2.2 [1.8-3.0]
α-fetoprotein (ng/ml)	>300, 51%	na	na	na	113 [12,4051]	na	≥100, 33%	18 [7,182]	38 [10,171]
Data source	GSE1898	a)	b)	c)	GSE364	d)	E-TABM-36	GSE9843	GSE10186
Reference	Nat Genet 36;1306 (2004)	Mol Biol Cell 13;1929 (2002)	Lancet 361;923 (2003)	Cancer Res 64;6058 (2004)	Nat Med 9;416 (2003)	Cancer Res 64;7263 (2004)	Hepatology 45;42 (2007)	Cancer Res 68;6779 (2008)	Cancer Res 69;7385 (2009)

HCC: hepatocellular carcinoma, HBV: hepatitis B virus, HCV: hepatitis C virus, na: not available

^{*}: Liver Cancer Study Group of Japan, [†]: Barcelona Clinic Liver Cancer staging system,[‡]: Edmondson-Steiner grade, [§]: UICC tumor differentiation (Well / Moderate /Poor),

Mean (SD, if available), Median [25%, 75%]

a) http://smd.stanford.edu/cgi-bin/publication/viewPublication.pl?pub_no=107b) <http://surgery2.med.yamaguchi-u.ac.jp/research/DNAchip/hcc-recurrence/index.html>c) <http://www.medizin.uni-koeln.de/kliniken/pathologie/supplementaldata.html>d) <http://www2.genome.rcast.u-tokyo.ac.jp/HCC/>

Table S3

RT-qPCR primers.

Gene	Forward	Reverse
KRT19	CGACTACAGCCACTACTA	CAGACGGGCATTGTCGATC
EPCAM	ATAACCTGCTCTGAGCGAGTG	TGAAGTGCAGTCCGCAAAC
GLUL	AAGTGTGTGGAAGAGTTGCC	TGCTCACCATGTCCATTATC
PRL13A (housekeeping)	GTACGCTGTGAAGGCATCAA	GTTGGTGTTCATCCGCTTG

Table S4

Liver cancer-related gene signatures in literature.

Molecular signature	Type of correlate	Reference
Hoshida09_subclass	Molecular feature (classification)	Cancer Res 69;7385 (2009)
Boyault07_subclass	Molecular feature (classification)	Hepatology 45;42 (2007)
Lee04_subclass	Molecular feature (classification)	Hepatology 40;667 (2004)
Chiang08_subclass	Molecular feature (classification)	Cancer Res 68;6779 (2008)
Andersen10_KRT19	Molecular feature	Hepatology 51;1401 (2010)
Coulouarn08_TGFbeta	Molecular feature	Hepatology 47;2059 (2008)
KaposiNovak06_MET	Molecular feature	J Clin Invest 116;1582 (2006)
Villanueva11_KRT19	Molecular feature	Gastroenterology 140;1501 (2011)
Yamashita08_EpCAM	Molecular feature	Cancer Res 68;1451 (2008)
Andersen12_cholangio_subclass	Biological phenotype	Gastroenterology 142;1021 (2012)
Cairo08_hepatoblast_like	Biological phenotype	Cancer cell 14;471 (2008)
Lee06_progenitor_cell	Biological phenotype	Nat Med 12;410 (2006)
Oishi12_cholangio_stem_cell	Biological phenotype	Hepatology 56;1792 (2012)
Woo10_cholangio_like	Biological phenotype	Cancer Res 70;3034 (2010)
Yamashita09_cancer_stem_cell	Biological phenotype	Gastroenterology 136;1012 (2009)
Minguez11_vascular_invasion	Clinical phenotype	J Hepatol 55;1325 (2011)
Ye03_metastasis	Clinical phenotype	Nat Med 9;416 (2003)
Izuka03_early_recurrence	Clinical outcome	Lancet 361;923 (2003)
Kim12_survival	Clinical outcome	Hepatology 55;1443 (2012)
Kurokawa04_early_recurrence	Clinical outcome	J Hepatol 41;284 (2004)
Roessler10_metastasis	Clinical outcome	Cancer Res 70;10202 (2010)
Wang07_recurrence	Clinical outcome	Clin Cancer Res 13;6275 (2007)
Woo08_recurrence	Clinical outcome	Clin Cancer Res 14;2056 (2008)

Table S5

Concordance of histopathological determination between evaluators.

	Training set (96 HCC tumors)	Validation set (99 HCC tumors)
Architectural pattern		
Microtrabicular	73 (76%)	81 (82%)
Macrotrabicular	78 (81%)	79 (80%)
Compact	80 (83%)	77 (78%)
Pseudoglandular	74 (77%)	79 (80%)
Cytological variant		
SH-HCC	79 (82%)	86 (87%)
Clear cell	77 (80%)	91 (92%)
Fatty change	84 (88%)	92 (93%)
Edmondson-Steiner grade I/II	79 (82%)	79 (80%)
Osteoclastic cell	92 (96%)	96 (97%)
Immune cell infiltrate, score 0/1*	74 (77%)	72 (73%)

*Immune cell infiltrate score determined as 0: 0 to 5 cells, 1: 5 to 20 cells, 2: greater than 20 cells.

HCC: hepatocellular carcinoma, SH-HCC: steatohepatitic HCC

Table S6

HCC molecular subclasses and tumor characteristics of SH-HCC and non-SH-HCC variants.

	Training and validation sets			Training set			Validation set		
	SH-HCC (36 tumors)	Non-SH-HCC (159 tumors)	P value	SH-HCC (19 tumors)	Non-SH-HCC (77 tumors)	P value	SH-HCC (17 tumors)	Non-SH-HCC (82 tumors)	P value
Molecular subclass, n (%)			<0.001			0.01			0.008
S1	21 (58%)	39 (25%)		11 (58%)	19 (25%)		10 (59%)	20 (24%)	
S2/S3	15 (42%)	120 (75%)		8 (42%)	58 (75%)		7 (41%)	62 (76%)	
AFP (ng/mL), median (IQR)	20 (6-92)	24 (6-142)	0.63	8 (5-62)	16 (4-75)	0.92	26 (9-118)	43 (10-197)	0.63
> 400 ng/mL	3 (8.3%)	20 (12.6%)	0.58	1 (5%)	7 (9%)	1.00	2 (12%)	13 (16%)	1.00
Tumor size (cm), median (IQR)	2.0 (1.8-3.0)	2.3 (2.0-3.0)	0.46	2.3 (2.0-3.1)	2.4 (2.0-2.9)	0.96	1.9 (1.7-2.9)	2.3 (1.8-3.0)	0.30
Tumor number, n (%)									
Single	32 (89%)	123 (77%)	0.92	18 (95%)	64 (83%)	0.56	14 (82%)	59 (72%)	0.84
Multiple	4 (11%)	24 (15%)		1 (5%)	13 (17%)		3 (18%)	11 (13%)	
Edmondson-Steiner grade, n (%)									
I	4 (11%)	29 (18%)	0.17	1 (5%)	11 (14%)	0.06	3 (18%)	18 (22%)	0.80
II	23 (64%)	105 (66%)		11 (58%)	55 (71%)		12 (71%)	50 (61%)	
III	8 (22%)	25 (16%)		6 (32%)	11 (14%)		2 (12%)	14 (17%)	
IV	1 (3%)	0 (0%)		1 (5%)	0 (0%)		0 (0%)	0 (0%)	
Steatosis in non-tumor liver*, n (%)									
Absent/minimal	11 (31%)	101 (64%)	0.001	6 (32%)	46 (60%)	0.01	5 (29%)	55 (67%)	0.02
Mild	16 (44%)	41 (26%)		8 (42%)	24 (31%)		8 (47%)	17 (21%)	
Moderate	6 (17%)	14 (9%)		3 (16%)	7 (9%)		3 (18%)	7 (9%)	
Severe	3 (8%)	3 (2%)		2 (11%)	0 (0%)		1 (6%)	3 (4%)	
Steatohepatitis in non-tumor liver, n (%)	14 (39%)	11 (7%)	<0.001	6 (32%)	5 (6%)	0.007	8 (47%)	6 (7%)	<0.001

HCC: hepatocellular carcinoma, SH-HCC: steatohepatitic HCC, AFP: alpha-fetoprotein.

*Absent/minimal <5%; Mild = 5%-33%; moderate = 34%-66%; severe > 66%.

Table S7

Gene sets associated with histopathological features in the validation set (Gene Set Enrichment Analysis).

	CHROMOSOME	1.95	0.000	0.008
	MICROTUBULE_CYTOSKELETON	1.94	0.000	0.008
	NUCLEAR_PART	1.87	0.000	0.016
	RUFFLE	1.85	0.005	0.017
	MICROTUBULE	1.85	0.007	0.017
	SPLICEOZONE	1.82	0.005	0.018
	INTRACELLULAR_NON_MEMBRANE_BOUND_ORGANELLE	1.78	0.000	0.024
	CONDENSED_CHROMOSOME	1.78	0.009	0.023
	NON_MEMBRANE_BOUND_ORGANELLE	1.77	0.000	0.023
	ER_GOLGI_INTERMEDIATE_COMPARTMENT	1.75	0.014	0.026
	CYTOSKELETAL_PART	1.74	0.000	0.025
	GOLGI_APPARATUS_PART	1.67	0.008	0.039
	PERINUCLEAR_REGION_OF_CYTOPLASM	1.67	0.010	0.037
Oncogenic pathway targets	CORDENONSILYAP_CONSERVED_SIGNATURE	1.92	0.000	0.009
	VEGF_A_UP_V1_DN	1.84	0.000	0.014
	RB_P107_DN_V1_UP	1.80	0.000	0.014
Chemical and genetic perturbations (Experimentally defined target gene signature in literature)	CAIRO_HEPATOBlastoma_CLASSES_UP	3.48	0.000	0.000
	CROONQUIST_NRAS_SIGNALING_DN	3.19	0.000	0.000
	CHIANG_LIVER_CANCER_SUBCLASS_PROLIFERATION_UP	3.18	0.000	0.000
	WINNEPENNINCKX_MELANOMA_METASTASIS_UP	3.13	0.000	0.000
	ROSTY_CERVICAL_CANCER_PROLIFERATION_CLUSTER	3.12	0.000	0.000
	PATIL_LIVER_CANCER	3.07	0.000	0.000
	CROONQUIST_IL6_DEPRIVATION_DN	3.06	0.000	0.000
	BENPORATH_PROLIFERATION	3.03	0.000	0.000
	SOTIRIOU_BREAST_CANCER_GRADE_1_VS_3_UP	3.03	0.000	0.000
	RODRIGUES_THYROID_CARCINOMA_PoorLY_DIFFERENTIATED_UP	2.99	0.000	0.000
	LEE_LIVER_CANCER_SURVIVAL_DN	2.96	0.000	0.000
	LI_WILMS_TUMOR_VS_FETAL_KIDNEY_1_DN	2.93	0.000	0.000
	RHODES_UNDIFFERENTIATED_CANCER	2.91	0.000	0.000
	BOYAULT_LIVER_CANCER_SUBCLASS_G123_UP	2.91	0.000	0.000
	WHITEFORD_PEDIATRIC_CANCER_MARKERS	2.91	0.000	0.000
	ZHOU_CELL_CYCLE_GENES_IN_IR_RESPONSE_24HR	2.90	0.000	0.000
	BIDUS_METASTASIS_UP	2.90	0.000	0.000
	CHANG_CYCLE_GENES	2.89	0.000	0.000
	KOBAYASHI_EGFR_SIGNALING_24HR_DN	2.89	0.000	0.000
	HOSHIDA_LIVER_CANCER_SUBCLASS_S2	2.87	0.000	0.000
	BORCZUK_MALIGNANT_MESOTHelioma_UP	2.87	0.000	0.000
	BOYAULT_LIVER_CANCER_SUBCLASS_G3_UP	2.84	0.000	0.000
	SHEDDEN_LUNG_CANCER_Poor_SURVIVAL_A6	2.82	0.000	0.000
	MITSIADES_RESPONSE_TO_APIDIN_DN	2.81	0.000	0.000
	GRAHAM_NORMAL QUIESCENT_VS_NORMAL DIVIDING_DN	2.80	0.000	0.000
	MISSAGLIA_REGULATED_BY METHYLATION_DN	2.80	0.000	0.000
	BURTON_ADIPGENESIS_3	2.77	0.000	0.000
	KANG_DOXORUBICIN_RESISTANCE_UP	2.75	0.000	0.000
	KONG_E2F3_TARGETS	2.75	0.000	0.000
	ZHAN_MULTIPLE_MYELOMA_PR_UP	2.74	0.000	0.000
	DUTERTRE_ESTRADIOL_RESPONSE_24HR_UP	2.73	0.000	0.000
	PUJANA_BRCA2_PCC_NETWORK	2.71	0.000	0.000
	WHITFIELD_CELL_CYCLE_LITERATURE	2.68	0.000	0.000
	KAUFFMANN_MELANOMA_RELAPSE_UP	2.66	0.000	0.000
	PUJANA_BRCA_CENTERED_NETWORK	2.64	0.000	0.000
	YU_MYC_TARGETS_UP	2.63	0.000	0.000
	ZHOU_CELL_CYCLE_GENES_IN_IR_RESPONSE_6HR	2.61	0.000	0.000
	SARRIO_EPITHELIAL_MESENCHYMAL_TRANSITION_UP	2.60	0.000	0.000
	MORI_IMMATURE_B_LYMPHOCYTE_DN	2.60	0.000	0.000
	FEVR_CTNNB1_TARGETS_DN	2.59	0.000	0.000
	KAMMINGA_EZH2_TARGETS	2.59	0.000	0.000
	BLUM_RESPONSE_TO_SALIRASIB_DN	2.58	0.000	0.000
	FOURNIER_ACINAR_DEVELOPMENT_LATE_2	2.57	0.000	0.000
	HORIUCHI_WTAP_TARGETS_DN	2.57	0.000	0.000
	JOHNSTONE_PARVB_TARGETS_3_DN	2.57	0.000	0.000
	FERREIRA_EWINGS_SARCOMA_UNSTABLE_VS_STABLE_UP	2.56	0.000	0.000
	WONG_EMRYONIC_STEM_CELL_CORE	2.56	0.000	0.000
	MARTINEZ_RESPONSE_TO_TRABECTEDIN_DN	2.56	0.000	0.000
	MORI_LARGE_PRE_BIL_LYMPHOCYTE_UP	2.55	0.000	0.000
	BURTON_ADIPGENESIS_PEAK_AT_24HR	2.55	0.000	0.000
Transcription factor targets	KRCTCNNNNNMANAGC_UNKNOWN	2.17	0.000	0.005
	SGCGSSAAA_V\$E2F1DP2_01	2.13	0.000	0.003
	V\$E2F1_Q6	2.09	0.000	0.003
	GGCNNMSMYNTTG_UNKNOWN	2.01	0.000	0.007
	GKCCCNNNNNNNNTGAYG_UNKNOWN	1.92	0.000	0.013
	RRCCGTTA_UNKNOWN	1.87	0.003	0.018
	V\$E2F4DP1_01	1.86	0.000	0.019
	V\$E2F_Q4_01	1.82	0.000	0.026
	V\$E2F1_Q4_01	1.78	0.000	0.032
	V\$E2F_Q4	1.77	0.000	0.030
	V\$E2F1_Q6_01	1.77	0.000	0.028
	GCCATNTTG_V\$YY1_Q6	1.77	0.000	0.027
	V\$E2F_02	1.76	0.000	0.026
	V\$E2F_Q6	1.76	0.000	0.024
	V\$E2F1_Q3	1.76	0.000	0.023
	V\$E2F_Q3	1.75	0.000	0.023
	V\$E2F1_Q4	1.75	0.000	0.022
	V\$E2F4DP2_01	1.73	0.000	0.026
	V\$E2F1DP1_01	1.73	0.000	0.025
	V\$E2F_Q3_01	1.72	0.000	0.025
	V\$E2F1DP2_01	1.72	0.000	0.024
	V\$DR4_Q2	1.69	0.003	0.031
	V\$E2F1DP1RB_01	1.67	0.006	0.035
	V\$NFAT_Q6	1.64	0.003	0.044
	ATCMNTCCGY_UNKNOWN	1.63	0.018	0.044
	V\$NFMEU1_Q6	1.63	0.003	0.044
Liver cancer gene signatures in literature	CHIANG08_SUBCLASS_PROLIFERATION	3.19	0.000	0.000
	LEE04_SUBCLASS_A	3.02	0.000	0.000
	BOYAULT07_SUBCLASS_G1G2G3	2.96	0.000	0.000
	HOSHIDA09_SUBCLASS_S2	2.84	0.000	0.000
	BOYAULT07_SUBCLASS_G3	2.84	0.000	0.000
	VILLANUEVA11_KRT19_POSITIVE	2.82	0.000	0.000
	WOO10_CHOLANGIO_LIKE_UP	2.60	0.000	0.000
	BOYAULT07_SUBCLASS_G2G3	2.37	0.000	0.000
	KIM12_SURVIVAL_POOR	2.27	0.000	0.000
	BOYAULT07_SUBCLASS_G1G2	2.23	0.000	0.000
	ANDERSEN10_KRT19_POSITIVE_CLSA	2.21	0.000	0.000
	BOYAULT07_SUBCLASS_G1	2.19	0.000	0.000
	MINGUEZ11_VASCULAR_INVASION_POSITIVE	2.14	0.000	0.000

		YAMASHITA08_EPCAM_UP WOO08_RECURRENCE_Poor CAIR008_HEPATOBLAST_LIKE_Poor_CLS2 KAPOSINOVAK06_MET_UP HOSHIDA09_SUBCLASS_S1 COULOUARN08_TGFB1_UP	2.12 2.04 1.87 1.78 1.76 1.64	0.000 0.000 0.000 0.005 0.000 0.006	0.000 0.000 0.002 0.006 0.007 0.017
Pseudoglandular	Biocarta (Curated pathway database)	BIOCARTA_CHEMICAL_PATHWAY	2.00	0.000	0.028
	Chemical and genetic perturbations (Experimentally defined target gene signature in literature)	CHIANG_LIVER_CANCER_SUBCLASS_CTNNB1_UP	2.60	0.000	0.000
	Liver cancer gene signatures in literature	CHIANG_CTNNB1_UP BOYALUT_G6_UP	2.55 1.82	0.000 0.000	0.000 0.022
SH-HCC	Reactome (Curated pathway database)	REACTOME_COLLAGEN_FORMATION REACTOME_EXTRACELLULAR_MATRIX_ORGANIZATION	2.16 2.14	0.000 0.000	0.009 0.005
	Gene Ontology - Cellular component	COLLAGEN EXTRACELLULAR_MATRIX_PART EXTRACELLULAR_MATRIX PROTEINACEOUS_EXTRACELLULAR_MATRIX	2.04 1.96 1.96 1.95	0.000 0.000 0.000 0.000	0.018 0.021 0.015 0.012
	Oncogenic pathway targets	CAHOY_ASTROGLIAL ESC_V6.5_UP_EARLY.V1_DN MEL18_DN.V1_UP BMI1_DN_MEL18_DN.V1_UP RPS14_DN.V1_UP BMI1_DN.V1_UP CORDENONSI_YAP_CONSERVED_SIGNATURE BCAT_BILD_ET_AL_UP STK33_SKM_UP RB_DN.V1_UP RB_P107_DN.V1_UP HOXA9_DN.V1_UP STK33_UP SIRNA_EIF4GL_DN STK33_NOMO_UP KRAS.DF.V1_UP RAF_UP.V1_UP	2.41 2.34 2.20 2.14 2.10 2.00 1.82 1.79 1.72 1.70 1.70 1.68 1.62 1.60 1.58 1.58 1.55	0.000 0.000 0.000 0.000 0.000 0.000 0.003 0.006 0.000 0.000 0.000 0.000 0.000 0.007 0.000 0.005 0.005	0.000 0.000 0.001 0.000 0.001 0.001 0.010 0.011 0.016 0.019 0.017 0.017 0.028 0.031 0.033 0.032 0.040
	Chemical and genetic perturbations (Experimentally defined target gene signature in literature)	WOO_LIVER_CANCER_RECURRENCE_UP HOSHIDA_LIVER_CANCER_SUBCLASS_S1	3.20 3.18	0.000 0.000	0.000 0.000
	microRNA targets	CCCNNNNNNNAAGWT_UNKNOWN	1.95	0.000	0.033
	Liver cancer gene signatures in literature	WOO08_RECURRENCE_UP HOSHIDA09_SUBCLASS_S1 WOO10_CHOLANGIO_LIKE_UP KIM12_SURVIVAL_Poor OISHI12_CHOLANGIO_STEM_CELL_DOWN CHIANG08_SUBCLASS_PROLIFERATION	3.20 3.13 2.65 2.48 1.90 1.77	0.000 0.000 0.000 0.000 0.003 0.000	0.000 0.000 0.000 0.000 0.003 0.012
Clear cell	Kyoto Encyclopedia of Genes and Genomes (KEGG) (Curated pathway database)	KEGG_MISMATCH_REPAIR	1.96	0.000	0.046
	Chemical and genetic perturbations	HOSHIDA_LIVER_CANCER_SUBCLASS_S2	2.82	0.000	0.000

(Experimentally defined target gene signature in literature)	BOYAUXT_LIVER_CANCER_SUBCLASS_G123_UP	2.39	0.000	0.001
	SHEN_SMARCA2_TARGETS_UP	2.24	0.000	0.007
	BIDUS_METASTASIS_UP	2.24	0.000	0.006
	PUJANA_XPRSS_INT_NETWORK	2.13	0.000	0.020
	LYAGING_MIDDLE_DN	2.12	0.000	0.018
	YAMASHITA_LIVER_CANCER_WITH_EPCAM_UP	2.12	0.000	0.017
	KAUFFMANN_MELANOMA_RELAPSE_UP	2.11	0.000	0.015
	ZHOU_CELL_CYCLE_GENES_IN_IR_RESPONSE_24HR	2.10	0.000	0.016
	SONG_TARGETS_OF_IE86_CMV_PROTEIN	2.10	0.000	0.015
	KAMMINGA_EZH2_TARGETS	2.07	0.000	0.018
	CHANG_CYCLING_GENES	2.02	0.000	0.032
	PATIL_LIVER_CANCER	2.00	0.000	0.036
	ISHIDA_E2F_TARGETS	1.97	0.000	0.040
	BOYAUXT_LIVER_CANCER_SUBCLASS_G1_UP	1.97	0.000	0.038
	WINNEPENNINCKX_MELANOMA_METASTASIS_UP	1.97	0.000	0.036
	CHOI_ATL_STAGE_PREDICTOR	1.96	0.000	0.036
	GABRIELY_MIR21_TARGETS	1.96	0.000	0.036
	ZHOU_CELL_CYCLE_GENES_IN_IR_RESPONSE_6HR	1.95	0.000	0.036
	PUJANA_BRCA2_PCC_NETWORK	1.95	0.000	0.034
	MITSIADES_RESPONSE_TO_APLIDIN_DN	1.93	0.000	0.037
	WHITFIELD_CELL_CYCLE_LITERATURE	1.90	0.006	0.046
	PUJANA_BRCA_CENTERED_NETWORK	1.89	0.000	0.049
	CROONQUIST_IL6_DEPRIVATION_DN	1.89	0.000	0.047
	GRAHAM_NORMAL QUIESCENT VS NORMAL DIVIDING_DN	1.88	0.000	0.046
	FUJII_YBX1_TARGETS_DN	1.88	0.000	0.045
	MISSAGLIA_REGULATED_BY METHYLATION_DN	1.88	0.000	0.045
	MORI_IMMATURE_B LYMPHOCYTE_DN	1.88	0.000	0.044
	CAIRO_HEPATOBLASTOMA_CLASSES_UP	1.87	0.000	0.046
	MILL_PSEUDOPODIA_HAPTOTAXIS_UP	1.86	0.000	0.045
microRNA targets	ATAACCT,MIR-154	2.21	0.000	0.004
Liver cancer gene signatures in literature	HOSHIDA09_SUBCLASS_S2	2.79	0.000	0.000
	BOYAUXT07_SUBCLASS_G1G2G3	2.39	0.000	0.000
	YAMASHITA08_EPCAM_UP	2.20	0.000	0.001
	BOYAUXT07_SUBCLASS_G1G2	1.97	0.004	0.005
	BOYAUXT07_SUBCLASS_G1	1.96	0.000	0.004
	LEE04_SUBCLASS_A	1.76	0.000	0.026
	VILLANUEVA11_KRT19_POSITIVE	1.70	0.000	0.030
	OISHI12_CHOLANGIO_STEM_CELL_UP	1.70	0.000	0.026
	ANDERSEN10_KRT19_POSITIVE_CLSA	1.63	0.036	0.043

Gene sets with FDR <0.05 or top 50 gene sets are shown.

NES: normalized enrichment score, FDR: false discovery rate, SH-HCC: Steatohepatitis-hepatocellular carcinoma. Click each gene set name for detailed information.

p-value/FDR of "0.000" indicates <0.001.

Table S8

Key driver genes in gene regulatory network modules (Planar Filtered Network Analysis, Key Driver Analysis).

Module	Size (no. genes)	Key driver genes
PFN-module_no1	1436	LCN1,SEC11A,RPL13,ST13,SF3A1,SURF1,IFNA5,RPS3A,CTBP1,DMBT1,CLIC4,SMS,PPP2CB,CA6,I,LF3,DHCR24,HIP2,STX4,MAP2K5,THBS2,MOXD1,VIL2,CEACAM8,RQCD1,COL6A3,SDC2,MMP19,C,OPS8,RGS10,GALNT10,FRG1,PDAP1,TFAP2C,RAD23B,TNFRSF8,PRAF2,NDUFB1,RAB2A,ATP6V1C1,HNRPA2B1,IER3,ARL2BP,BPGM,DAG1,PHF21A,SMARCD2,ABCF3,C21orf91,PMM2,PPP3CA,HLA-A-,PPP2R5C,SAT1,ATP1B1,CSTF2,SNAPC5,TRIM14,AES,DDX3Y,SDC4,BCAT2,PPARD,PSMD6,ADR M1,RPS6KB2,NIPSNA1,AKR1B1,MAPKAPK3,CREB1,EIF2S1,PLK2,TRIM26,TSN,DNAJA1,PC,PIK4 CB,APP,FN1,RPS6KB1,ANXA7,TRAK2,HNRPC,SLC22A18,EPAS1,CITED2,EIF3S10,PPIH,CD151,PARK7,GUK1,LSM3,PRKACA,SERPINA1,REL,TMEM97,BMI1,GIPC1,SSR4,DDX17,NGFRAP1,CD46,HLA-B-,DQB1,TCTA,UBXD6,USP34,XRCC5,CLTB,FOXA1,PAFAH1B2,PCBP2,SRRM2,ZEB1,CNIH,LAMB2,PTTG1,TJP1,MRPL12,PENK,RARRES1,RPL36AL,C4BPB,LUM,APOB,GNB1,SAFB2,POLR2J,CRK,PCK2,CYB5A,FCGR1A,MGST2,PGK1,NPC2,ECHS1,HADHB,GTF2A1,PIB,ZNF423,ATP5O,COPS2,ELK1,PSEN1,UCK2,PSCD1,COL3A1,HOXB5,IFRD2,PIB5PA,TAF11,ZNF3,LY96,RAC2,TUBG1,ACAT1,FABP4,MRPS31,RYK,UCN,ZNF22,DDX1,NAPA,PAPS2,SLC9A3R1,SREBF2,WWP1,TOP2A,EVI2B,PTPRC,COL1A2,COL1A1,ECM2,SNRPB2,ANP32B,REEP5,CXCL12,KNG1,TNIP1
PFN-module_no10	166	FOXF2,GHRH,MMP8,PRR5,NOX4,MC4R,AMELX,ANGPTL4,SPINK2,SRPK3,SLC2A3,TGFB2,TCF15,CHRNA2,SPRR3,CSDC2,LCT,ART3,KIR3DL2,MYOG,RPL11,SEMA4D,PLAUR
PFN-module_no11	214	ARHGDIB,ATP2A3,CD3E,LTB,CD52,EVI2B,IGJ,BTG2,PTPRC,AIF1,IL16,SH2D2A,LCP1,CD27,LAPTM5,GMFG,SPOCK2,C6orf32,CD3D,ARHGAP25,LCP2,CD48,PRKCB1,STK17B,GP53,FGL2,CXCR4,PSCDBP,LSP1,MS4A6A,TMSB10
PFN-module_no13	266	ACOX2,ADH1B,SEC14L2,MTHFD1,HSD11B1,DCXR,AQP9,CPB2,ALDH6A1,HPD,APOC4,CDO1,ADH6,DBT,PKM2,SERPINC1,RGN,NR1I3,SCP2,PCK2,PAH,GCDH,FLJ20699,SLC10A1,PON3,TAT,C6,FAAH,PPARA,C4BPA,CAT
PFN-module_no14	139	TCEAL4,YY1,DYNLL1,HINT1,ACTN1,SDCBP,ZC3H15,PSME1,SRP19,EIF4B,SNRPC,RAB4A,CAV1,EI F3S2,REST,UVRAG,MBP,SF3B2,AP2S1,SUB1,REEP5,ATP5G3,RAP1B,RPS6KA3
PFN-module_no15	87	TOP2A,NCAPH,DLG7,PRC1,TTK,LMBN1,SMC4,UBE2C,NEK2,NUSAP1,HIST1H2AE,KIAA0101,PTTG1,CCNA2,GINS1,MCM6,ZWINT,BRCA1,CDK2,RRM2,HIST1H2BD,ACAA1,C22orf5
PFN-module_no18	577	LBX1,IFNA1,SOX11,LALBA,BMPR1B,CACNG1,LRP2,MYT1,GPR3,EPYC,FABP7,STAR,CYP2A7,DRD5,WNT1,NEUROD2,PSG6,NEUROG1,CSRP3,OR2H1,PRM1,COXA1,PPM1E,SCD5,CSF3,GABRB1,CHRN2B,MCF2,NDP,ACRV1,CLUL1,CRISP1,KIF2C,BMP4,MPL,CD1A,KRT81,ATP12A,MOG,AMPH,BRAF,PTK2,CEP350,NUAK1,CUL4B,RIT2,BLK,CYP24A1,KRT76,NPPA,PYY,DNTT,KRT75,MAGEA9,C CL1,CDH8,CST1,HTR6,SUMO1,ZP2,MYOC,SCG2,VIP,ADORA2B,DLG3,HOXA1,KLK6,KRT13,LEFTY2,ATP1A2,DLX2,HTR2A,NHLH2,SLC2A5,CCR5,GPR143,GYPE,OPRM1,DUSP2,TBR1,CRYBB1
PFN-module_no2	859	ST13,SURF1,SEC11A,CTBP1,SMS,PPP2CB,HIP2,SF3A1,RQCD1,RPL13,FRG1,PDAP1,RAD23B,NDUFB1,CSTF2,AES,LCN1,AKR1B1,EIF2S1,IFNA5,HNRPC,PPIH,PARK7,GUK1,HNRPA2B1,LSM3,PRKACA,TMEM97,RPL36AL,SSR4,NGFRAP1,CD46,HLA-DQB1,CLTB,CNIH,PTTG1,C4BPB,APOB,GNB1,POLR2J,REL,VIL2,PCK2,CYB5A,FCGR1A,MGST2,NPC2,ECHS1,HADHB,SAFB2,SERPINA1,PIB,COPS2,PSEN1,UCK2,IFRD2,BRE,PLS3,BRD8,LY96,PSMA7,RAC2,TUBG1,ACAT1,CRK,FABP4,MRPS31,RYK,STX4,UCN,ZNF22,DDX1,NUP155,NAPA,PAPS2,SLC9A3R1,SREBF2,WWP1,BRP44,COL18A1,TOP2A,CHPF,EVI2B,PTPRC,SMAD5,SRI,GNG10,HAZ1,PDK2,PTPRM,SIPA1,TBCB,LAMB2,LSM1,PSMA3,TIMM17A,UQCRCFS1,USP1,IDI1,TPR2,CENP B,FBL,ITGA6,MGST3,CCT5,HOXC4,UBD,ANP32B,DHX9,REEP5,COPE,ELAVL1,SHC1,FAM3C,RAB5A,KNG1,AGXT
PFN-module_no20	961	DIRAS1,SH3GL3,MYCBP,AOC2,CNR1,TNNI3,BAPX1,APOBEC1,GABRQ,PCSK1,CKS2,TNRC4,ADARB1,BRCA2,CD6,UNC5C,TLE2,EPHA5,KLK4,ERAF,F2RL1,GIPR,GATA1,IL3,VTN,SSPN,XX,MYLK2,P APPA,PNLIP,ERCC4,HIST1H4B,CUL4A,CBX3,RHOA,CALD1,SPRY2,TNFRSF14,QRPT,CPA1,RXRG,NOL14,SFTP8,SLC25A6,WT1,IFNGR2,RNF2,ANGPT2,REGL,CNTN1,FOXI1,CLPS,SYT17,TCFL5,CSF3R,SFRS1,SMARCC1,GP9,PFDN5,REV3L,ZFP161,ADNP,LMNB2,MALL,INPP5E,CDKN2B,CHST2,S YNCRIP,TAZ,ZIC1,ATP2A1,GPRC5B,PTHR1,MDC1,MYBPC1,POU1F1,RB1CC1,TP73,Septin4,CTNNB1,NELL1,MYOM2,SLC15A2,DTYMK,HNRPU,RNPEP,SULF1,EXDL2,NAV3,NMT1,NPR1,TFA P2A,TPR,CDS2,CEBPZ,HMMR,ST18,COMMD3,MCM7,XRCC6,IVNS1ABP,NR2F2,PAX2,PPARG,STA T3,HTR7,NOV,RORA,FGFR4,GNE,CASP7,CD86,DNTTIP2,FUT2,LAMC2,RAC3,RBM9,UBE3C,ABCE1,JARID1C,RBM4,ACOT7,ATP6V1E2,C5orf15,EXOSC10,IFIT2,NME1,RPN2,SNTB1,DNASE1L2,MS4A4A,PHKG1,SNX17,CDH12,EEF1G
PFN-module_no22	71	HIST1H2BF,PCNA,YBX1,HIST1H1E,TRIM28,HIST1H4E,ILF2,DLG7,HIST1H3H,TROAP,RELA,PRC1,BIRC5
PFN-module_no26	121	TSHB,ELAVL3,SERPINB2,DMN,FLJ33790,SNCB,NINJ2,KIAA0274,TBL3,LEF1,HOXA5,KL,SLC17A7,C NGB1,SCUBE2,XRCC2,GUCY1A3,NKX2-5
PFN-module_no3	120	RNF185,AMELY,GRM1,ALK,PRKCG,MYH6,GDPD5,SFTPA2,KCTD2,SEMA3B,EPHA4,CCNG1,FOLR1,ARHGDIG,GML,LLGL2,SLC6A12,TP53I11
PFN-module_no30	85	MAG,MMP13,IFNA21,NEFH,MMP15,PSG3,STC2,OLFM1,SOX3,EDN2,DEFA4,ALPPL2
PFN-module_no32	133	POU4F2,PGC,CTRC,AQP6,C1orf61,GUCY2D,CKM,SCNN1G,TSPYL5,FUT3,MME,IVL,PSG1,SLC5A6,RBMX,DNASE1L3,DPEP1,RHD,SCEL,LAMA3,AMACR,EDN2,IRX5

PFN-module_no33	223	GPR109B,PRL,NAP1L3,CNTN2,SART3,RBP3,OPRM1,TH,TEK,CRHR1,LIPF,SFTPC,ARF4,EIF4A1,TP73L,ATP5D,SEPHS1,ALAS2,MFAP5,COX6A1,EPM2AIP1,IL11RA,NPY5R,MAEA,SLC14A1,HAGH,POLR3D,SPINK5,TMEM187,H2AFZ,GSTM1,IL9R,USP14,GNP2,COX5B,ITSN1,SLC6A3,ISG15,MYBPC3,CHI3L1,GRIA1,ABCB4,SYNGR1,MLN
PFN-module_no34	104	REN,CPA2,EFNA3,HSPB2,STAT4,IRX4,CRYGD,BLMH,CD93,CTAG1B,MN1,ARSA,ICAM4,TRAF5,ING3,ZNF165,GNG5,TAF6,ZNF593
PFN-module_no37	117	CTRC,PGC,AQP6,POU4F2,MME,C1orf61,FUT3,SLC5A6,PPY,CKM,GUCY2D,SCNN1G,TSPYL5,LAMA3,AMACR,AMPD1,IRX5,RHD,RBMX,PRKACG
PFN-module_no4	126	RAPGEF1,CNP,FDPS,CDKN2D,PPP2R5B,ELK1,FKBP1A,EHMT2,PIK3R2,TCF3,FOXO3,ST6GAL1,DAPT,TAF7,ARHGEF12,PGK1,EXT1,TNIP1
PFN-module_no51	1760	LCN1,SEC11A,RPL13,ST13,SF3A1,IFNA5,SURF1,RPS3A,DMBT1,CTBP1,CLIC4,CA6,ILF3,SMS,DHCR24,PPP2CB,THBS2,STX4,VIL2,MAP2K5,UQCRRFS1,MOXD1,MMP19,CEACAM8,HIP2,COL6A3,GALNT10,SDC2,RAB5A,COPS8,RGS10,PSMD7,KLHDC3,RQCD1,TFAF2C,RAB2A,ATP6V1C1,TNFRSF8,C21orf91,HNRPA2B1,PRAF2,NDUFB7,DDX3Y,IER3,ARL2BP,BPGM,DAG1,FRG1,PHF21A,SMARCD2,ABC3,FARSA,PMM2,PPP1R7,PPP3CA,PDAP1,HLA-F,PPP2R5C,RAD23B,SAT1,ATP1B1,SNAPC5,TRIM14,SDC4,BCAT2,PPARD,PSMD6,ADRM1,RPS6KB2,NIPSNAP1,NDUFB1,MAPKAPK3,CREB1,PLK2,TRIM26,TSN,ARHGDIB,DNAJA1,PC,PIK4CB,APP,FN1,RPS6KB1,ANXA7,CSTF2,TRAK2,PDXK,AES,SLC22A18,UQCRC1,EPAS1,SNAI2,CITED2,EIF3S1,0,AKR1B1,CD151,HIST1H4C,EIF2S1,BM11,GIPC1,DDX17,TCTA,UBXD6,USP34,FOXA1,PAFAH1B2,P,CBP2,SRRM2,ZEB1,LAMB2,HNRPC,REL,TJP1,PTTG1,MRPL12,PENK,PPIH,SAFB2,LTB,PARK7,GUK1,LSM3,PRKACA,SERPINA1,ATP2A3,TMEM97,RPL36AL,SSR4,NGFRAP1,CD3E,CD46,HLA-DQB1,XRCC5,CLTB,CNIH,ELK1,CNP,LUM,RARRES1,CRK,CD52,GTf2A1,PGK1,APOB,EV12B,TOP2A,C4BPB,PTPRC,GNB1,HOXB5,PIB5PA,RAPGEF1,POLR2J,TAF11,ZNF3,CYB5A,ELAVL1,PCK2,FCGR1A,MGST2,RPP38,HADHB,NPC2,AP3S1,ECHS1,IGJ,PPIB,ZNF423,ATP5O,COPS2,PIK3CA,PSEN1,RBMS9,UCK2,PSCD1,RAC2,APOC2,COL3A1,IFRD2,BRE,PLS3,BRD8,LY96,PSMA7,TUBG1,ACAT1,FABP4,MRPS31,NEK2,RYK,UCN,ZNF22,DDX1,FDPS,COL1A2,COL1A1,ECM2,SNRPB2,ANP32B,MFAP4,REEP5,CXCL12,FKBP1A,TNIP1,KNG1,TAF7,TMEPAI
PFN-module_no52	160	POU4F2,CTRC,PGC,AQP6,CKM,C1orf61,RHD,IVL,FUT3,GUCY2D,SCNN1G,TSPYL5,MME,DNASE1L3,PSG1,SLC5A6,RBMX,DPEP1,PPY,AMPD1,SCEL,LAMA3,SERHL2,AMACR,PRKACG
PFN-module_no53	273	ACOX2,ADH1B,SEC14L2,MTHFD1,HSD11B1,DCXR,CPB2,AQP9,ALDH6A1,CDO1,HPD,APOC4,ADH6,DBT,PKM2,SERPINC1,RGN,NR113,SCP2,PCK2,PAH,GCDH,PON3,FLJ20699,SLC10A1,TAT,C6,FAAH,PPARA,C4BPA,HGD,SULT2A1,ACY1,CAT,PCSK6
PFN-module_no54	548	NOX4,AMELX,GHRH,CARTPT,ATBF1,NEUROD1,MMP8,FOXF2,GRK1,TPH1,PKMYT1,LGALS7,PDE4A,CCNU,MC4R,TGFB2,KIF14,OCA2,ART3,PRR5,PLAGL1,CBFA2T3,RPA3,SPINK2,FCGBP,GNAO1,GNRH1,AIM1,NEFM,DEGS1,FEV,COL4A3,SFRS11,NR2C1,KIAA1539,ANGPTL4,NUP214,ILVBL,EEF1A2,IL13RA1,KBTBD10,TMEM4,TNNI1,TDFG1,ADCY2,CHRNA2,PFTK1,CYP11A1,DUSP9,MYL4,SALL1,NEBL,SLC14A2,ECE2,PSMB4,UBXD2,RPL11,SPRR3,CCR1,GPR116,SERPINB7,TBX5,BCL2L1,MYOZ2,SYPL1,LAMA4,SLC34A1,TACR3,SRPK3,PLAUR,GABRA1
PFN-module_no56	696	LBX1,SOX11,IFNA1,LALBA,BMPR1B,CACNG1,LRP2,MYT1,GPR3,EPYC,ELAVL3,STAR,FABP7,CYP2A7,DRD5,WNT1,NEUROD2,PSG6,NEUROG1,CSR3,OR2H1,PRM1,SCD5,COX7A1,PPM1E,TSHB,CSF3,SERPINB2,GABRB1,CHRNBB2,MCF2,CLUL1,KIF2C,DMN,NDP,ACRV1,CRISP1,BMP4,MPL,CD1A,KRT81,MOG,ATP12A,AMPH,BRAF,FLJ33790,PTK2,SNCB,CEP350,NUAK1,CUL4B,NPPA,PYY,RIT2,BLK,CYP24A1,KRT76,NINJ2,PRSS1,DNTT,KRT75,MAGEA9,KIAA0274,SUMO1,CCL1,CDH8,CST1,HTR6,ZP2,MYOC,SCG2,VIP,ADORA2B,DLG3,HOXA1,KLK6,KRT13,LEFTY2,ATP1A2,DLX2,HTR2A,NHLH2,SLC2A5,CCR5,GPR143,GYPE,OPRM1,TBL3,PLP1,TRPM8,DUSP2,GUCY1A3,TBR1,CRYBB1
PFN-module_no57	129	RNF185,AMELY,GRM1,ALK,PRKCG,MYH6,GDPD5,SFTPA2,SEMA3B,KCTD2,EPHA4,CCNG1,MAPK8,FOLR1,ARHGDIG,GML,LLGL2,SLC6A12,TP53I11,NR5A1
PFN-module_no6	124	IGFBP7,LUM,MFAP4,CXCL12,GEM,COL6A2,TAGLN,AEBP1,COL3A1,PTGIS,EPHA3,C7,HGF,BGN,BMP5,COL1A2,FILIP1L,GFPT2,TMEPAI
PFN-module_no9	498	NOX4,AMELX,ATBF1,CARTPT,NEUROD1,GHRH,TPH1,FOXF2,GRK1,PKMYT1,MMP8,PDE4A,LGALS7,CCNU,OCA2,CBFA2T3,GNAO1,GNRH1,AIM1,FEV,TGFB2,ART3,SFRS11,KIF14,RPA3,FCGBP,KIAA1539,ILVBL,NEFM,DEGS1,TMEM4,COL4A3,NR2C1,PLAGL1,PRR5,TDFG1,ADCY2,NUP214,PFTK1,EEF1A2,TNNI1,DUSP9,MYL4,SALL1,SLC14A2,ECE2,PSMB4,UBXD2,ANGPTL4,CYP11A1,IL13RA1,CCR1,GPR116,SERPINB7,TBX5,BCL2L1,SYPL1,LAMA4,NEBL,SLC34A1,KRT32,KBTBD10,SRPK3,USP9X,ZNF711,ARID1A,INSR,ARNT2,PLAUR,GABRA1

Table S9

Gene regulatory network modules associated with histopathological features in the validation set.
(Gene Set Enrichment Analysis)

Histopathological feature	Gene subnetwork	NES	p-value	FDR
Microtrabecular	PFN-MODULE_NO13	1.85	0.002	0.034
	PFN-MODULE_NO53	1.85	0.002	0.018
	PFN-MODULE_NO33	1.71	0.010	0.070
Macrotrabecular/Compact	PFN-MODULE_NO22	1.73	0.004	0.170
	PFN-MODULE_NO15	1.66	0.035	0.165
SH-HCC	PFN-MODULE_NO6	1.79	<0.001	0.098
Pseudoglandular	PFN-MODULE_NO56	1.86	0.003	0.055
	PFN-MODULE_NO18	1.78	0.016	0.080
Fatty change	PFN-MODULE_NO20	1.82	0.024	0.085

SH-HCC: steatohepatitic hepatocellular carcinoma, NES: normalized enrichment score,

FDR: false discovery rate.

Table S10

Prognostic association of HCC molecular subclasses (univariable Cox regression modeling)

	Training set			Validation set		
	HR	95%CI	p-value	HR	95%CI	p-value
S1 subclass						
Death	0.76	0.39 - 1.47	0.41	0.89	0.49 - 1.64	0.72
Recurrence	1.03	0.64 - 1.65	0.91	0.93	0.54 - 1.61	0.81
S2 subclass						
Death	0.56	0.25 - 1.27	0.17	0.95	0.53 - 1.73	0.88
Recurrence	0.94	0.55 - 1.61	0.83	0.97	0.55 - 1.69	0.91
S3 subclass						
Death	1.78	0.99 - 3.20	0.05	1.14	0.67 - 1.96	0.63
Recurrence	1.02	0.66 - 1.57	0.94	1.09	0.66 - 1.81	0.73

HCC: hepatocellular carcinoma, HR: hazard ratio, CI: confidence interval.

Table S11

Performance of clinicopathological indices predictive of HCC molecular subclasses optimized for sensitivity/specificity.

Molecular subclass	Training set					Validation set				
	AUROC	Sensitivity	Specificity	PPV	NPV	AUROC	Sensitivity	Specificity	PPV	NPV
S1	0.69	70%	58%	43%	81%	0.71	83%	49%	42%	87%
S2	0.86	82%	81%	63%	92%	0.77	86%	69%	43%	95%
S3	0.83	69%	81%	71%	79%	0.73	65%	75%	71%	69%

Molecular subclass predictions using the clinico-histopathological indices were based on the following formulae and cut-off values optimized for sensitivity/specificity in the training set:

S1 = 1.45 x SH-HCC (0: no, 1: yes) + 1.18 x Immune cell infiltrate (0: 0-1, 1: 2); > 0.59 was predicted as S1 subclass.

S2 = 2.48 x macrotrabecular/compact (0: no, 1: yes) + 2.38 x serum alpha-fetoprotein (0: ≤ 400 ng/mL; 1: > 400 ng/mL)

- 1.50 x pseudoglandular (0: no, 1: yes); > 1.68 was predicted as S2 subclass.

S3 = 1.37 x microtrabecular (0: no, 1: yes) - 2.97 x SH-HCC (0: no, 1: yes) - 1.59 x clear cell (0: no, 1: yes) - 1.13 x tumor grade (0: Edmondson-Steiner III or IV, 1: Edmondson-Steiner I or II); > 1.94 was predicted as S3 subclass.

HCC: hepatocellular carcinoma, AUROC: area under receiver operating characteristic curve, PPV: positive predictive value, NPV: negative predictive value, SH-HCC: steathepatitic HCC, HBV: hepatitis B virus.

Table S12

Required sample size in clinical trial and NNT in HCC molecular subclass-targeting therapy.

Molecular subclass		S1 (prevalence: 30%)			S2 (prevalence: 25%)			S3 (prevalence: 45%)		
ORR in targeted subclass		0.5 0.6 0.7			0.5 0.6 0.7			0.5 0.6 0.7		
Sample size	All comers	184	121	88	293	184	129	76	53	39
	Subclass index-positive patients	43	30	22	62	43	32	31	22	16
NNT	All comers	6.7	5.6	4.8	8.0	6.7	5.7	4.4	3.7	3.2
	Subclass index-positive patients	3.3	2.8	2.4	4.0	3.3	2.9	2.8	2.3	2.0

Required sample sizes in one arm are shown (alpha=0.05, power=0.9). ORR: objective response rate, NNT: number needed to treat.

Table S13

Prognostic association of clear cell variant in literature.

	Yang, et al.		Emile, et al.*		Liu, et al.		Lai, et al.		Audisio, et al.**	
Characteristic	Clear cell (n=97)	Non-clear cell (n=118)	Clear cell (n=10)	Non-clear cell (n=108)	Clear cell (n=43)	Non-clear cell (n=597)	Clear cell (n=29)	Non-clear cell (n=50)	Clear cell (n=7)	Non-clear cell (n=130)
Male	69 (71%)	103 (87%)	8 (80%)	86 (80%)	32 (74%)	486 (81%)				
Hepatitis B infection	16 (16%)	12 (10%)	2 (20%)	25 (22%)	37 (86%)	443 (74%)				
Hepatitis C infection	47 (48%)	52 (44%)	4 (40%)	44 (41%)	6 (14%)	7 (1.2%)				
Hepatitis B & C infection	4 (4%)	1 (1%)	0 (0%)	2 (2%)						
Alcohol	NA	NA	2 (20%)	15 (14%)						
Cirrhosis	74 (76%)	70 (59%)	10 (100%)	108 (100%)	33 (77%)	514 (86%)				
Tumor stage	Mostly early-intermediate stage		Mostly early stage		Mostly intermediate-advanced stage		All advanced stage			
Treatment	Resection		Liver transplant		Resection		Best supportive care			
Prognosis	Trend of poorer prognosis and earlier recurrence in clear cell		No difference		Better prognosis in clear cell		Better prognosis in clear cell		Poorer prognosis in clear cell	
Reference	Pathol Int 46;503 (1996)		Histopathology 38;225 (2001)		Hepatol Res 38;291 (2008)		Cancer 44;1677 (1979)		Tumori 73;389 (1987)	

*Only tumors with > 90% clear cells were classified as clear cell variant positive.

**Only tumors with ≥ 50% clear cells were classified as clear cell variant positive.

Supplementary figure legend

Figure S1.

Study design.

Histopathological evaluation and determination of HCC molecular subclass were performed in the training set (left), and clinicopathological feature-based indices predictive of the molecular subclasses were developed. The indices were subsequently tested in an independent validation set (right).

Figure S2.

Concordance of HCC molecular subclass prediction between the full 619-gene signature and reduced 30-gene signature.

The subclass prediction was repeated with the 30-gene signature in the 9 datasets using nearest template prediction algorithm as previously described [Cancer Res 69;7385-92,2009] and concordance with the original prediction made by the 619-gene signature was evaluated. Median concordances for the prediction of overall subclasses, S1, S2, and S3 subclasses were 85% (IQR: 80%-90%), 78% (IQR: 74%-88%), 86% (IQR: 82%-93%), and 85% (IQR: 84%-89%), respectively.

Figure S3.

Induction of YAP target genes in S2 subclass (Gene Set Enrichment Analysis).

The signature of YAP activation ([CORDENONSI_YAP_CONSERVED_SIGNATURE](#)) was significantly enriched with S2 subclass. NES: normalized enrichment score, FDR: false discovery rate.

Figure S4.

The macrotrabecular/compact pattern-associated gene regulatory network modules (A: no.22, B: no.15) identified by Planar Filtered Network Analysis (PFNA).

Red nodes indicate key driver genes in the module determined by Key Driver Analysis (KDA). Green circles indicate top or bottom 50 genes deregulated in the HCC tumors with the macrotrabecular/compact pattern in the validation set.

Figure S5.

The pseudoglandular pattern-associated gene regulatory network module (no.56) identified by Planar Filtered Network Analysis (PFNA).

Red nodes indicate key driver genes in the module determined by Key Driver Analysis (KDA). Green circles indicate top or bottom 50 genes deregulated in the HCC tumors with the pseudoglandular pattern in the validation set.

Figure S6.

The steatohepatitic hepatocellular carcinoma (SH-HCC) variant-associated gene regulatory network module (no.6) identified by Planar Filtered Network Analysis (PFNA).

Red nodes indicate key driver genes in the module determined by Key Driver Analysis (KDA). Yellow circles indicate top or bottom 50 genes deregulated in the HCC tumors with SH-HCC variant in the validation set.

Figure S7.

Serum alpha-fetoprotein (AFP) levels according to HCC molecular subclasses in the training set.

AFP levels were significantly higher in the S2 subclass compared to the rest ($p<0.001$, Wilcoxon rank-sum test).

Figure S8.

Correlation of clinicopathological features with HCC molecular subclasses (univariable logistic regression analysis). (A: training set, B: validation set)

SH-HCC: steatohepatitic hepatocellular carcinoma, DCP: des-gamma-carboxy prothrombin, AFP: alpha-fetoprotein, L3: lens culinaris agglutinin-reactive fraction 3, HCV: hepatitis C virus, HBV: hepatitis B virus.

Figure S9.

Receiver operating characteristic (ROC) curves for the S1, S2, and S3 subclass-predictive indices based on clinicopathological features.

Receiver operating characteristic (ROC) curves for the S1, S2, and S3 subclass-predictive indices based on tumor-related clinicopathological features in the training set (upper panels) and the validation set (lower panels). Red and black arrows indicate cut-off values optimized for PPV and sensitivity/specificity, respectively which were determined in the training set and applied to the validation set. AUROC: area under ROC curve.

Figure S10.

Required sample size in clinical trial and NNT in HCC molecular subclass-targeting therapy.

Sample size required to detect therapeutic response in clinical trial of HCC drugs (upper panel) and NNT (lower panel) based on the HCC molecular subclass-predictive indices were determined. Positive predictive value (PPV) for each subclass was derived from the validation set (Table 4). Sample sizes were calculated at alpha error of 0.05, power of 0.90, and treatment/control ratio of 1. Based on previously published biomarker-enriched clinical trials in lung cancer [39], ORRs of 50% , 60%, and 70% were tested. NNT: number needed to treat, ORR: objective response rate.

Figure S1

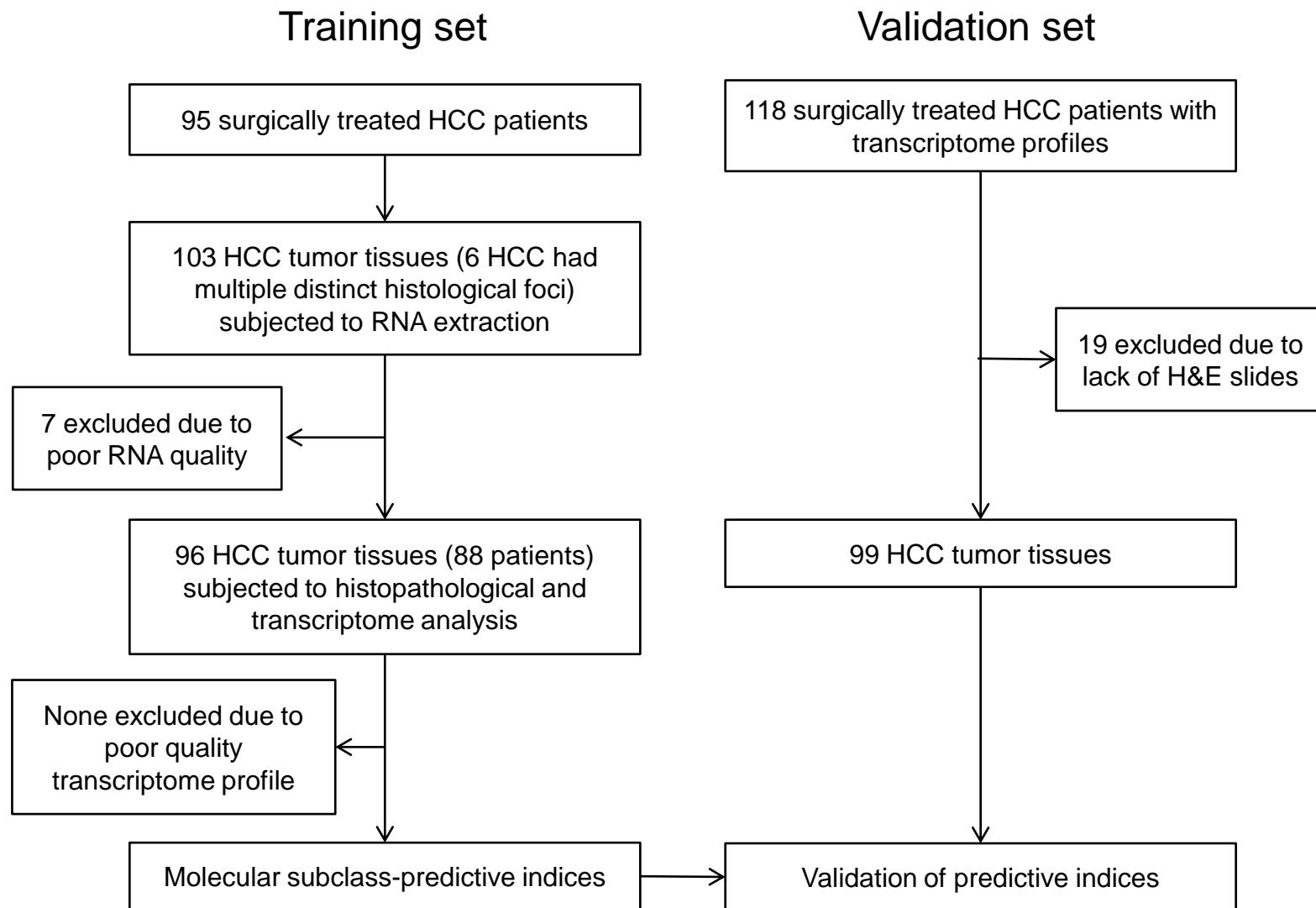


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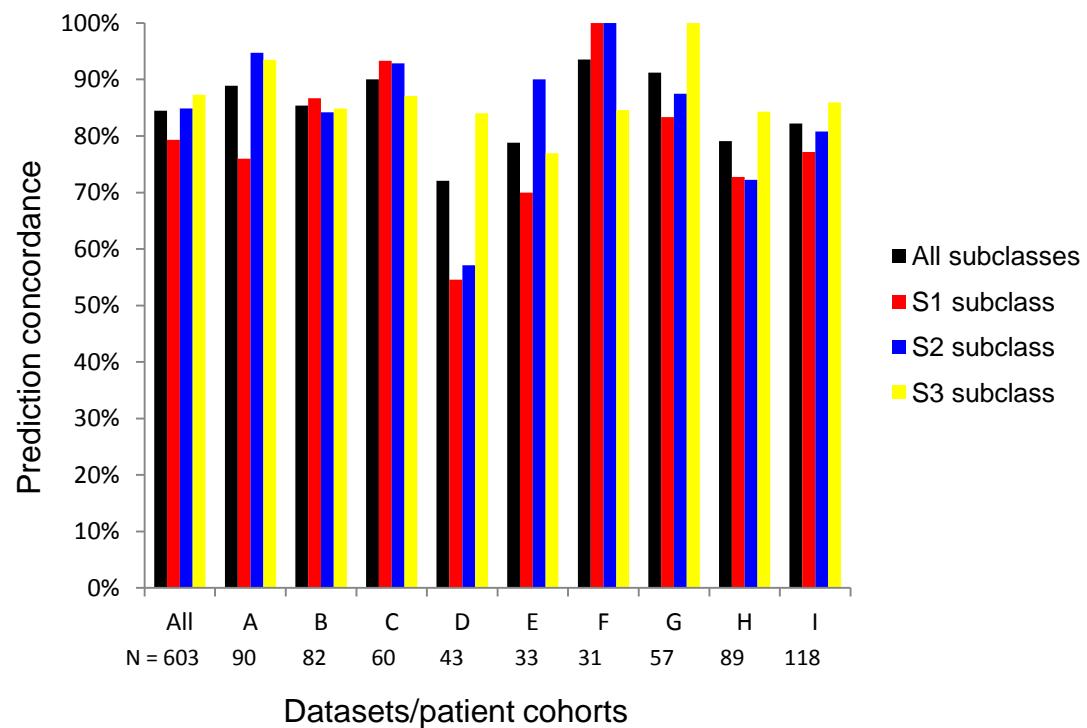


Figure S3

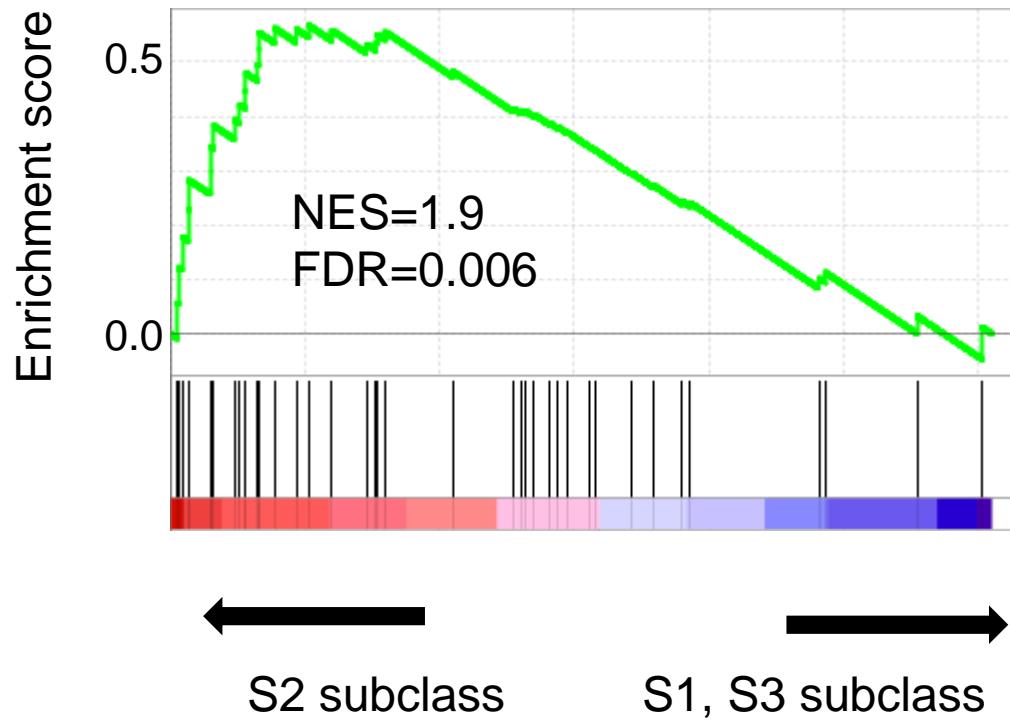


Figure S4A

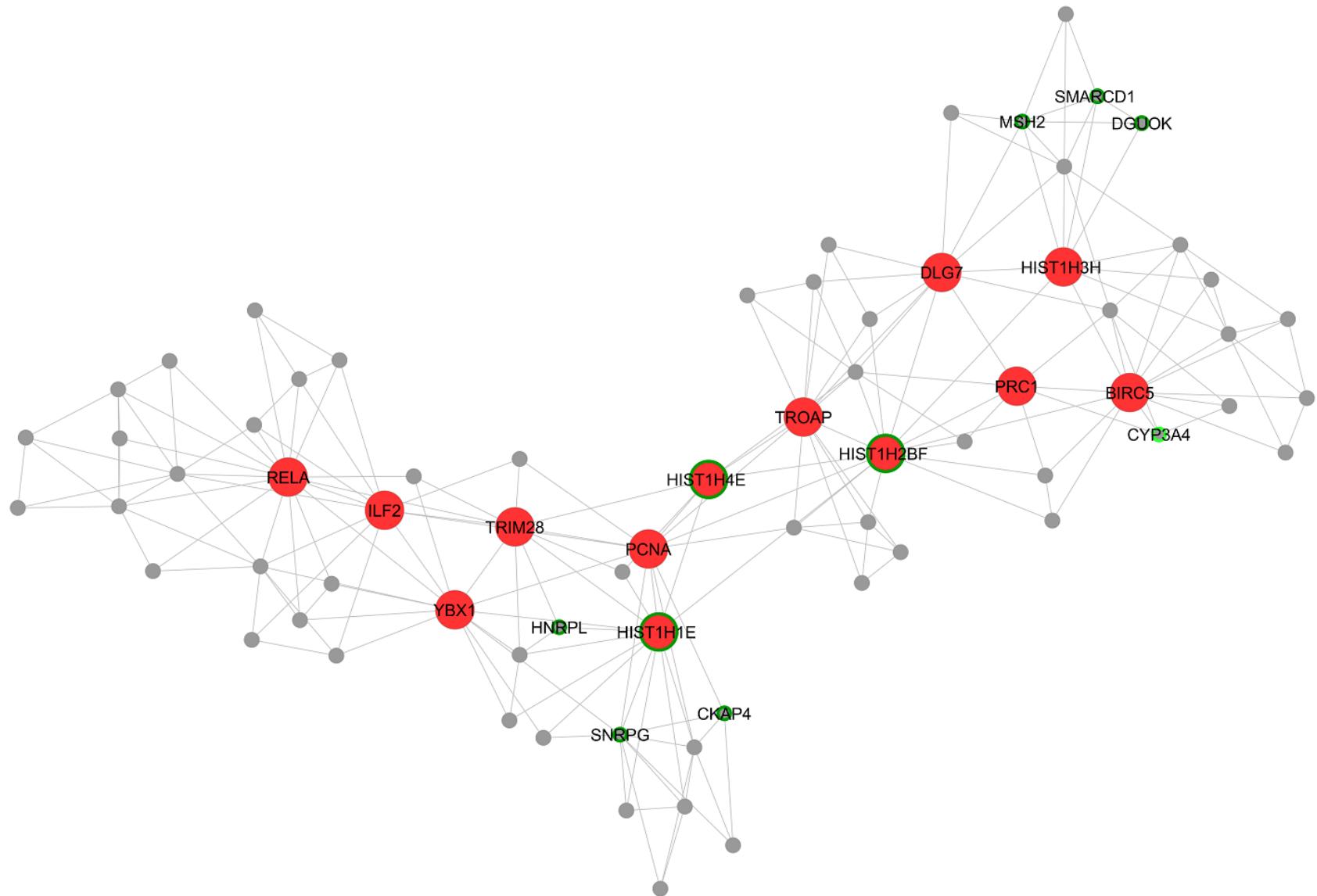


Figure S4B

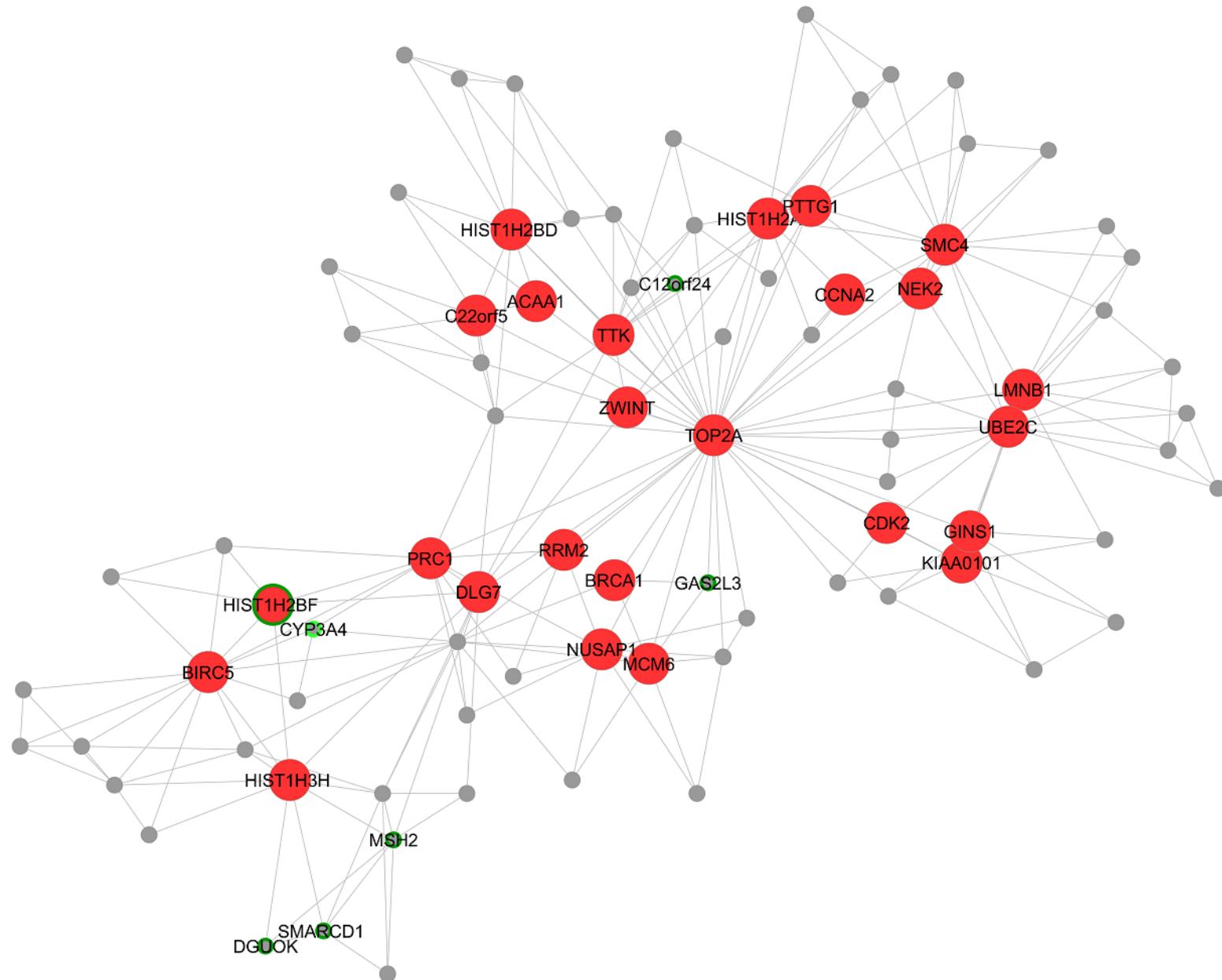


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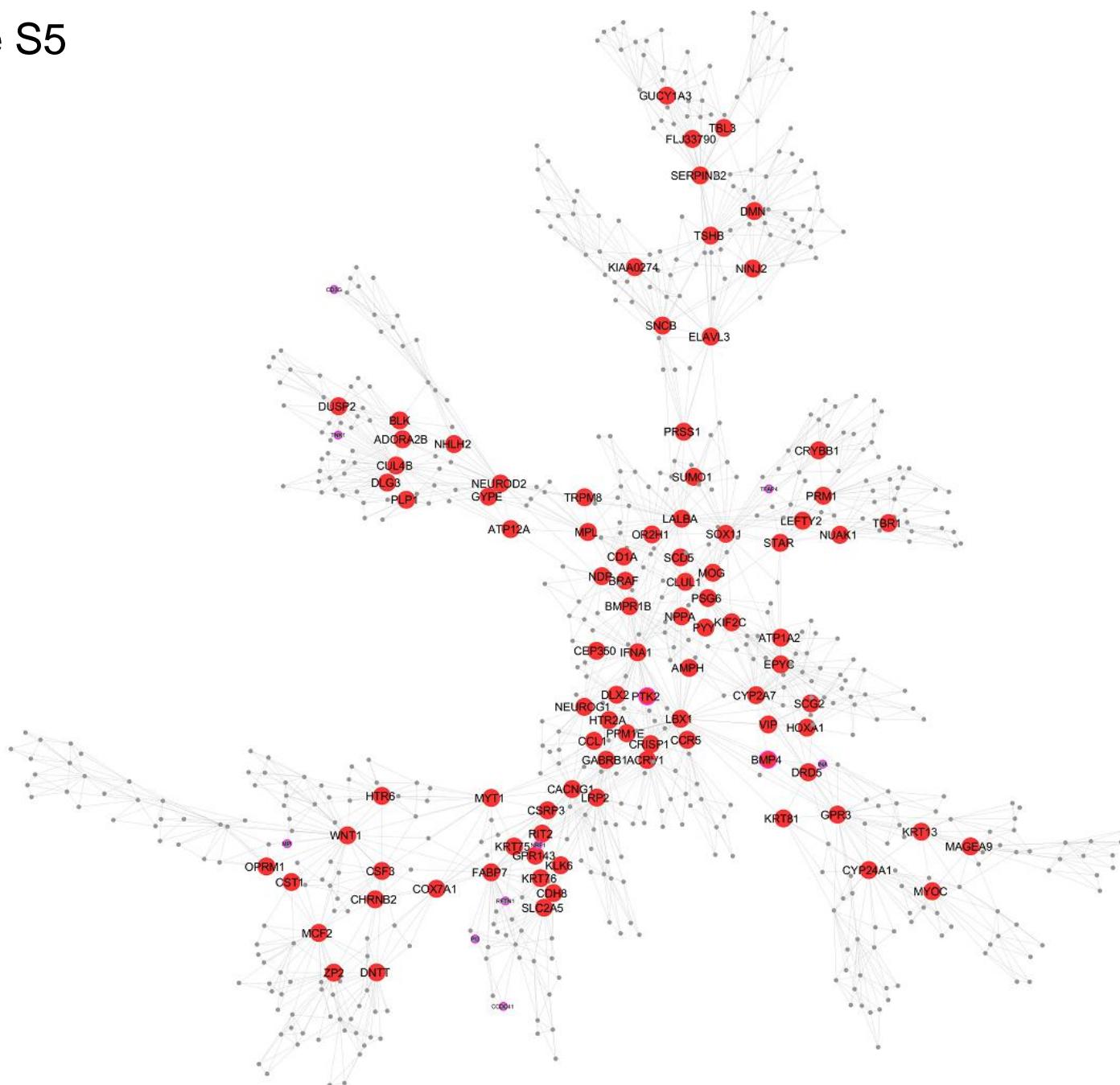


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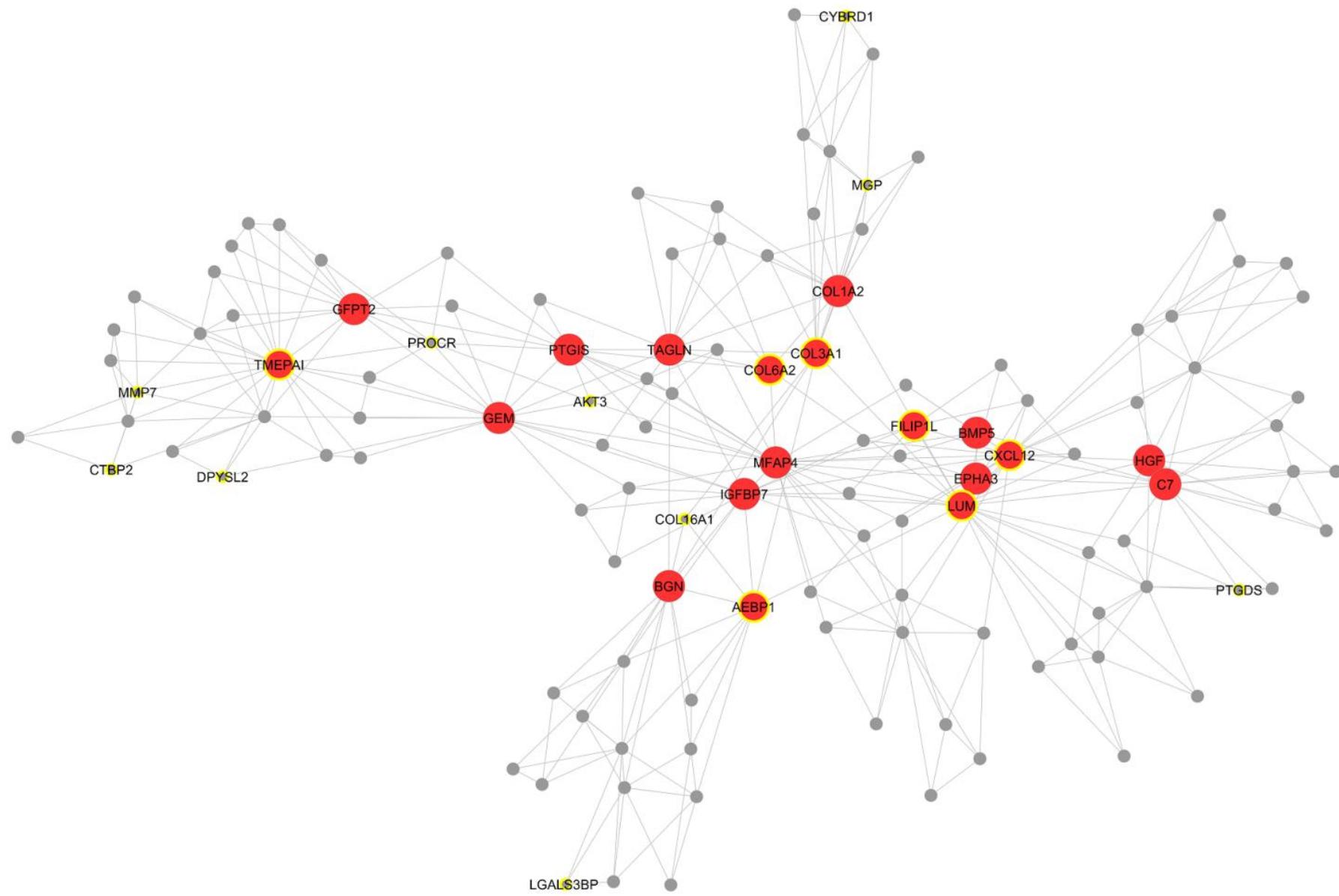


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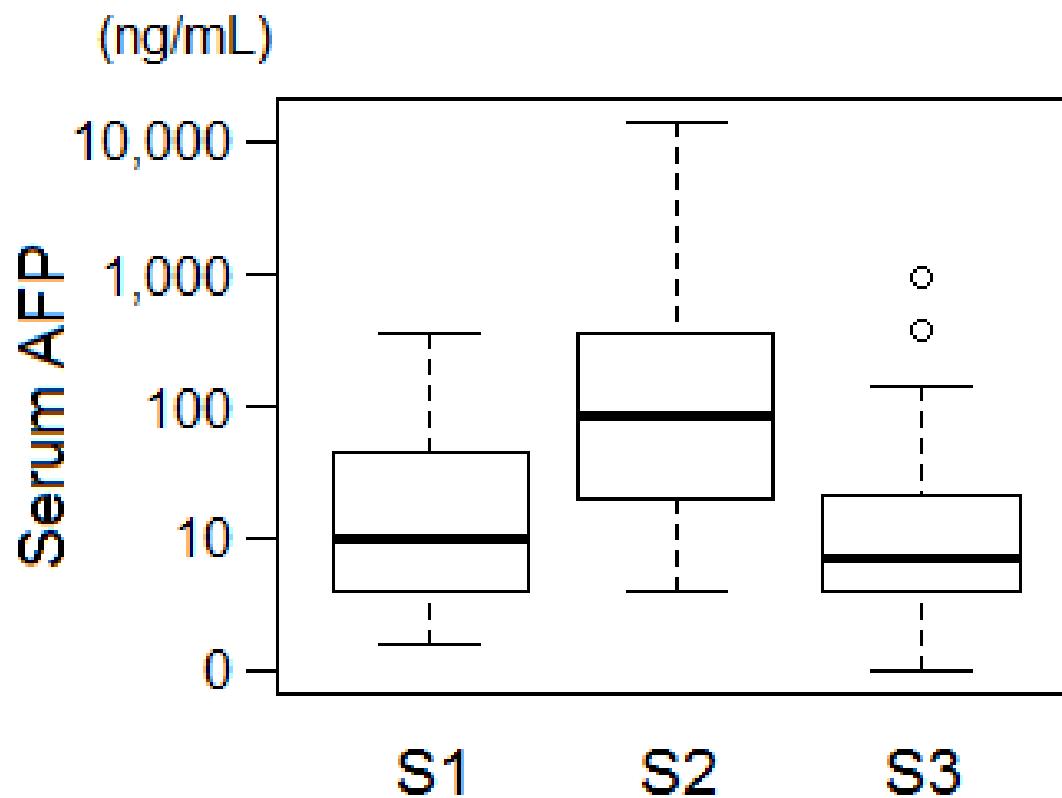


Figure S8A

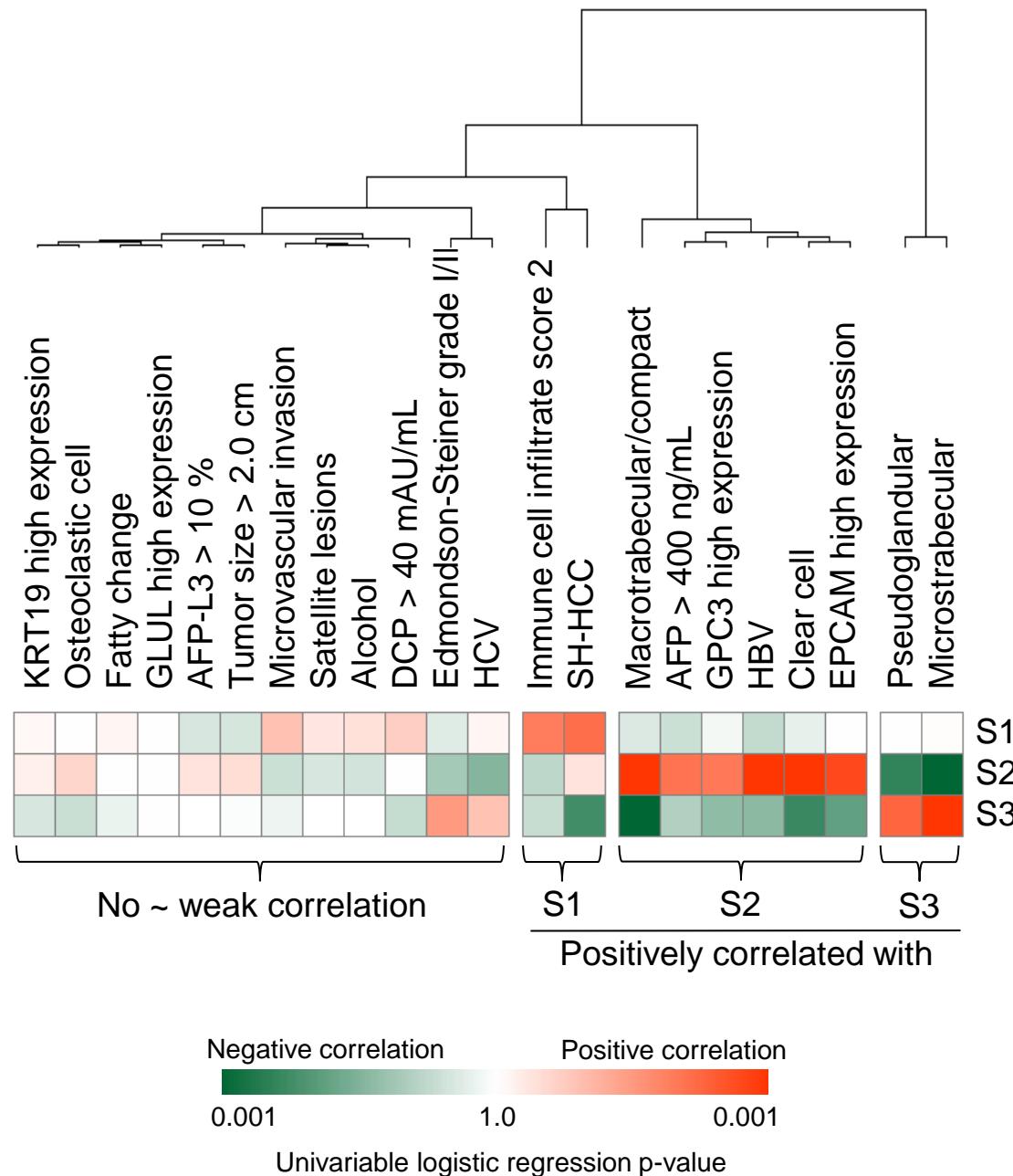


Figure S8B

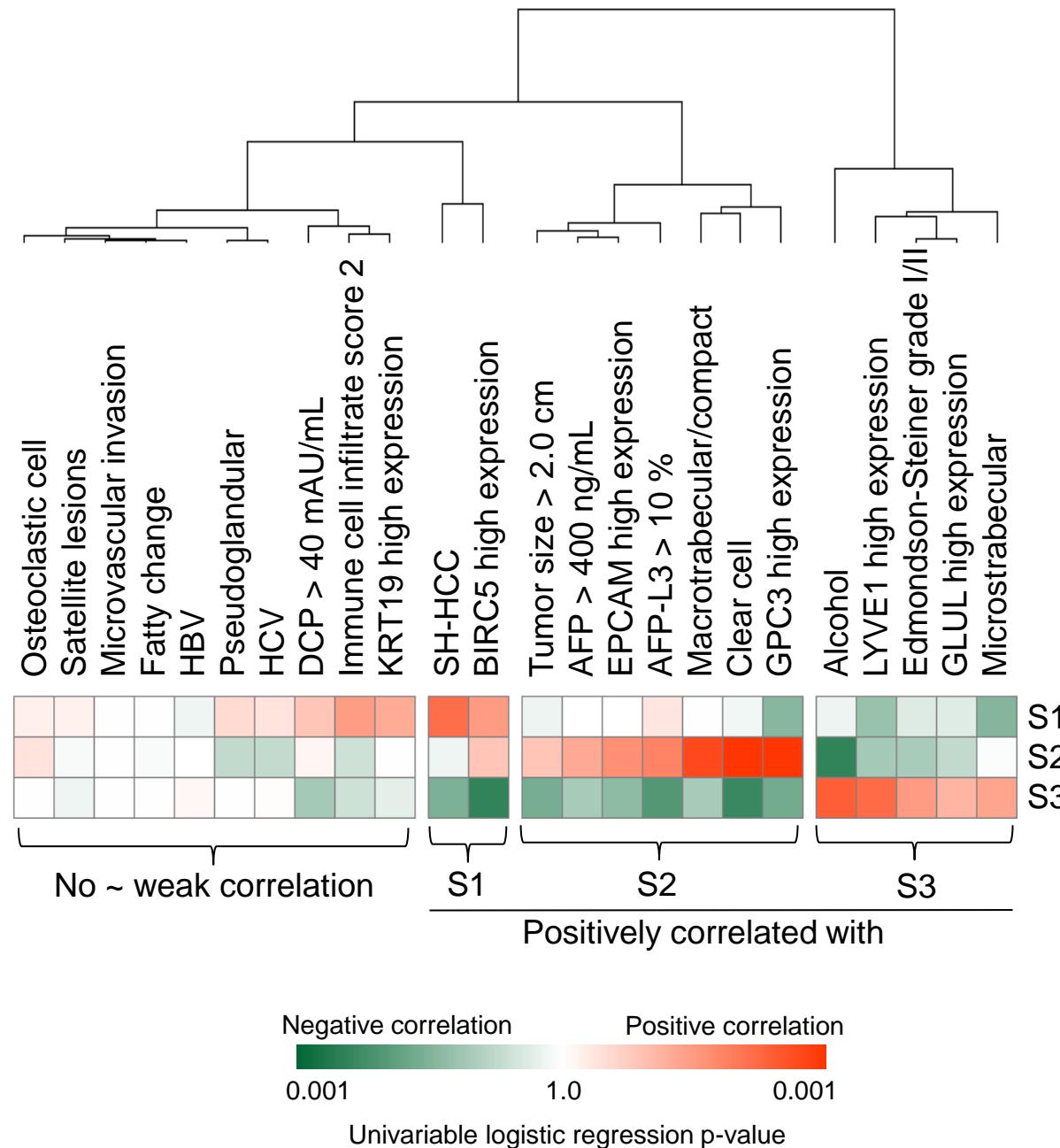
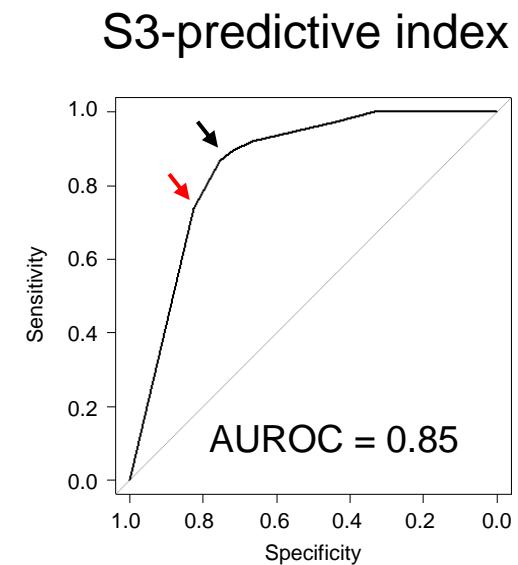
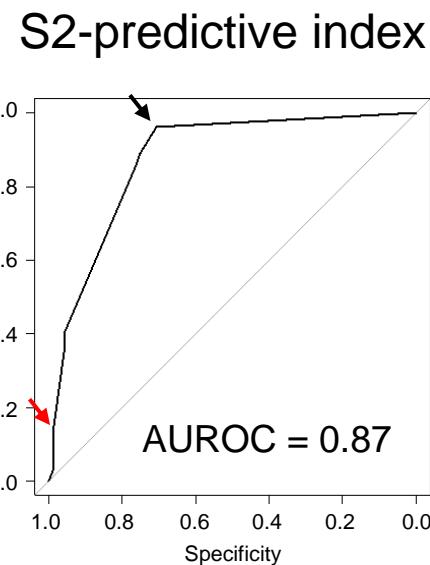
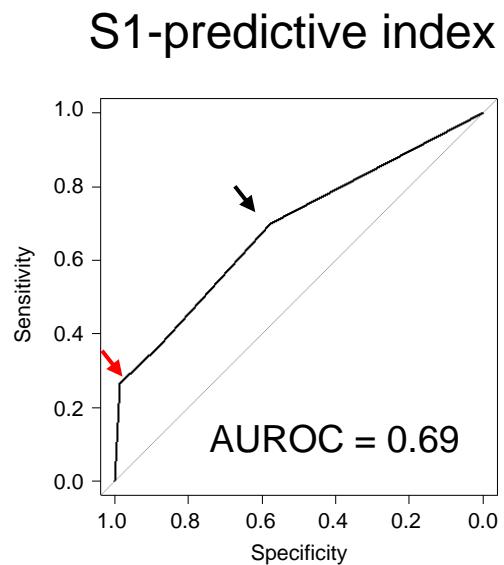


Figure S9

Training set



Validation set

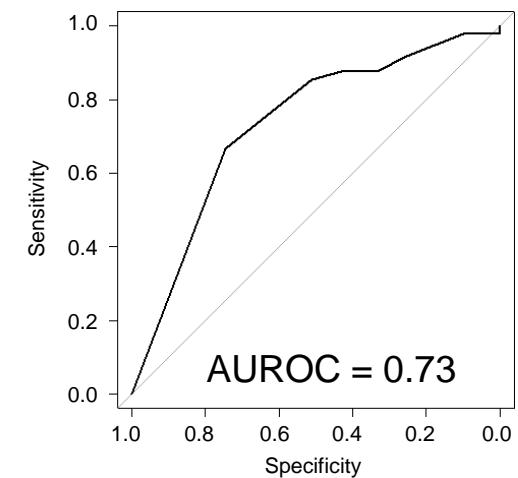
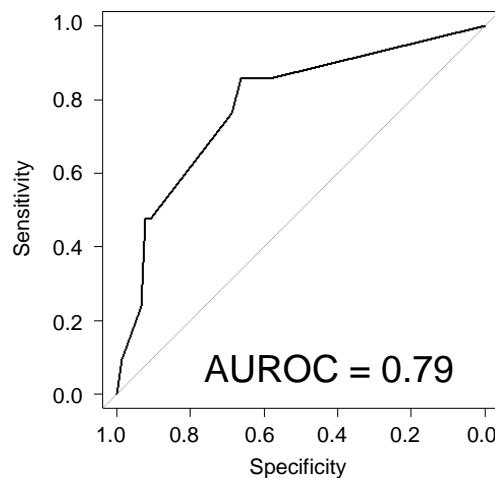
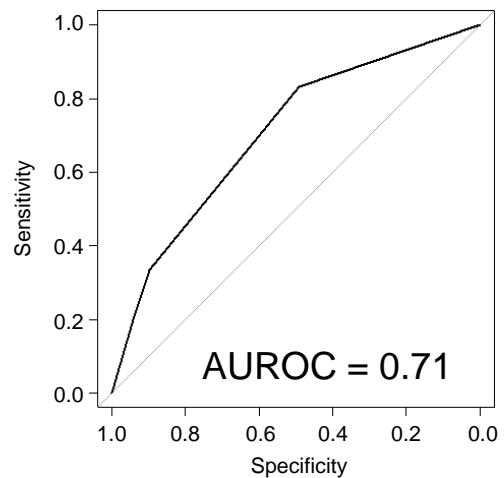


Figure S10

