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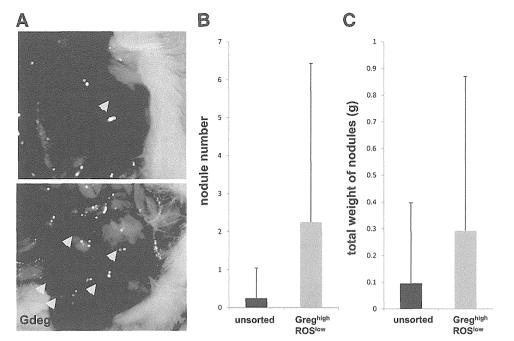


Fig. 4. (A) Macroscopic appearance of peritoneal metastases on day 28 after intraperitoneal injection of  $10^5$  HCC cells (Upper, unsorted HuH7 cells; Lower, GdeghighROSlow HuH7 cells). The capacity of Gdeg<sup>high</sup>ROS<sup>low</sup> HCC cells to establish peritoneal metastases was assessed by (B) counting the number of nodules, and (C) evaluating tumor weight in the mesentery and peritoneal walls compared to the unsorted cells. Four mice were used in each group. Each value represents the mean  $\pm$  95% CI.

 $n=4;\ Fig.\ 4B)$  and number (average number of dissemination nodules:  $Gdeg^{high}ROS^{low}\ HCC$  cells versus unsorted HCC cells, difference = 2.00, 95% CI = -1.28 to 5.28, P = 0.1857, n = 4; Fig. 4C) of the GdeghighROSlow HCC cells group were higher than those in the unsorted group. Immunofluorescent analysis revealed that murine macrophages had infiltrated around the Gdeghigh HCC cells located at the metastatic tumor margins, indicative of the ability of these cells to recruit macrophages in vivo (Fig. 5).

Clinical Implication of the Gene Signature Up-Regulated in HCC CSCs. The clinical implication of the HCC CSC gene signature was retrospectively assessed using liver tissues from patients who received curative resection of HCC. CSC-gene signatures were generated as 43 probe sets using the gene expression profiles up-regulated in GdeghighROSlow HCC cells (Supporting Table 4) and revealed a significant correlation between the noncancerous liver gene expressions and the CSC-gene signatures (P = 0.004 and FDR = 0.005; Fig. 6A). CSC-gene signatures were then evaluated with regard to patient outcomes. Patients were divided into three subtypes; high, moderate, and low expression groups, on the basis of expression profiles of the 43 CSC-related probe sets (Fig. 6B). These three groups showed significant differences in recurrence-free survival rates (P = 0.002 by log-rank test; Fig. 6C). High expression was significantly associated with diminished liver function (low albumin and high bilirubin) and tumor number (Supporting Fig. 5). Expression of CSC markers (CD133, EpCAM, CD44, and CD90)<sup>5-8</sup> and biliary/progenitor cell markers (cytokeratin 7 and cytokeratin 19)28 was also up-regulated in the high expression group (Supporting Fig. 6).

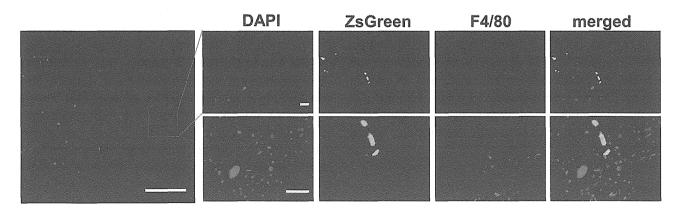


Fig. 5. Immunofluorescence of metastatic tumor sections labeled with antimouse F4/80 (bars, 1,000  $\mu$ m (white) and 100  $\mu$ m (yellow)); murine macrophages infiltrated around the Gdeghigh HuH7 cells located at the margins of the metastatic tumors.

226 MURAMATSU ET AL. HEPATOLOGY, July 2013

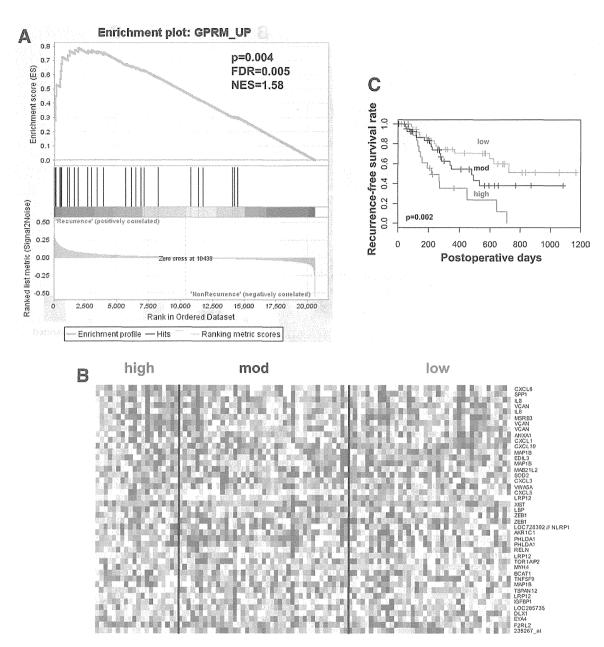


Fig. 6. (A) GSEA evaluation of the adjacent nontumor tissues; a positive correlation was observed between the gene set of  $Gdeg^{high}ROS^{low}$  HCC gene signature and noncancerous liver gene expression (P < 0.004; FDR = 0.005; NES = 1.58). (B) Patients were divided into three subtypes based on the expression profiles of 43 up-regulated probe sets of  $Gdeg^{high}ROS^{low}$  HCC. (C) A significant correlation was observed between the  $Gdeg^{high}ROS^{low}$  HCC gene signature and the recurrence-free survival rates of the patients after curative resection of HCC (P = 0.002).

Recently, leukemia CSC-specific gene signatures were revealed as highly independent predictors of patient survival.<sup>29</sup> This gene signature analysis demonstrates the clinical significance of identifying CSC populations in HCC using the stem-cell monitoring system described here.

### Discussion

The monitoring system of stemness proposed here visualized two stem cell features, low proteasome activ-

ity and low ROS levels, in human HCC. Monitoring HCC proteasome activity revealed that human HCC cells contain a small population of cells that undergo asymmetric division, exhibiting the multipotency and self-renewal of CSCs (Fig. 1B).<sup>20</sup> Next, we showed that CoCl<sub>2</sub>, an agent mimicking the activation of HIF,<sup>24</sup> increased the proportion of Gdeg high HCC cells, indicative of low proteasome activity, while echinomycin, a molecule that inhibits HIF-1 DNA binding activity, blocked this effect (Fig. 1C). Recently, echinomycin was also reported to eradicate serially

transplantable human AML in xenogeneic models by preferential elimination of CSCs. 25 Similar to CoCl<sub>2</sub> treatment, hypoxic conditions also increased the proportion of Gdeghigh HCC cells (Fig. 1D), consistent with a previous report indicating that hypoxia serves as a stimulus to reprogram cells towards normal stem cells<sup>22</sup> and CSCs.<sup>23</sup> Additionally, HCC cells had an ROS concentration lower than that of unsorted HCC cells, including a subpopulation of Gdeghigh HCC cells (Gdeghigh ROSlow), in agreement with a previous report showing that normal stem cells and CSCs contain a lower concentration of ROS than their more mature progeny.14 Importantly, xenotransplantation experiments revealed that cells with increased tumorigenicity were significantly concentrated in the subpopulation of Gdeghigh ROSlow HCC cells.

An HCC stem cell-specific signature (Supporting Table 4) was identified by genome-wide expression analysis, and GSEA based on the Reactome data base<sup>27</sup> showed that our HCC stem cell system significantly correlated with the chemokine network (Fig. 3A,B; Supporting Table 3). Inflammatory mediators and cells are indispensable components of tumor-host interactions, 30 and studies have shown that cancer cellsecreted factors generate an inflammatory niche hospitable for progression and metastasis of cancer. 31,32 More recent studies have shown that glioma-initiating cells produced inflammatory mediators such as chemokines that induce tumor-associated macrophages to organize the glioma-initiating cells niche. 33 Macrophages are an important component of the tumor-host interaction that controls the survival, migration, and growth of metastatic cells.<sup>34</sup> Our data showed that Gdeghigh ROSlow HCC cells induced macrophage chemotaxis more effectively than their counterparts (Fig. 3E). Furthermore, these cells had a higher capacity for dissemination in an in vivo peritoneal metastasis model (Fig. 4B,C). We also found macrophage infiltration around the CSCs located at the margin of the dissemination tumor (Fig. 5), indicative of the ability of HCC CSCs to recruit macrophages in vivo.

Recent studies on murine breast CSCs have revealed that the tumor-host interaction plays a critical role in metastatic colonization of cancer cells.<sup>35</sup> It is noteworthy that the tumor-host interaction mediated by HCC CSCs is potentially associated with metastatic initiation in our study. The host gene expression signature of the noncancerous microenvironment is closely associated with prediction of HCC recurrence<sup>36</sup> and lung adenocarcinoma.<sup>37</sup> As a result, the gene expression signature of our HCC stem cells (Supporting Table 4) significantly correlates with the disease-free survival

rate after radical surgery and early recurrence (Fig. 6A). These findings strongly suggest that our HCC stem cell monitoring system is useful in predicting clinical prognosis, and the validity of this system was further confirmed (Fig. 6C).

Our HCC CSCs system, which monitors two stem cell features, is a promising tool to extract and identify CSCs in live bodies and histological specimens. This system demonstrated the presence of a small cell population with an increased capacity to generate dissemination *in vivo*. Clinically, the gene signature specifically expressed in our HCC stem cells significantly correlated with HCC recurrence after radical resection. Taken together, these findings suggest that this stem cell monitoring system could illuminate the *in vivo* significance of CSC-host interactions and microenvironments and improve therapeutic approaches for metastasis and recurrence of aggressive cancers.

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228 MURAMATSU ET AL. HEPATOLOGY, July 2013

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# The Tumor-Suppressive *miR-497-195* Cluster Targets Multiple Cell-Cycle Regulators in Hepatocellular Carcinoma

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### Abstract

MicroRNAs (miRNAs) are key post-transcriptional regulators of gene expression and commonly deregulated in carcinogenesis. To explore functionally crucial tumor-suppressive (TS)-miRNAs in hepatocellular carcinoma (HCC), we performed integrative function- and expression-based screenings of TS-miRNAs in six HCC cell lines. The screenings identified seven miRNAs, which showed growth-suppressive activities through the overexpression of each miRNA and were endogenously downregulated in HCC cell lines. Further expression analyses using a large panel of HCC cell lines and primary tumors demonstrated four miRNAs, miR-101, -195, -378 and -497, as candidate TS-miRNAs frequently silenced in HCCs. Among them, two clustered miRNAs miR-195 and miR-497 showed significant growth-suppressive activity with induction of G1 arrest. Comprehensive exploration of their targets using Argonute2-immunoprecipitation-deep-sequencing (Ago2-IP-seq) and genome-wide expression profiling after their overexpression followed by pathway analysis, revealed a significant enrichment of cell cycle regulators. Among the candidates, we successfully identified CCNE1, CDC25A, CCND3, CDK4, and BTRC as direct targets for miR-497 and miR-195. Moreover, target genes frequently upregulated in HCC in a tumor-specific manner, such as CDK6, CCNE1, CDC25A and CDK4, showed an inverse correlation in the expression of miR-195 and miR-497, and their targets. These results suggest the molecular pathway regulating cell cycle progression to be integrally altered by downregulation of miR-195 and miR-497 expression, leading to the aberrant cell proliferation in hepatocarcinogenesis.

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### Introduction

HCC, the most common primary liver cancer, is an extremely lethal disease, which causes about 700,000 deaths worldwide annually [1]. As proposed by Vogelstein and Kinzler [2] in overall cancer, hepatocarcinogenesis is a DNA disease due to the accumulation of altered genes that control the cell cycle and cell proliferation, and a large number of genetic and epigenetic alterations accumulate during this process. Since master regulators of the cell cycle are also indispensable for normal cells, current anti-cancer therapeutic strategies have shifted to the search for one single dominant oncogene or addictive molecule that only tumors rely on, and proposed as a concept for oncogene addiction [3–6]. However, successful translation of the oncogene addiction model into the rational and effective design of targeted therapeutics

against individual oncoproteins still faces major obstacles, mainly due to the emergence of escape mechanisms, drug resistance and basically tumor-individuality arising from "off-label patients" as termed by Torti and Trusolino [7]. Recently, an increasing number of reports have described a new class of small regulatory RNA molecules termed microRNAs (miRNAs) implicated in hepatocarcinogenesis, and seems to open the possibility of raising new therapeutics mimicking endogenous miRNA machineries [8].

miRNAs are endogenous small non-coding RNAs which act as negative regulators for mRNA expression via sequence-complementary targeting of the 3' untranslated region (3'UTR) to repress translation or mediate mRNA degradation [9]. Due to their abundance and divergence of targeting specificity, it is believed that one single miRNA can interact with multiple mRNA targets [10] to achieve regulatory control over virtually every biological

process [11]. Although hundreds of miRNAs are known to have deregulated expression in cancer with accumulating evidence demonstrating that miRNAs have oncogenic or tumor-suppressive (TS) functions [12], molecular pathway underlying these miRNAs are poorly understood. Therefore, identifying the cluster of target genes for a cancer-related miRNA is essential to provide them as a promising therapeutic agent.

In the study presented here, we first explored the promising TS-miRNAs for HCC by screenings based on their expression status and growth-suppressive activity in HCC cells. We also tested an integrative approach to identify a set of target genes for these TS-miRNAs that explain the whole picture of their function in HCCs.

#### Results

### A combination of function- and Expression-based Screenings Identified Putative TS-miRNAs in HCC Cells

To identify TS-miRNAs, we first performed an integrative approach using function- and expression-based screenings in six HCC cell lines (Hep G2, Hep 3B, HLE, Huh7, JHH-4, and sK-Hep-1). We focused on miRNAs, which showed remarkable inhibition of cell proliferation *in vitro* together with significant downregulation in HCC cell lines compared with normal liver tissues (Fig. 1A), as candidate TS-miRNAs for HCC.

In the function-based screening in six HCC cell lines using a synthetic miRNA mimic library containing 470 pre-miRNAs, 113 miRNAs demonstrated remarkable inhibitory effects on cell growth in more than 3 of 6 cell lines (relative growth ratio <0.8 compared with control non-specific miRNA; Fig. 1B, and Dataset S1).

In the expression-based screening in the same six cell lines and normal liver tissues (C20, C40) using a miRNA microarray containing 866 human miRNAs, 265 miRNAs were able to be quantified at least in one cell line. Among them, 194, 194, 77, 190, 199, and 168 miRNAs were downregulated (>2-fold decrease) in the Hep G2, Hep 3B, HLE, Huh7, JHH-4, and sK-Hep-1 cell lines, respectively, compared with C20 and C40, and 45 miRNAs were commonly downregulated in all these six cell lines (>2-fold decrease; Fig. 1C, and Dataset S2).

By combining results of the two screenings, we identified seven miRNAs, *i.e.* miR-101, -126, -15a, -192, -195, -378 and -497, as candidate TS-miRNAs for HCC (Fig. 1A and 1D). Among them, miR-101 and miR-195 had already been reported as possible TS-miRNAs for HCC [13,14], suggesting that the approach employed in this study could successfully identify TS-miRNAs in HCC cells.

### miR-195 and miR-497 Emerged as Possible TS-miRNAs

In order to narrow down those seven candidates by frequency of their downregulation in HCC cells, we next performed expression analyses in a panel of 19 HCC cell lines (Fig. S1A) and a panel of paired tumorous and non-tumorous tissues from 18 primary HCC cases (Fig. S1B). miR-15a was excluded due to a low frequency of downregulation in a panel of HCC cell lines (42.1%) and primary cases (16.7%, Fig. 1D). miR-126 and miR-192 were also excluded due to a low frequency of tumor-specific down-regulation in a panel of primary HCC cases (27.8% and 44.4%, respectively; Fig. 1D). Finally, four miRNAs, miR-101, miR-195, miR-378, and miR-497, were selected as the most promising candidates for TSmiRNA for HCC showing frequent (>50%) tumor-specific downregulation both in HCC cell lines and primary HCC cases (Fig. 1D). Among them, miR-101 was excluded from further analysis because of its well-known function as a TS-miRNA in HCC [13]. Notably, miR-378 had been reported as an oncomiR in various types of cancers [15,16], while showing TS function in our screening performed in HCC. In addition, miR-378 was also reported to be downregulated during liver regeneration after partial hepatectomy in mice with a delay in cell cycle progression involving the G1 to S phase transition [17], suggesting miR-378 to have cell growth suppressive activity in liver and supporting our findings in HCCs. These inconsistent findings indicate that miR-378 may have multiple functions in a tissue- or lineage-specific manner. Since we focused on miRNAs showing direct inhibition of HCC cell growth in this screening, we excluded miR-378 from further analysis. Among the 4 candidates, miR-497 and miR-195 belong to the same miRNA family and are also located very close together: pre-miR-195 is 209 bp downstream from the 3' end of pre-miR-497 at 17p13.1, and is frequently deleted in human cancers [18,19]. We focused on these two miRNAs for further analysis, because (a) reported evidence and evolutional conservation suggest that the clustered miRNAs may have related physiological and pathophysiological functions including carcinogenesis [20–22], and (b) miR-497 is poorly characterized in human cancer, especially in HCC, indeed, few target molecules for those two miRNAs are known, although several reports have suggested miR-195 to be a possible TS-miRNA for various human cancers including HCC [14,23-25].

### Mechanisms Underlying Deregulation of *miR-195* and *miR-497* Expression in HCC

Computational analysis using a data set of miRNA expression profiles in 89 primary HCV-related HCCs obtained from the database of the Broad Institute (GSE20596) revealed a significantly positive correlation between expression levels of mature forms of miR-195 and miR-497 (Fig. S2A, left panel). In addition, the expression status of miR-195 and miR-497 seemed to be correlated regardless of their viral infection status not only in tumor samples but also in non-tumorous liver tissues, when we recalculated the data used in Fig. S1B (Fig. S2A right panel), although the number of samples are too small for statistical analysis. These results suggesting those miRNAs to be transcribed concomitantly as a single primary transcript and expressed as a cluster not only in HCCs but also in non-tumorous liver tissues. Indeed, this hypothesis is supported by the existence of the transcript NR\_038310.1, mir-497-195 cluster host gene (non-protein coding) (MIR497HG), and non-coding RNA in the NCBI reference sequence (http://www.ncbi.nlm.nih.gov/nuccore/  $NR_038310$ ?report = GenBank).

We first examined copy-number aberrations around miR-195 and miR-497 in 18 HCC cell lines by q-gPCR, and found that only 3 of them (HLE, JHH-6, PLC/PRF/5) have a copy number loss at this locus in spite of frequent downregulation of those miRNAs in a number of HCC cell lines (Fig. S2B). Since the biogenesis of miRNAs has been reported to be altered in cancer cells [26], we tried to test the possibility that the down-regulation of those miRNAs were caused by abnormal miRNA biogenesis. Since downregulation of miR-195 and miR-497 was also observed in pri-miRNA level, those miRNAs seem to be downregulated at a transcriptional level rather than a post-transcriptional level (Fig. S2C). To assess other factors contributing to the downregulation of miR-195 and miR-497, we next searched for a regulatory element for the putative polycistronic primary transcript, pri-miR-497-195. The putative transcriptional start site (TSS) was detected 1.6 kb upstream of pre-miR-497 by SwitchGear Genomics Transcription Start Sites (CHR17\_M0118\_R1) and ENCODE Transcription Factor ChIP-seq (TAF1) binding site (UCSC Genome Bioinfomatics, Feb. 2009 [GRCh37/hg19] assembly; http://genome. ucsc.edu/cgi-bin/hgGateway) (Fig. S3A). Promoter activities around the TSS were confirmed in three HCC cell lines, Hep

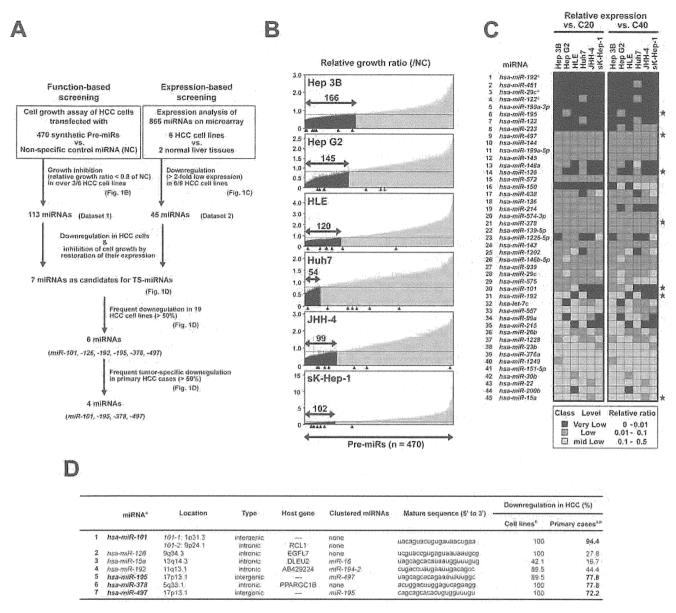


Figure 1. An integrative approach to the identification of TS-miRNAs using function- and expression-based screening in HCC cell lines. A, Strategy for the identification of TS- miRNAs by function- and expression-based screening in 6 HCC cell lines. B, Results of function-based screening in 6 HCC cell lines. The numbers of viable cells 4–5 days after transfection with 5 nM of 470 dsRNAs mimicking mature miRNAs loaded on Pre-miR<sup>TM</sup> miRNA Precursor Library-Human V3 (Ambion) or control non-specific dsRNA were evaluated by the WST-8 assay in duplicate. Relative *in vitro* cell growth ratios in these cell lines were calculated by normalization of each result to the cell numbers in control cells transfected with non-specific miRNA (see Dataset S1). The lower solid arrow indicates the 470 miRNAs examined. Closed arrows in each graph indicate candidate miRNAs with marked growth inhibitory effects (growth ratio <0.8) compared with the control counterpart in our function-based screening. The arrowhead indicates the results for seven candidate miRNAs conclusively selected in the function- and expression-based screening (see Fig. 1D). C, Summary of expression profiles of 45 candidate miRNAs, expression levels of which were downregulated (>2-fold) in all 6 cell lines as compared with those of two normal liver tissues (C20 and C40, see Dataset S2). Stars indicate the results of the same seven candidate miRNAs as in Fig. 1B. D, Seven candidates for tumor-suppressive miRNAs involved in HCC pathogenesis identified through function- and expression-based screening approach. MiRNAs frequently downregulated (>50%) in tumors compared with their paired non-tumorous liver tissues in clinical HCC cases are in bold face (a). Expression level of mature form for each miRNA was evaluated inTaqMan® MicroRNA Assays (Applied Biosystems) as described in Materials and Methods (b). doi:10.1371/journal.pone.0060155.g001

G2, sK-Hep-1 and HuH-6, regardless of the expression status of *miR-195* and *miR-497* (Fig. S3B). Although Suzuki et al. [27] reported that *miR-497* and *miR-195* are possibly regulated by non-CpG island methylation in colorectal cancer based on data from a genome-wide combined analysis of mRNA expression, chromatin signature, and DNA methylation, only minimal restoration was observed in the expression of those miRNAs after treatment with

5-aza-dCyd in HCC cell lines (Fig. S3C) and almost no difference in DNA methylation pattern around the TSS of pri-*miR-497-195* was observed among HCC lines regardless of their expression status (Fig. S3D). Moreover, the inhibition of the class I and II histone deacetylase (HDAC) families with Tricostatin A (TSA) did not induce restoration of *miR-195* nor *miR-497* in most of cell lines, suggesting that these HDACs do not strongly contribute to the

-323 -

decreased expression of those miRNAs in HCC cells (Fig. S3C). In addition, ChIP analyses around TSS for H3K4me3 and H3K27me3, which are histone modification patterns activating and inactivating gene expression, revealed that the promoter region of pri-miR-497-195 showed no significant repressive pattern in the H3K27me3 modification, but a clear inactive pattern in the H3K4me3 modification in non-expressing HCC cells compared with miR-195-expressing HuH-6 cells (Fig. S3E). Taken together, frequent downregulation of miR-497 and miR-195 expression occurred not mainly by genomic loss, DNA hypermethylation or altered miRNA biogenesis, but at least partly through repressive histone modifications in the HCC cell lines examined, although HDAC inhibitor had little or no effect on the expression and the epigenetic factors contributing to the downregulation remain to be clarified.

### Restoration of *miR-195* or *miR-497* Suppresses Cell Proliferation and Cell Cycle Progression *in vitro*

Growth suppressive activities of double stranded RNAs (dsRNAs) mimicking miR-195 and miR-497 in HCC cell lines (Fig. 1B and Dataset S1) were validated by transfection of synthetic dsRNAs mimicking miR-195 and miR-497 and control non-specific miRNA purchased from a different company (Fig. 2A), excluding the off-target effects of synthetic dsRNAs. A similar growth suppression pattern for miR-195 and miR-497 was observed in 3 of 6 cell lines (Hep 3B, Hep G2 and JHH-4) by ectopic overexpression of those miRNAs, whereas comparatively weak growth suppression was observed after restoration of miR-497 compared with miR-195 in the remaining 3 cell lines (HLE, Huh7 and sK-Hep-1).

We next determined modes of action on the cell cycle by FACS analysis in several HCC cell lines (Fig. 2B). The accumulation in G0/G1 phase was significant in all cell lines transfected with *miR-195*, while the effect was slightly weak in HLE and sK-Hep-1 cells transfected with *miR-497* compared with *miR-195*. These findings were consistent with results of the cell growth assays *in vitro* (Fig. 2A). Although a small increase in cells in the sub-G1 fraction was observed in Hep 3B, no remarkable change in the number of cells was observed 48 hours after transfection (Fig. 2A), indicating G1 arrest to be predominant for the cell growth-suppressive effect of *miR-195* and *miR-497* in HCC cells. Taken together, *miR-195* and *miR-497* are likely to inhibit cell growth mainly by suppressing cell cycle progression, especially in the G1 to S phase.

### Identification of the Most Significant Biological Activities Regulated by *miR-195/miR-497* using GO *in silico*

For exploration of signaling pathways downstream of miR-195 and miR-497, we performed a genome-wide mRNA expression analysis of Hep G2 and sK-Hep-1 cells 48 hours after transfection with miR-195, miR-497, or control dsRNA. Among significantly altered GO terms (correlated p-value < 0.05) in biological processes and functions selected from genes showing 2-fold changes between miR-195 or miR-497 transfectants and their counterparts with a false discovery value (q) < 0.001 (Table S1–1 to S1–4), GO terms involved in the cell cycle most frequently appeared in all conditions. This result is consistent with the inhibitory effect of miR-195 and miR-497 on cell cycle (Fig. 2B), suggesting molecules contributing to cell cycle regulation to be major targets for miR-195 and miR-497.

## Identification of Possible *miR-195* and/or *miR-497* Targets by Ago2-IP-deep Sequencing, Expression Analyses, and Bioinformatics Analyses

To determine direct targets for miR-195 and/or miR-497 responsible for hepatocaricinogenesis, we performed RNA coimmunoprecipitation with anti-Ago2 antibody (Ago2-IP) for trapping overexpressed miRNA incorporated into the RNA-induced silencing complex (RISC) together with their target mRNAs in Hep G2 cells transfected with miR-195 or miR-497. Profiling of miRNAs obtained from the Ago2-IP fraction by miRNA microarray analysis showed a significantly increased rate of each transfected miRNA compared with most other endogenous miRNAs in Hep G2 cells (Fig. S4), indicating transfected miRNAs to be incorporated successfully and specifically into RISC. However, miRNAs other than miR-195 or -497 also showed increased rates, suggesting that mRNAs trapped by RISC include targets for non-specific miRNAs as false-positives. In this condition, we performed RNA sequencing using Ago2-IP RNAs (Ago2-IP-seq) along with total RNAs (mRNA-seq) from the same samples in miR-195-, miR-497-, or non-transfected Hep G2 cells, and calculated the abundance of each mRNA in the Ago2 binding fractions compared with total RNA fractions (Ago2-IP-seq/ mRNA-seq of each RPKM value) in each sample (abundant-Ago2 fraction). Finally, we obtained the fold enrichment score by calculating the ratio of abundant-Ago2 fractions between miR-195or miR-497-transfected samples and non-transfected samples.

In GSEA, genes selected as top 10% candidates by Ago2-IP in miR-195 transfected cells were significantly enriched in genes downregulated by miR-195 transfection, whereas those in miR-497-transfected cells were not significant (p<0.001 and = 0.0709607, FDR<0.001 and = 0.041126948, and normalized enrichment score = -1.7712895 and 1.1393404 for miR-195 and miR-497, respectively; Fig. S4B). Through excluding genes without a target sequence of miR-195 and miR-497 in their 3'UTR, enrichment scores in GSEA were dramatically improved (p<0.001 and <0.001, FDR<0.001 and <0.001, and normalized enrichment score = -2.5568738 and -1.7213858 for miR-195 and miR-497, respectively; Fig. S4C).

Since the total numbers of true targets for *miR-195* and *miR-497* in Hep G2 cells are unclear, genes enriched in Ago2IP-deep sequencing with the target sequence were cut off by the most efficient rates with maximum enrichment scores in GSEA. The highest enrichment scores were detected when genes were cut off by top 8% (577 genes) or 36% (2,010 genes) for candidates of *miR-195* or *miR-497* targets, respectively (*p*<0.001 and <0.001, FDR<0.001 and <0.001, and normalized enrichment score = 2.5925288 and -1.9934999 for *miR-195* and *miR-497*, respectively; Fig. 3A and Fig. S4D). The top 20 candidate targets enriched in the Ago2-IP fraction of *miR-195* or *miR-497* combined with target predictions are listed in Table S2.

In order to narrow down promising targets of miR-195 and miR-497, we focused on 190 of 577 and 290 of 2,010 genes remarkably downregulated (>2-fold change) by miR-195 and miR-497 transfection in Hep G2 cells (Fig. 3B), respectively, and carried out a pathway analysis. All of those genes were mapped to genetic networks describing functional relationships among gene products based on known interactions as defined by the IPA tool. Consistent with our findings showing that miR-195 and miR-497 induced G1 arrest in HCC cells, the IPA tool identified the canonical pathway "Cell Cycle: G1/S Checkpoint Regulation" as a significantly enriched pathway for possible target genes (p<0.001 and p=0.00287, respectively; Fig. 3C). Therefore, we focused on candidate genes involved in this pathway, such as BTRC, CCND3,

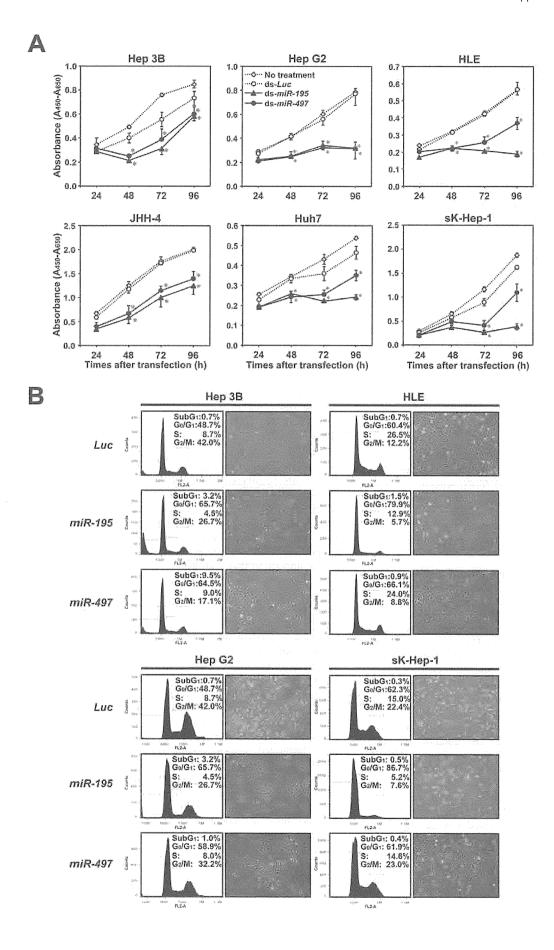


Figure 2. Growth suppressive effects of *miR-195* and *miR-497* on HCC cell lines lacking their expression. A, Growth curves of HCC cell lines after tansfection of 5nM of miCENTURY OX miNatural (Cosmo Bio) mimicking *miR-195* (black triangle) or *miR-497* (black circle), or control *Luc*, (white circle) assessed by WST-8 assay. Points, the mean of triplicate determinations in these experiments; bars, SD; Asterisks (\*), *P*<0.05 versus *Luc* transfected cells in a statistical analysis with the Mann-Whitney *U* test. **B**, Results for the population in each phase of the cell cycle assessed by FACS (*left*) and phase-contrast micrographs (*right*) using HCC cell lines 72 hours after transfection of miCENTURY OX miNatural mimicking *miR-195* (*middle*) or *miR-497* (*lower*), or control *Luc* (*upper*). doi:10.1371/journal.pone.0060155.g002

CCNE1, CDC25A, CDK4 and CDK6 as a target for miR-195 and miR-497, as functionally important direct targets in Hep G2 cells.

### Validation of Possible Direct-targets for *miR-195/miR-497* Contributing to Deregulation of Cell Cycle in HCC Cells

Since several cell cycle regulators, such as CCND1, CDK6 and E2F3, have been reported as direct targets of miR-195 in HCC [14], we included them as positive controls in our experiments to validate predicted targets. We first assessed the protein expression of predicted targets 48 hours after transfection with dsRNA mimicking miR-195 or miR-497 into Hep G2 and sK-Hep-1 cells (Fig. 3D). A reduction in CDK6 and E2F3 proteins was observed on transfection of each of those miRNAs in both cell lines, whereas no reduction in the CCND1 protein level was observed in Hep G2 cells. Protein levels of CCNE1, BTRC, CDC25A, CCND3 and CDK4 were reduced in both miR-195 and miR-497 transfectants compared with their control counterparts. To determine whether miR-195 and/or miR-497 directly inhibit the expression of those targets, we performed 3'UTR reporter assays using reporter constructs for each target mRNA containing putative binding sites for these miRNAs (Fig. 3E). Significant reductions in luciferase activity were observed in cells cotransfected with each reporter construct for all 8 genes in miR-195 or miR-497 transfectants compared with mock transfectants (Fig. 3E). Taken together, CCNE1, CDC25A, CCND3, CDK4 and BTRC seem to be novel direct targets in addition to three known targets for miR-195 and miR-497 in HCC cells (Fig. 4A).

### Significance of Identified *miR-195* and *miR-497* Target Genes in HCCs

We confirm the effect of novel target genes on cell growth by knocking down gene expression using specific small interfering RNAs (siRNA). The knock down efficiency of each gene was determined by Western blotting (Fig. S5). Decreased cell growth with G1 arrest was observed by downregulation of CCNE1, CDC25A, CCND3, CDK4 or BTRC in Hep G2 cells (Fig. 4B), suggesting these genes to be functional targets (Fig. 4A). To assess the consequence of miR-195/miR-497 and their target genes in HCC cases, we first analyzed the expression of those 8 targets genes in paired primary tissues of HCC used in Fig. 1D by qRT-PCR (Fig. 4B). Among them, only CCNE1, CDC25A and CDK4 showed >2-fold up regulation in over 50% of cases in tumorous compared with non-tumorous tissues. In addition, we also analyzed the correlation between each target gene and miR-195 or miR-497 expression using the data set of miRNA expression profiles in 89 primary HCV-related HCCs obtained from the database of the Broad Institute (GSE20596). Surprisingly, only the top-ranked 4 genes, CDK6, CCNE1, CDC25A and CDK4, frequently overexpressed in HCCs showed a slight significant inverse correlation with miR-195 and miR-497 expression (p<0.05, correlation coefficient = -0.257, -0.359, -0.315, and -0.355 for miR-195 and -0.309, -0.299, -0.245, and -0.292 for miR-497, respectively; Table S3). In conclusion, CCNE1, CDC25A, and CDK4 together with CDK6 seem to be the most important factors among 8 target genes because of their frequent tumor-specific upregulation in HCC together with significant inverse correlation

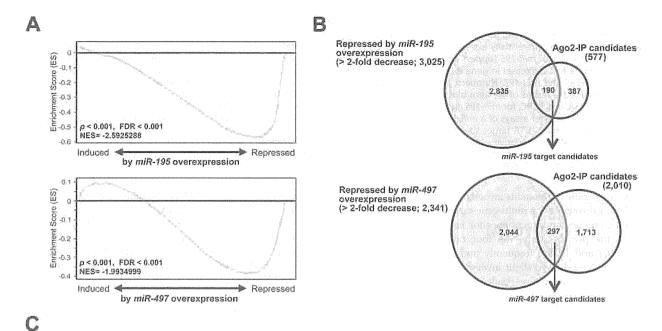
with miR-195 and miR-497 expression in primary HCCs relevant to cell cycle progression regulated by miR-195 and miR-497 in HCCs.

### Discussion

In this study, we used an integrative approach to explore TS-miRNAs contributing to hepatocarcinogenesis by combining function- and expression-based screenings in a genome-wide manner using HCC cell lines, followed by a expression analysis in panels of cell lines and clinical specimens of HCC. Among potentially promising TS-miRNA candidates, we focused on *miR-195* and *miR-497* clustered at 17p13.1. Experimental as well as *in silico* analyses revealed that those miRNAs induced G1 arrest in HCC cells through inhibition of multiple cell cycle regulators as direct targets. We also tested a method for comprehensive identification of miRNA targets by coimmunoprecipitation of mRNAs with miRNA-programmed Ago2-IP-seq, and identified a set of cell cycle regulators including novel targets for *miR-497* and *miR-195*.

Since miR-195 and miR-497 are clustered together and their targets largely overlap, these miRNAs seem to be simultaneously transcribed and jointly correlated to the same oncogenic pathways, such as cell cycle regulation in HCC, very efficiently. MiR-195 and miR-497 are members of the miR-15/107 group with the seed sequence AGCAGC, which is important determinant of target recognition [28]. Among members of the miR-15/107 group, Calin et al. [29] first made the connection between miR-15a-16 cluster located at 13q14, a region deleted in more than half of B cell chronic lymphocytic leukemias (B-CLL) and several solid tumors, and found that both genes are deleted or downregulated in the majority of CLL. In our screenings using HCC cell lines, miR-15a showed TS activity in 4 of 6 cell lines together with significant downregulation in all six cell lines, meeting the requirement for 1st candidate (Fig. 1A), while miR-16 showed infrequent TS activity and downregulation in HCC cell lines. In addition, miR-15a was excluded due to its infrequent tumorspecific downregulation. Among members of the miR-15/107 group, therefore, miR-195 and miR-497 contribute to the pathogenesis of HCC possibly though a tumor-specific dysregulation of expression caused by a tumor-specific histone modification pattern and/or unknown regulatory mechanisms as described in the Supplementary data (Fig. S2-S3).

Our integrated approach for the identification of *miR-195* and *miR-497* targets using Ago2-IP-seq combined with expression analysis revealed that their targets were significantly enriched in cell cycle regulators consistent with their strong activity on cell growth suppression after *miR-195* or *miR-497* overexpression in HCC cell lines. As explained by the concept that the effects of a single miRNA on a specific phenotype in cancer cells are not caused by its strong effect on single target genes but reflect the enrichment of its effects on the large number of target genes involved in a specific signaling pathway [30,31], only a weak correlation was observed between the expression of each target gene and that of *miR-195* or *miR-497* in the dataset analysis of HCC cases. However, *miR-195* and *miR-497*, can coordinately



Ingenuity Canonical Pathways p-value Number\* Ratio Genes<sup>c</sup> Candidates for miR-195 targets CCNE1, CCND3, CDK4, BTRC, CDC25A GCNE1, CCND3, CDK4, BTRC, CDC25A LYPLA2, PLA2G15, TMEM86B Cell Cycle: G1/S Checkpoint Regulation Cyclins and Cell Cycle Regulation 4 24F-05 0.082 2.20E-04 0.056 Phospholipid Degradation Aldosterone Signaling in Epithelial Cells Cell Cycle Regulation by BTG Family Proteins 1.87E-02 3 98 0.031 2.19E-02 42 170 0.024 HSPAB,ICMT,DNAJC5,SGK1 2.44F-02 36 0.056 CONF1.CDK4 Candidates for miR-497 targets Mitotic Roles of Polo-Like Kinase 4.78E-05 0.092 KIF23,WEE1, PPP2R1B, ANAPC13, CDC27, CDC25A Cyclins and Cell Cycle Regulation Cell Cycle: Gz/M DNA Damage Checkpoint Regulation 1.86E-04 644 89 0.067 CCNE1.WEE1,CDK6,BTRC,PPP2R1B,CDC25A MDM4,WEE1,BTRC,CHEK1 1.17E-03 49 0.082 Cell Cycle: G1/S Checkpoint Regulation PTEN Signaling 170 CONET COK6 BTRC CDC95A 2.87E-03 0.066 5.75E-03 5 0.040 CDC42,BMPR1A,TGFBR3,ITGA2,INSR

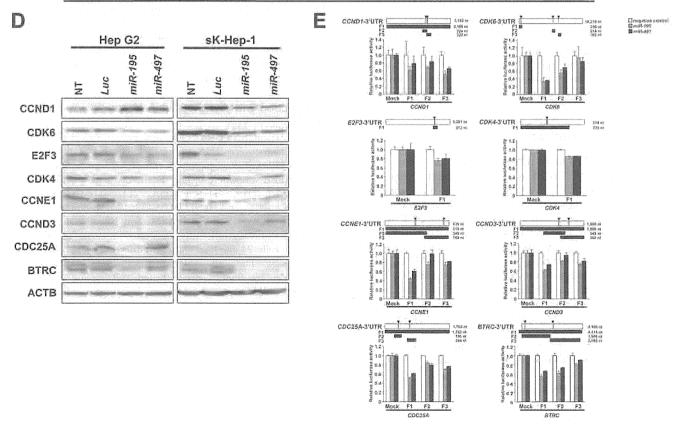


Figure 3. Exploration of possible direct *miR-195* and *miR-497* targets by Ago2-IP experiment. A, GSEA profiles of the Running Enrichment Score (ES) of genes enriched in the top 8% and 36% of candidates as target genes for *miR-195* (*upper*) and *miR-497* (*lower*) by Ago2-IP experiments along the rank of transcripts differentially expressed after transfection with *miR-195* (*left*) or *miR-497* (*right*) versus *Luc.* B, Outline for selecting final candidates as direct targets of *miR-195* (*upper*) and *miR-497* (*lower*) determined by a combination of Ago2-IP candidates and repressed genes by *miR-195* or *miR-497* (>2-fold decrease) in gene expression array experiments. C, Significantly enriched IPA canonical pathways for candidate direct target genes of *miR-195* and *miR-497*. Numbers(<sup>a</sup>), ratio(<sup>b</sup>) and genes (<sup>c</sup>) of candidate direct targets among all genes involved in the canonical pathway. D, Representative results of Western blotting of known targets, CDK6, CCND1, and E2F3, as positive controls and predicted targets, CDK4, CCND3, CDC25A, and BTRC, for *miR-195* and *miR-497*, 48 hours after transfection with miCENTURY OX miNatural mimicking *miR-195*, *miR-497*, or control *Luc.* E, 3'UTR reporter assays of a *miR-195*- and *miR-497*-nonexpressing cell line, Hep G2, 48 hours after cotransfection with pMIR-REPORT luciferase vectors containing 3'-UTR target sites (*upper*) of *CDK6*, *CCND1*, *E2F3*, *CDK4*, *CCND3*, *CDC25A*, or *BTRC*, miCENTURY OX miNatural mimicking *miR-195*, *miR-497*, or negative control, and pRL-hTK internal control vector (*lower*). Horizontal open bar, gray boxes, and black bars with arrowheads in upper panel indicate 3'-UTR, possible target sites, and regions examined in the 3'UTR reporter assay, respectively, for each gene. doi:10.1371/journal.pone.0060155.g003

regulate many aberant components involved in the pathway of cell cycle regulation through their multi-gene-targeting capability.

Meanwhile, among the target genes for miR-195 and miR-497 identified in the present study, top four target genes, CCNE1, CDC25A, CDK4 and CDK6, frequently upregulated in a tumor-specific manner only showed slight inverse correlation with these miRNAs in HCC tumors. These results show the novel possibility for miRNAs that, these miRNAs could preferentially target genes aberrantly expressed in HCCs when restored.

Most cancer cells show excessive proliferation with promoted expression of cell cycle regulators. Since master regulators of the cell cycle are also indispensable for normal cells, current anticancer therapeutic strategies have shifted to the search for single dominant oncogenes or addictive molecules showing oncogene addiction [3]. However, several issues, such as the emergence of escape mechanisms, drug resistance and tumor-individuality arising among patients without optimal ways for personalized cancer therapy, remain to be solved for successful translation of this oncogene addiction model into the effective targeted therapies. Therefore, miR-195 and miR-497, may be useful for selective therapeutics, because the introduction of those miRNAs, which are essential and expressed in normal cells at basal levels, may selectively modulate aberrant tumor cell growth without gain of resistance by targeting a set of genes contributing to cell cycle progression which is commonly appeared to be enhanced in tumors. A better understanding on the functions of miRNAs in HCC would undoubtedly open new avenues for research in tumor biology.

### Materials and Methods

### Cell Lines and Primary Tumor Samples

A total of 19 HCC cell lines were maintained in appropriate media as described elsewhere [32]. To examine the restoration of mRNA expression in genes of interest, the cell lines were cultured with or without 5  $\mu$ M 5-aza-2'-deoxycytidine (5-aza-dCyd) for 5 days and/or 300 nM of TSA for the last 24 hours.

A total of 18 frozen primary tumor samples and corresponding non-tumorous tissue samples were obtained from HCC patients, and two frozen normal liver tissues samples (C20, C40) were obtained from patients with hepatectomy due to metastatic liver tumor treated at Tokyo Medical and Dental University with written consent from each patient and approval by the local ethics committees of Medical Research Institute and Faculty of Medicine, TMDU. The TNM classification of the Union for International Cancer Control (UICC) was used.

### Function-based miRNA Screening

 $\rm HCC$  cells were seeded in 24-well plates a day before transfection. Each synthetic miRNA (5 nM) in  $\rm Pre-miR^{TM}$  miRNA Precursor Library-Human V3 (Ambion, Austin, TX) or

the control non-specific miRNA (Ambion) was transfected into cells using Lipofectamine TM RNAiMAX (Invitrogen, Carlsbad, CA) according to the manufacturer's instructions. The numbers of viable cells were assessed 4 or 5 days after transfection by the colorimetric water-soluble tetrazolium salt (WST) assay. Results were normalized to the number of cells transfected with non-specific miRNA. Each assay was performed in duplicate.

### Microarray Analyses

Extracted total RNA was subjected to analysis using G4471A 15K Human miRNA Microarrays Ver. 3 and G4112F 44K Whole Human Genome Microarray for miRNA and mRNA expression, respectively, with standard image acquisition according to the manufacturer's instructions (Agilent Technologies, Santa Clara, CA). Raw microarray data were normalized and analyzed using GeneSpring GX software version 11.5.1 (Agilent Technologies). All samples were analyzed twice.

### Quantitative Reverse Transcription-PCR (qRT-PCR)

Real-time qRT-PCR was performed using an ABI Prism 7500 Fast Real-time PCR System (Applied Biosystems, Foster City, CA), KAPA PROBE FAST Universal 2×qPCR master mix (Kapa Biosystems, Woburn, MA), TaqMan® Reverse Transcription Kit (Applied Biosystems), and TaqMan® MicroRNA Assays (Applied Biosystems) according to the manufacturer's instructions [33]. All reactions were run in duplicate.

### Transfection with Synthetic miRNAs or siRNAs and Proliferation Assay

Each of miCENTURY OX miNatural mimicking *miR-195*, *miR-497*, or "microRNA control, Luciferase (GL3)" (5 nM; COSMO BIO, Tokyo, Japan) was efficiently transfected into cells as described elsewhere [33]. Each of gene-specific siRNA (Hs\_CCNE1\_0049, Hs\_CDC25A\_7714, Hs\_CCND3\_0184, Hs\_CDK4\_2490, and Hs\_BTRC\_9438; 10 nM; Sigma, St Louis, MO) or negative control siRNA (Mission\_Negative control SIC-001, Sigma) was also efficiently transfected into cells. The numbers of viable cells 24–96 hours after transfection were assessed by WST assay. The cell cycle was evaluated 48 hours after transfection by fluorescence-activated cell sorting (FACS) as described [33].

### Ago2-IP and RNA Deep Sequencing

Ago2-IP was performed using  $1\times10^7$  cells 24 hours after transfection of miCENTURY OX miNatural mimicking *miR-195* or *miR-497*, or non-transfected cells, using Ago2 antibody and a microRNA Isolation Kit, human Ago2 (Wako Pure Chemical, Osaka, Japan) according to the manufacturer's instructions. Samples for RNA-sequencing were prepared using 10 ng of Ago2-IP RNA and 3  $\mu$ g of total RNA with a TrueSeq mRNA Sample Preparation Kit (illumina, San Diego, CA) with or without

**Figure 4. Significance of identified** *miR-195* **and** *miR-497* **targets in HCCs. A**, Schema of *miR-195* and *miR-497* target genes regulating promotion of G1 to S in the cell cycle. **B**, Results of the knock down of each *miR-195* and *miR-497* target gene by siRNAs. Mean of relative growth ratio of Hep G2 72 hours after transfection of 10 nM of each siRNA (siNC, siBTRC, siCDK4, siCCND3, siCCNE1 or siCDC25A) and non-treated Hep G2 (Non treatment) were assessed by WST-8 assay in a triplicate manner (*upper*). The population in each phase of the cell cycle assessed by FACS were assessed by FACS 48 hours after siRNA transfection (*lower*) in a duplicate manner. Bars, SD. Asterisks (\*), *P*<0.05 versus siNC transfected cells in a statistical analysis with the Mann-Whitney *U* test. **C**, Expression status of each target gene in primary HCC tumors (closed boxes) and paired non-tumorous liver tissues (open boxes) as compared with normal liver tissue (C20), which were used in experiments shown in Fig 1D. Asterisk (\*), frequencies of primary HCC cases, in which a remarkable up-regulation of possible *miR-195* and/or miR-497-target mRNAs was observed in tumor tissues compared with paired non-tumorous liver tissues (>2-fold expression). NA, not available due to lack of available cDNAs for qRT-PCR analyses in the LC96 sample.

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poly-A selection. Each of the libraries were analyzed by Genome Analyzer IIx (illumina) according to the manufacturer's instructions. The 36-base single-read sequences were mapped to human genomic sequences (hg19) using the sequence alignment program ELANDv2. For the expression analysis, sequence reads were converted to RPKM (Reads Per Kilobase per Million mapped reads) values by using CASAVA 1.7 software (illumina).

### miRNA Target Predictions

Predicted targets of miR-195 and miR-497 and their sites were analyzed by searching for a possible targeting sequence (5'-ACGACGA-3') in the 3'UTR of mRNA using the Ensembl Genome Browser (http://asia.ensembl.org/Homo\_sapiens/) and Ensembl Perl API as well as by searching databases, such as MicroCosm Targets Version 5 (http://www.ebi.ac.uk/enrightsrv/microcosm/htdocs/targets/v5/), microRNA.org (http://www.microrna.org/), and TargetScan (http://www.targetscan.org/).

### Bioinformatics Analysis for Identification of miRNA Targets

Cut-off values of Ago2-IP-seq were calculated for genes with miRNA target predictions using Gene Set Enrichment Analysis (GSEA; www.broad.mit.edu/gsea). Candidate target genes were selected as an intersect of Ago2-IP-seq final candidates and downregulated genes by miRNA transfection, followed by pathway analyses using Ingenuity Pathway Analysis (IPA; Ingenuity Systems, Inc., Redwood City, CA). Detailed information for each analysis is provided in Methods S1.

### Western Blotting and 3'UTR Reporter Assay

Western blotting and 3'UTR reporter assays were performed as described elsewhere [33]. In the 3'UTR reporter assay, "micro-RNA control, Non-target RNA" (COSMO BIO) was used as a negative control. PCR primers designed to amplify regions of interests, and antibodies used for Western blotting are provided in Table S4 and Methods S1.

### Data Deposition

The microarray and sequencing data from this publication have been submitted to the GEO database (http://www.ncbi.nlm.nih.gov/geo/) and assigned the identifier "GSE41081".

### **Supporting Information**

**Figure S1** Expression levels of seven candidate miRNAs in HCC cell lines (**A**) and in primary HCC tumors (closed boxes, **B**) and paired non-tumorous liver tissues (open boxes, **B**) as compared with normal liver tissue (C20). Asterisks (\*), frequencies of HCC cell lines in which a remarkable downregulation of the expression of candidate miRNAs was observed as compared with C20 (<0.5-fold expression). Numbers under the boxes in the right panel indicate the fold increase of the expression in tumors (T) compared

with paired non-tumorous liver tissue (N). Double asterisks (\*\*\*), frequencies of primary HCC cases in which a remarkable down-regulation of candidate miRNA expression in tumors was observed compared with paired non-tumorous liver tissue (<0.5-fold expression). (PDF)

Figure S2 Analysis of expression and genomic aberrations of miR-497 and miR-195. A, Scatter plot showing miR-195 (x-axis) and miR-497 (v-axis) expression status in the HCV-related HCC dataset (tumor only, left) obtained from the database of Broad institute (GSE20596, http://www.broadinstitute.org/) and in our dataset used in Fig. S1B (tumors and non-tumorous tissues are filled and open plots, respectively; right). Pearson's product moment correlation coefficient (R) was used to assess this relationship. B, Genomic copy-number status around miR-195 and miR-497 genes determined by q-gPCR. The copy-number of COL7A1 at 3p21.31 was used for normalization, and all results were shown as copy-number ratios relative to those of CONT1. CONT1-6 (DNA samples from normal lymphoblastoid cells) and C20 (DNA sample from normal liver) were used as normal controls. We used the data on genomic copy-numbers in regions around miR-195, miR-497 and COL7A1 in some HCC cell lines (HLE, HuH-6, Huh7, PLC/PRF/5) determined by single nucleotide polymorphism (SNP) arrays available online in SNP Array Based LOH and Copy Number Analysis of the Sanger Center Genome Project (http://www.sanger.ac.uk/genetics/ CGP/) to confirm our results. \*LOH was detected at miR-195 and miR-497 loci, \*\*copy number changes were observed neither at miR-195 and miR-497 nor COL7A1 loci, \*\*\*LOH was observed both at miR-195 and miR-497 and COL7A1 alleles in the Sanger Center Genome Project, which was consistent with our result. C, Expression levels of pri-miRNA-195 and pri-miRNA-497 in HCC cell lines as compared with normal liver tissue (C20). (PDF)

Figure \$3 Assessment of possible mechanisms causing downregulation of miR-195 and miR-497 in HCC cell lines. A, Schematic map of miR-497-195 loci at 17p13.1 (black thick bar). White arrows indicate positions of pre-miR-497 and pre-miR-195 coding region. SwitchGear Genomics Transcription Start Sites (CHR17\_M0118\_R1) was marked at +1 (thin arrow). Hatched bar indicates the site of an ENCODE Transcription Factor ChIP-seq (TAF1) binding site. The regions used for promoter assay, bisulfite sequencing and ChIP-PCR are indicated white or dotted boxes, closed arrows, and gray bars, respectively. Dotted boxes indicated regions showing promoter activity in the promoter assay. B, Promoter assay of regions around the predicted pri-miR-497-195 transcription start site. pGL3 basic empty vectors (mock) or constructs containing sequences of F1-4 (see Fig. S3A) were transfected into HCC cell lines without expression of miR-497 and miR-195 (Hep G2 and sK-Hep-1, left) or with expression of miR-195 (HuH-6, right). The Luciferase activity of each construct relative to the values of pGL3-basic empty vector is shown with the

mean ± SD (bars) in triplicate experiments. C, Effect of treatment with 5-aza-2'-deoxycytidine (5-aza-dCyd) (5 µmol/L) for 5 days and/or trichostatin A (TSA) (300 nmol/L) for the last 24 hours on expression levels of miR-195 (left) and miR-497 (right) in HCC cell lines determined by qRT-PCR. Results are shown with means ± SDs (bars) relative to the values for no treatment in duplicate experiments for each cell line. D, Representative results of bisulfite-sequencing in regions 1-5 upstream of miR-497 and miR-195 in miR-497/195-expressing normal liver (C20, ++), miR-195-expressing HCC cell line (+), and non-expressing HCC cell lines (-). Each circle indicates the position of the CpG site in the region. Methylated- and unmethylated-CpG sites are shown as closed and open circles, respectively. E, Representative results of ChIP assays showing H3K27me3 status (upper) and H3K4me3 status(lower) indicating inactive and active transcription status, respectively, within regions R1 and R2 (see Fig. S3A) in nonexpressing cells(-) and miR-195-expressing cell (+). Results are shown with means ± SDs (bars) relative to the values for ChIP with anti-H3 antibody in duplicate experiments for each cell line.

Figure S4 Validation and determination of the cut-off value for Ago2-IP experiments. A, Scatter plot of the miRNA expression profile in the Ago2-IP fraction for miR-195 (left, y-axis) and miR-497 (right, y-axis) overexpression compared with non-transfected (NT, x-axis) samples determined by miRNA expression array. Closed and open blocks indicate expression of miR-195 and miR-497, respectively. B, GSEA profile of the Running Enrichment Score (ES) of genes shown in the top 10% of fold enrichment scores in Ago2-IP experiments for miR-195 (left) or miR-497 (**right**) along the rank of transcripts differentially expressed in miR-195- (left) or miR-497- (right) overexpression compared with control counterparts. C, Results of the same analysis as in Figure S3B using different gene sets, which were further selected by the presence of miR-195 or miR-497 predicted target sites (left, miR-195; right, miR-497). **D**, Normalized enrichment score calculated by GSEA for all cut-off rates (%). Dotted lines indicate the cut off rates, which show maximum negative enrichment scores (8 and 36% for miR-195 and miR-497 experiments, respectively). (PDF)

**Figure S5** Representative results of Western blotting of CDK4, CCNE1, CCND3, CDC25A, and BTRC 48 hours after transfection with each specific siRNA or negative control (siNC).

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(PDF)

**Table S1** Primers for 3'UTR reporter assay. (ZIP)

**Table S2** GO analysis of genes, whose expression levels were changed (>2-fold change) by *miR-195* or *miR-497* overexpression compared to control *Luc*-overexpression in Hep G2 (S2-1 or S2-2) or sK-Hep-1 (S2-3 or S2-4) cells 48 hours after transfection. (PDF)

**Table S3** Top 20 genes ranked by the fold enrichment score in Ago2-IP-seq with miRNA target predictions. (PDF)

**Table S4** Significance of identified candidate targets for *miR-195* and *miR-497* through Ago2-IP-seq, expression array experiments, and statistical analyses. (PDF)

**Table S5** Primer sets for q- gPCR, promoter assay, bisulfite sequencing, and ChIP-PCR. (PDF)

#### Methods S1

(DOC)

**Dataset S1** List of candidates for growth-suppressive miRNAs determined by function-based screening. (XLSX)

**Dataset S2** List of downregulated miRNAs in 6 HCC cell lines compared with C20 and C40 determined by miRNA expression array. (XLSX)

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#### **Author Contributions**

Conceived and designed the experiments: MF KK JI. Performed the experiments: MF KT. Analyzed the data: MF KT TS AN SM. Contributed reagents/materials/analysis tools: SA ST. Wrote the paper: MF KK JI.

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-330 -

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-331 -

### ORIGINAL ARTICLE—LIVER, PANCREAS, AND BILIARY TRACT

## Alcohol consumption and recurrence of non-B or non-C hepatocellular carcinoma after hepatectomy: a propensity score analysis

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### **Abstract**

*Background* The aim of this study was to identify factors related to the recurrence of non-B or non-C (NBNC) hepatocellular carcinoma (HCC).

Study design Between April 2000 and March 2012, out of 621 consecutive HCC patients at our institution, 543 who underwent initial hepatectomy and had no extrahepatic metastases were enrolled in the study. Multivariate analysis were performed to identify risk factors for poor disease-free survival (DFS).

Results The 5-year DFS rate of NBNC (34 %) was better than that of hepatitis virus B (30 %, P=0.011) and hepatitis virus C (21 %, P<0.0001), significantly. Multivariate analysis revealed NBNC [hazard ratio (HR), 0.5; 95 % CI, 0.4–0.8; P<0.0001)] to be an independent factor for DFS rate. We constructed a propensity score matching model with the 543 patients, and the 5-year DFS rates with and without severe alcohol liver disease (ALD) were 31.6 and 47.5 %, respectively (P=0.013). In the 163 NBNC patients, severe ALD, mild ALD, and no ALD were seen in 35, 56, and 72 patients, respectively. Multivariate analysis revealed a vascular invasion into the hepatic vein (HR, 3.3; 95 % CI, 1.7–6.3; P<0.0001) and severe ALD (HR, 2.0; 95 % CI, 1.1–3.6; P=0.020) to be independent risk factors for poor DFS. By propensity score matching between

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mild and severe ALD, the 5-year DFS rates with severe and mild ALD were 26 and 50 %, respectively (P = 0.035). Conclusions The prognoses of NBNC patients were better than those of patients with viral infections. Among the NBNC patients, preoperative excessive alcohol intake decreased DFS rate of HCC occurrence after surgery.

**Keywords** Hepatitis B virus · Hepatitis C virus · Non-B non-C · Hepatocellular carcinoma · Recurrence · Hepatectomy

### Abbreviations

AFP Alpha-fetoprotein

DCP Des-gamma-carboxy prothrombin

DFS Disease-free survival HBV Hepatitis B virus

HCC Hepatocellular carcinoma

HCV Hepatitis C virus
NBNC Non-B non-C
HR Hazard ratio
OS Overall survival

### Introduction

Primary liver cancer involving hepatocellular carcinoma (HCC) is the fifth most common and fatal cancer worldwide. HCC has been the most rapidly increasing cancerrelated cause of death in developed countries including Japan, Australia, Canada, the United States, and throughout Europe over the last two decades. The number of non-B non-C (NBNC) HCC patients has increased rapidly [1]. Chronic viral hepatitis and liver cirrhosis following



hepatitis B virus (HBV) and hepatitis C virus (HCV) infection are responsible for most HCCs. The oncogenic mechanism and clinicopathological characteristics of HCCs critically depend on the type of hepatitis virus involved [2, 3]. Patients with HBV-related HCCs may have a better liver function reserve than those with HCV-related tumors. The etiology is unclear in the other 15–50 % of new HCC cases. In Japan, 10 % of patients diagnosed with HCC have NBNC HCC.

Most patients with NBNC HCC have alcoholic liver disease or nonalcoholic fatty liver disease (NAFLD) including nonalcoholic steatohepatitis (NASH). Recent studies have indicated that both NASH and excessive alcohol intake increase the risk of developing HCC [4]. The prevalence of NAFLD and NASH is reported to be 20 % and 1 %, respectively, among adults in Japan [5, 6], and longitudinal outcome studies have reported that the prevalence of HCC in patients with NAFLD and NASH is 0-0.5 and 0-2.8 %, respectively, over a period of up to 19.5 years [7–10]. In Europe, alcohol-induced cirrhosis accounts for one-third to one-half of all HCC cases [11-13]. HCC is found in 10.1 % of patients with cirrhosis caused by alcohol alone, and its prevalence is almost identical to that of HCV infection [14]. The risk of developing HCC increases when daily alcohol consumption exceeds 80 g/day, whereas the adjusted odds ratio is not increased significantly for patients who consume alcohol at less than 80 g/day [15]. However, some reports indicate that patients with NBNC HCC present with more advanced tumors with poor differentiation, invasion, and vascular involvement and a higher incidence of intrahepatic metastases than patients with HCCs associated only with viral infection [16–18].

In this study, we aimed to elucidate the clinicopathological features of patients with NBNC HCC who had undergone hepatectomy, and the factors, including preoperative alcoholism, that are associated with recurrence. For a fair comparison, key factors that were responsible for DFS were adjusted for by using propensity score-matched analysis. Moreover, we examined whether alcoholism promotes the recurrence of HCC after hepatectomy and whether preoperative alcohol consumption is the best predictor of DFS in patients with NBNC HCC.

#### Patients and methods

Between April 2000 and March 2012, a total of 621 patients received initial treatment for HCC at the Department of Hepatobiliary Pancreatic Surgery, Tokyo Medical and Dental University. Of these patients, 545 patients underwent initial hepatectomy for HCC and were not found to have extrahepatic metastases. The 543 patients,

excluding two (one with autoimmune hepatitis and one with primary biliary cirrhosis), were enrolled in the unadjusted study. The baseline characteristics of the patients are shown in Table 1 (The data of four HBV + HCV patients are not shown). We classified NBNC patients into severe ALD group (alcohol consumption  $\geq$  80 g/day), no ALD (alcohol consumption < 20 g/day), and mild ALD group (20 g/day  $\leq$  alcohol consumption < 80 g/day). Alcoholic history was available in 463 patients. Occult HBV infection is defined by the absence of serologically detectable HBs antigen despite the presence of HBc antibody in serum [19, 20].

The decision to perform hepatic resection with anatomical resection is generally determined by the Child-Pugh A/B score and the indocyanine green retention rate at 15 min (ICG-R15) according to the Makuuchi criteria. Non-anatomic resection includes partial resection. In the anatomic resections performed in our study, the liver was divided along the demarcation line after occlusion of the portal vein and hepatic artery. When necessary, the main feeding artery was identified by intravenous injection of sonazoid [21]. We divided the liver parenchyma using an ultrasonic dissector and other energy devices. Prior to resection, all tumors were examined by intraoperative ultrasonography and preoperative computed tomography Intraoperative ultrasonography with contrast enhancement was used, if necessary [22]. The size of the tumors and length of the surgical margin were measured before fixation of the specimens. The extent of macrovascular invasion was determined using preoperative CT, as microvascular invasion could not be determined before hepatectomy. Microvascular invasion was evaluated on the basis of histological findings if macrovascular invasion was not noted. Background liver cirrhosis and surgical margins were assessed by microscopic examination of the specimens. After discharge, all the patients were examined for recurrence by ultrasonography every 3 months and by dynamic CT every 6 months. The median follow-up period after surgery was 2.9 years (range 0-11.2 years). DFS was defined as the interval between the operation and the date on which recurrence was diagnosed or the end of the observation period if no recurrence was noted. The general rules for the clinical and pathological study of primary liver cancer by liver cancer study group of Japan (5th edition, revised version) simply classify the liver histology into normal liver, chronic hepatitis, and liver cirrhosis. The rule describes the classification of the hepatic fibrosis in detail, as follows: no fibrosis (f0), increased fibrosis of portal area (f1), bridging fibrosis (f2), bridging fibrosis with distorted hepatic lobules (f3), and liver cirrhosis (f4). The patients' medical records were reviewed systematically for relevant clinical data (gender, age, viral infection, alcohol use, and liver function), tumor factors (primary tumor size and



Table 1 Baseline characteristics of patients with non-B non-C hepatocellular carcinoma

	HBV $(N = 96)$	HCV (N = 275)	NBNC ( $N = 168$ )	Р
Age (years)	59.3 ± 11.4	$68.4 \pm 7.6$	$68.5 \pm 11.2$	<0.0001*
Gender				
Male	74 (77 %)	200 (73 %)	141 (84 %)	0.025*
Alcoholism (+)	21 (25 %)	66 (26 %)	100 (60 %)	<0.0001*
Severe ALD (+)	9 (12 %)	18 (8 %)	35 (24 %)	<0.0001*
Liver function				
ICG-R15 (%)	$15.1 \pm 11.7$	$19.3 \pm 11.4$	$15.2 \pm 9.5$	<0.0001*
AST (IU/L)	$48.7 \pm 45.8$	$60.3 \pm 41.7$	$42.6 \pm 27.0$	<0.0001*
Platelet (10 <sup>4</sup> /mL)	$16.2 \pm 8.1$	$13.5 \pm 6.7$	$19.5 \pm 11.0$	<0.0001*
Prothrombin time (%)	$84.5 \pm 18.2$	$85.9 \pm 15.3$	$86.1 \pm 16.6$	0.853
Albumin (g/dL)	$4.0 \pm 0.5$	$3.8 \pm 0.6$	$4.0 \pm 0.4$	<0.0001*
Total bilirubin (mg/dL)	$1.0 \pm 1.0$	$0.8 \pm 0.4$	$0.9 \pm 0.5$	0.443
Child Pugh score	$4.9 \pm 1.6$	$5.2 \pm 1.3$	$4.8 \pm 1.7$	0.092
Tumor factors				
Tumor size (cm)	$5.4 \pm 4.4$	$4.0 \pm 2.5$	$5.8 \pm 4.1$	<0.0001*
Tumor number	$1.5 \pm 1.1$	$1.6 \pm 1.0$	$1.5 \pm 1.2$	0.98
Alpha-fetoprotein (ng/mL)	$12854 \pm 66264$	$3497 \pm 27261$	$2477 \pm 14500$	0.179
DCP (AU/L)	$6267 \pm 31637$	$3351 \pm 17435$	$11644 \pm 44165$	0.101
Anatomic resection (+)	68 (71 %)	162 (59 %)	123 (73 %)	0.017*
Pathological findings				
Micro-vascular invasion				
vp (+)	49 (51 %)	101 (37 %)	69 (41 %)	0.102
vv (+)	12 (13 %)	33 (12 %)	22 (15 %)	0.829
b (+)	5 (5 %)	13 (5 %)	15 (9 %)	0.188
Chronic hepatitis (+)	35 (36 %)	112 (41 %)	65 (40 %)	0.793
Liver cirrhosis (+)	50 (52 %)	153 (56 %)	55 (34 %)	<0.0001*
Surgical margin (+)	19 (20 %)	53 (19 %)	23 (14 %)	0.270

Values are shown as the mean  $\pm$  SD

ALD alcoholic disease, DCP des-gamma-carboxy prothrombin, HBV hepatitis B virus, HCV hepatitis C virus, NBNC non-HBV non-HCV \*P < 0.05 considered statistically significant

tumor markers), operative procedure, and pathological findings. We determined alcoholism as some mental and/or physical status related to alcohol dependence [23]. Follow-up data were updated yearly or at shorter intervals, and the last follow-up examination was performed in March 2012.

Statistical analysis were performed using SPSS version 21.0 (IBM Inc., Chicago, IL, USA), unless otherwise stated. Analysis of variance and the  $\chi^2$  test were used for continuous and categorical data, respectively. The odds ratio for recurrence for each factor was examined by univariate analysis using the Cox proportional hazards model. Variables found to be statistically significant on this basis were entered into multivariate analysis. DFS was analyzed using the Kaplan–Meier method and the log-rank test. A P value of <0.05 was considered statistically significant; all tests were two-sided.

Because hepatectomy was not performed on the basis of random assignment in the present study, confounding factors could hamper the observations obtained from unadjusted factors. To reduce the potential bias, a propensity score [24] was calculated to assess the conditional probability of treatment according to the individual's covariates and to balance treatment choice-related variables such that the analysis simulated random assignment [25].

The propensity score was estimated using a logistic regression model in which outcome was the binary variable, severe ALD group versus mild ALD group (0, mild ALD groups; 1, severe ALD group), and the explanatory variables were the independent factors obtained from the multivariate analysis for DFS, such as pathological chronic hepatitis, preoperative serum albumin level, and tumor vascular invasion into the hepatic vein in the analysis of 91 NBNC patients. The propensity score was estimated between the categorizing of severe ALD group versus nosevere ALD group (0, no-severe ALD groups; 1, severe

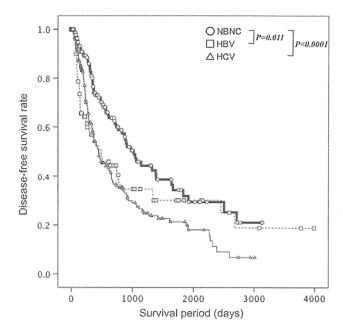


ALD group) in the analysis of 543 patients. Without replacement, one-to-one pair matching by estimated propensity score generated 15 matched pairs of mild versus severe ALD (Table 4) and 55 matched pairs of patients with and without severe ALD (Supplementary Table 2). All matching processes were performed by the aforementioned SPSS version 21.0. The degree of covariate imbalance in the unmatched and matched samples was measured using the standardized (mean and proportion) difference proposed by Austin et al [26]. It has been suggested that a standardized difference of greater than 20 % represents meaningful imbalance in a given variable between treatment groups [27].

#### Results

The baseline characteristics of the patients are summarized in Table 1. Liver function of the NBNC patients was, on average, better than that of HCV-infected patients, as judged by the ICG-R15, aspartate aminotransferase level, platelet count, and albumin level (P < 0.0001); while the prothrombin time, total bilirubin level, and Child-Pugh scores were comparable. Liver cirrhosis was significantly less frequent in NBNC patients (34 %) than in HCV-(56 %) and HBV- (52 %) infected patients (P < 0.0001). The mean tumor size was larger in the NBNC patients than in the HCV-infected patients, whereas the other indices of tumor malignancy, such as microvascular invasion, serum alpha-fetoprotein (AFP) level, and des-gamma-carboxy prothrombin (DCP) level, did not vary significantly. Alcoholism and severe ALD were more evident in NBNC patients than in the other two groups (P < 0.0001). The groups did not differ significantly with respect to the pathological surgical margin, although it was noteworthy that non-anatomic resection was frequently selected for HCV-infected patients. As shown in Fig. 1, the DFS rate of NBNC patients was longer than that of HBV and HCV patients. The 5-year DFS rates were 30, 21, and 34 % in the HBV, HCV, and NBNC groups, respectively. The NBNC patients experienced recurrence less frequently than did patients infected with HBV (P = 0.011) and HCV (P < 0.0001; Fig. 1). We excluded the cases of autoimmune hepatitis and primary biliary cirrhosis from NBNC group.

In univariate analysis of 543 patients, NBNC was an important determinant for good prognosis (HR, 0.6; 95 % CI, 0.4–0.8, P < 0.0001), as shown in Supplemental Table 1. The other determinants were liver functional reserve factors (ICG-R15, serum AST, prothrombin time, and serum albumin), tumor factors (size, number, serum tumor marker, vascular invasion), noncancerous liver histology (chronic liver hepatitis and liver cirrhosis), and



**Fig. 1** Disease-free survival of patients with non-B non-C (NBNC) hepatocellular carcinoma. *Open squares, triangles*, and *circles* denote the disease-free survival (DFS) of patients with HBV, HCV, and NBNC, respectively. The DFS of the non-B non-C (NBNC) group was better than that of the HBV group (P=0.011) and HCV group (P<0.0001)

surgical factors (anatomic resection, surgical margin). Multivariate analysis revealed that NBNC (HR, 0.5; 95 % CI, 0.4–0.8, P < 0.0001), ICG-R15, serum AST, tumor number, vascular invasion, anatomic resection and pathological chronic hepatitis. Taking into account factors related to prognosis, we compared the DFS rate of patients in the presence and absence of the severe ALD, adjusting for the risk factors using propensity score matching. The area under the ROC curves (C value) was  $0.892 \pm 0.016$  SE for predicting severe ALD considering alcoholism. As shown in Supplemental Table 2, all factors related to recurrence were adjusted significantly considering the propensity score constructed with the aforementioned factors. There was no significant difference between the two groups with respect to propensity score after the adjustment (P = 1.000), though there was a significant difference before the propensity adjusting (P < 0.0001). Younger age, male gender, alcoholism, and higher albumin level observed in the severe ALD group before the matching were completely adjusted after the matching. The DFS rates with and without the severe ALD groups were compared (Supplemental Fig. 1). The 1-, 3-, and 5-year DFS rates were 70, 32, and 32 % in the severe ALD group and 76, 68, and 48 % in the no-severe ALD group, respectively. There was a remarkable difference between the two groups with respect to DFS rates (log-rank; P = 0.013). These results suggest that severe



ALD also increases the risk of HCC recurrence amongst all patients with NBNC HCC.

These findings led us to determine which factor decides the DFS rate of NBNC patients. A total of 35 out of 168 NBNC patients were classified as having severe ALD (Table 2). The alcoholic history was available in 163 NBNC patients. Of these 168 patients, 17 patients tested positive for serum HBc antibody (+). Severe ALD was associated with being male (P = 0.005), alcoholism (P < 0.0001), small tumor size (P = 0.040) and liver cirrhosis (f4) (P = 0.011). There was no difference in all fibrosis grades except for liver cirrhosis grade (f4) among the three groups. As shown, there was no difference in fibrosis grade (f0–3) among the three groups. There was no

significant difference among the groups with respect to any of the other factors. The mean follow-up period after surgery was 2.7 years. As shown in Fig. 2, the 5-year DFS rates were 25.2 and 51.2 % in the severe and mild ALD, respectively. (P = 0.013). However, the result may be biased by additional determinants of DFS, for example, liver cirrhosis. Liver cirrhosis (f4) was the most evident in the severe ALD group among the three groups, though the liver function was not different and tumor size was the largest in the no-ALD group.

Table 3 summarizes the results of univariate analysis of DFS in 163 NBNC patients (excluding five patients whose alcohol histories were not available), which show that a decreased serum albumin level (P = 0.033), tumor number

**Table 2** Background characteristics of 168 NBNC patients with alcohol consumption

	Non-B non-C hepatocellular carcinoma				
	Severe ALD $(n = 35)$ Mean $\pm$ SD	Mild ALD $(n = 56)$ Mean $\pm$ SD	No ALD $(n = 72)$ Mean $\pm$ SD	Р	
Age (years)	65.3 ± 8.6	69.2 ± 9.7	$69.4 \pm 13.2$	0.166	
Gender					
Male	33/94 %	51/91 %	53/74 %	0.005*	
AST (IU/L)	$45.8 \pm 32.0$	$40.6 \pm 26.9$	$42.8 \pm 24.5$	0.677	
Platelet $(10^4/\mu L)$	$17.4 \pm 7.5$	$19.1 \pm 9.6$	$20.7 \pm 13.0$	0.337	
Alcoholism (+)	28/90 %	42/75 %	5/7 %	<0.0001*	
HBc antibody (+)	2/6 %	2/4 %	13/22 %	0.017*	
Liver function					
ICG-R15 (%)	$14.7 \pm 8.3$	$15.9 \pm 9.5$	$15.1 \pm 10.3$	0.810	
Prothrombin time (%)	$87.6 \pm 12.5$	$84.7 \pm 20.3$	$86.1 \pm 15.4$	0.919	
Albumin (g/dL)	$4.2 \pm 0.3$	$4.0 \pm 0.4$	$4.0 \pm 0.5$	0.107	
Total bilirubin (mg/dL)	$0.9 \pm 0.4$	$0.9 \pm 0.6$	$0.9 \pm 0.5$	0.767	
Child-Pugh score	$4.4 \pm 1.8$	$4.8 \pm 1.6$	$5.0 \pm 1.6$	0.175	
Tumor factors					
Tumor size (cm)	$4.9 \pm 3.1$	$5.2 \pm 3.8$	$6.7 \pm 4.5$	0.040*	
Number	$1.5 \pm 0.7$	$1.6 \pm 1.7$	$1.4 \pm 1.0$	0.611	
Alpha-fetoprotein (ng/mL)	$2357 \pm 8358$	$435 \pm 1758$	$3923 \pm 21024$	0.420	
DCP (AU/L)	$2970 \pm 8721$	$8142 \pm 34595$	$14434 \pm 44929$	0.296	
Anatomic resection (+)	27/77 %	35/63 %	58/81 %	0.062	
Pathological findings					
Surgical margin (+)	3/9 %	9/16 %	11/15 %	0.394	
No fibrosis (f0) (+)	5/14 %	19/35 %	23/33 %	0.128	
Portal fibrosis (f1) (+)	7/20 %	5/9 %	10/14 %	0.354	
Bridging fibrosis (f2) (+)	1/3 %	8/15 %	12/17 %	0.110	
Distorted lobules (f3) (+)	3/9 %	4/7 %	7/10 %	0.867	
Liver cirrhosis (f4) (+)	19/54 %	18/33 %	17/25 %	0.011*	
Chronic hepatitis (+)	11/31 %	19/35 %	34/49 %	0.133	
Micro-vascular invasion					
vp (+)	11/31 %	23/41 %	34/47 %	0.297	
vv (+)	3/9 %	7/14 %	12/19 %	0.410	
, p (+)	5/14 %	4/7 %	6/8 %	0.489	

Values are shown as the mean ± SD. The alcohol history was not available in five patients b biliary invasion, DCP desgamma-carboxy prothrombin, pv portal venous invasion, vv hepatic venous invasion

\* P < 0.05 considered

significant