

Original Article

Differential diagnosis between hepatocellular carcinoma and cirrhosis by serum amino acids and acylcarnitines

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Abstract: The routine biochemical parameters for hepatocellular carcinoma (HCC) diagnosis are all protein markers. Serum concentrations of these markers can be affected by some benign diseases. Most of the occurrence of HCC has a background of cirrhosis, posing a great challenge to differential diagnosis of HCC from cirrhosis using traditional biochemical parameters. Values of serum small molecular metabolites for HCC diagnosis are not fully evaluated. In this study, a traditional mass spectrometry-based screening strategy was employed to profile amino acids and acylcarnitines in blood samples collected from HCC and cirrhosis patients. Each whole blood specimen was sampled on filter paper and dried at room temperature. Metabolites in the dried blood spots were extracted using organic solvent and then concentrated for mass spectrometry analysis. It was found that 11 parameters, including amino acids, acylcarnitines and some of their relevant ratios, could be used to construct a satisfied differential diagnosis model. In this model, most of the relevant amino acids were essential amino acids. It was noticed that short-chain acylcarnitines tended to be risk factors for HCC. Long-chain acylcarnitines seemed to be risk factors for cirrhosis. This study demonstrates the value of mass spectrometry-based analysis for differential diagnosis of HCC and cirrhosis. Improved differential diagnosis ability may be achieved by combined use of traditional protein markers along with metabolite markers.

Keywords: Hepatocellular carcinoma, mass spectrometry, amino acids, carnitine

Introduction

Hepatocellular carcinoma (HCC) is one of the most common primary liver malignancies with poor prognosis [1]. Among the risk factors, cirrhosis is ranked as the leading cause of HCC. Clinically, nearly all patients diagnosed with HCC have a background of cirrhosis [2]. Besides, hepatitis virus infection, alcohol liver diseases and fatty liver diseases contribute to HCC to different extents [3].

To date, advances in HCC diagnosis are encouraging. Percutaneous biopsy is thought to be one of the most reliable measures for HCC diagnosis. But, due to the various unexpected

effects, this invasive operation is reluctantly accepted by both patients and clinicians [4]. Owing to the distinguished advantage of non-invasiveness features, imaging modalities such as ultrasound scan, computed tomography, and magnetic resonance imaging are prevailing in clinics and playing key roles in HCC screening and diagnosis [4]. However, the diagnosis accuracy is varied due to the expertise of the clinicians. Compared to imaging techniques, serum biomarkers analysis is thought to be cheaper, more objective, and sensitive [5]. The most widely used biomarkers include, but not limited to, alpha-fetoprotein (AFP), glypican-3, heat shock protein 70, glutamine synthetase,

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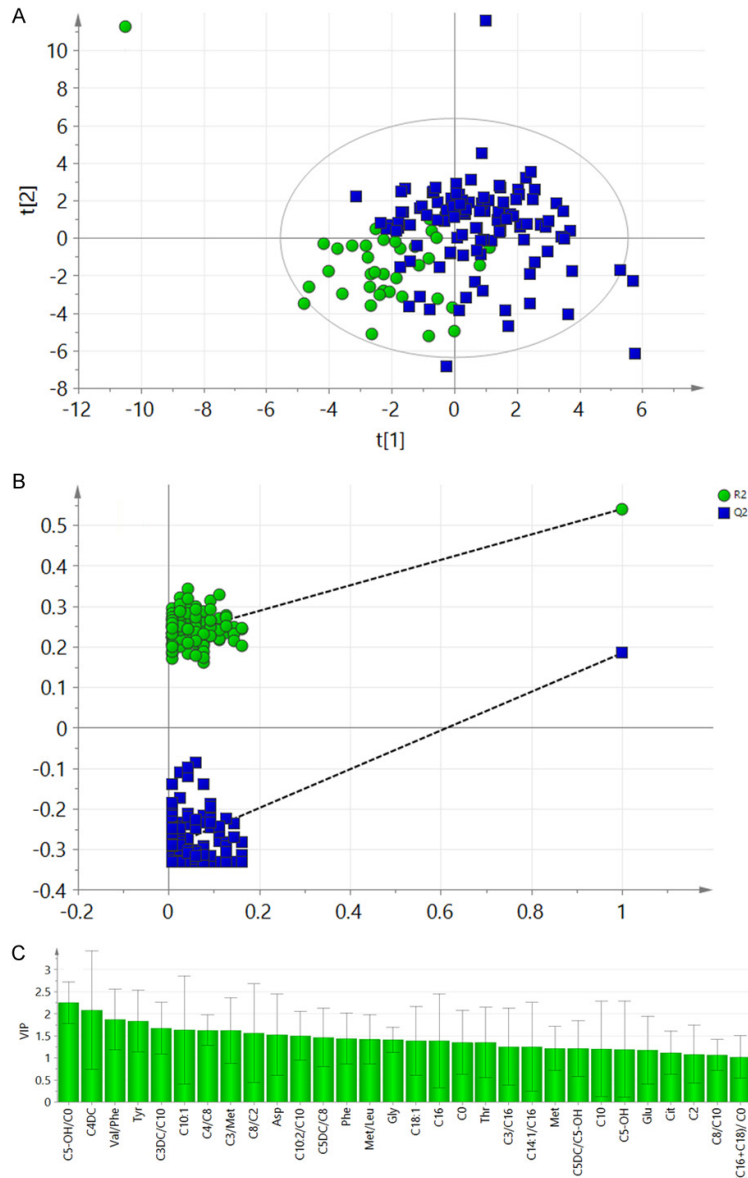


Figure 1. PLS-DA of the training sets data. A: Score plot of the PLS-DA. The circles represented the cirrhosis patients and the rectangles showed the HCC cases. B: The permutation test result of the PLS-DA model. R^2 less than 0.4 and Q^2 less than zero meant an acceptable model. C: Metabolite parameters with $VIP > 1$.

and des- γ -carboxyprothrombin (DCP) [6, 7]. The fact that nearly all the clinically utilized biomarkers can be affected by benign diseases limits the diagnosis efficiency of serological analysis. For example, it has been estimated that only half of HCC tumors secrete AFP. Increased serum AFP concentrations can also be found in patients suffering from virus hepatitis, cirrhosis, and neurodegenerative diseases [8, 9]. AFP's diagnosis sensitivity is roughly less than 65% [10]. DCP is reported to be

more specific for HCC [11], but its ability to differentiate HCC from cirrhosis is inferior to AFP sometimes [12]. A meta-analysis also indicated the drawback of using glypican-3 alone for differential diagnosis of HCC from cirrhosis [10]. Although combined using various biomarkers could improve the HCC diagnosis accuracy to some extent, the close relationship between HCC and cirrhosis still poses great challenge to accurate HCC diagnosis.

Unlike traditional immunological techniques aimed at large molecular protein detection, mass spectrometry (MS) analysis is a strategy that can precisely quantify small molecule metabolites. Limited by the propensity that one antibody exclusively recognizes one specific antigen, current serum HCC protein biomarkers analysis can only realize one-analysis-for-one-protein. However, MS analysis can simultaneously detect multiple metabolites in a single run. This feature can greatly improve the detection efficiency.

The first introduction of MS into the clinical laboratory was for new born screening (NBS) purpose [13]. The current MS-based NBS strategy is to find some inherited disorders by quantifying varied amino acids and acylcarnitines in the dried blood spots (DBSs) samples collected on filter paper. Studies have demonstrated that development and progression of HCC is accompanied by various amino acids and acylcarnitines fluctuating in the circulation [14, 15]. Additionally, many inherited disorders are thought to be risk factors to oncogenesis [16]. This implies that metabolic disorders are closely related to malignancies. In this light, the current study tried to employ the MS strategy to profile blood amino acids and acylcarnitines of

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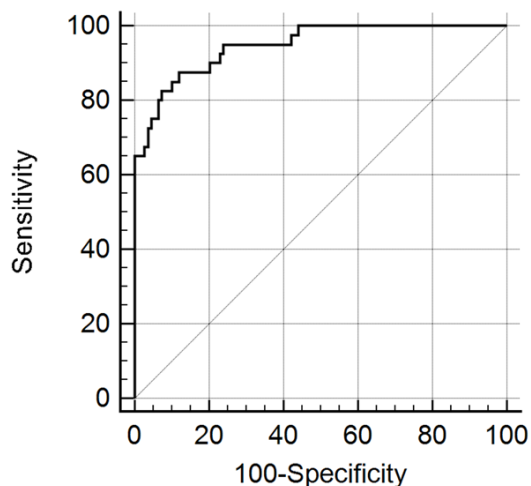


Figure 2. ROC analysis based on the regression model. Area under the curve (AUC) was 0.947 with 95% confidence interval of 0.898 to 0.977.

patients with HCC or cirrhosis. The aims of this study were to test if this MS analysis could be used for differential diagnosis of HCC and to find which metabolites play key roles in separating HCC from cirrhosis.

Material and methods

Samples

This study was approved by Ethnic Committee of The First Affiliated Hospital of Jinzhou Medical University. Informed consent was acquired from each patient. HCC and cirrhosis were diagnosed as described elsewhere [17]. For cirrhosis cases, there were 92 male (age 40-78 years, median 53) and 44 female (age 42-79 years, median 62.5) patients. For HCC patients, 41 males (age 44-78 years, median 61) and 9 females (age 49-72 years, median 63) were enrolled. All patients were randomly divided into a training group (~80% cases) and a prediction group (the left ~20% patients). The training group was used to construct a diagnosis model and the prediction group was utilized to test the applicability of the model. All the tested samples were collected in the form of DBSs as described elsewhere [18]. Briefly, fasting blood samples were collected onto aseptic filter paper by finger puncture. Each specimen paper was dried at room temperature and then stored at 4°C. For each analysis, a DBS disc of 3 mm diameter was punched out.

MS analysis

The DBS sample procession and MS analysis methods were identical to what had been described previously [17]. In brief, the DBS discs were placed into a 96-well plate containing metabolite extraction solution and isotope labeled quantitation standards individually. After the extract was dried by nitrogen flow, 1-butanol, and acetyl chloride were used for metabolite derivatization for each sample. Subsequently, every 100 μ l of 80% acetonitrile was employed to redissolve the individually derivatized sample. For metabolite quantitation, tandem MS analysis (MS/MS) was conducted by using AB SCIEX 4000 QTrap system (Framingham, MA). The equipment settings were identical to the previous report [17]. The target metabolites included 23 amino acids, 26 acylcarnitines, and 44 ratios derived from them. The detailed metabolite information could be retrieved from our previous study [17].

Statistical analysis

For HCC and cirrhosis differentiation, a partial least squares-discriminant analysis (PLS-DA) was carried out by employing SIMCA-P v13.0 (Umeå, Sweden) using the MS data. Parameters playing significant roles in group separation were determined by their corresponding variable importance in projection (VIP) [19]. According to the software, parameters of VIP >1 were kept. Differences in metabolite concentrations were evaluated by t-test using MINITAB v17.0 (State College, PA) and $P < 0.05$ was deemed as statistical significance. A binary logistic regression analysis was conducted to construct the differentiation model by using MINITAB v17.0. The utility of the model was evaluated by area under the receiver operating characteristic (ROC) curve.

Results

PLS-DA shows a clear separation trend between HCC and cirrhosis

For HCC and cirrhosis differentiation, a PLS-DA was carried out. The score plot showed that HCC and cirrhosis showed a clear separation trend (**Figure 1A**). A permutation test based on 100 iterations indicated that no over-fitting occurred in this PLS-DA model, implying the reliability of the model [17] (**Figure 1B**). This

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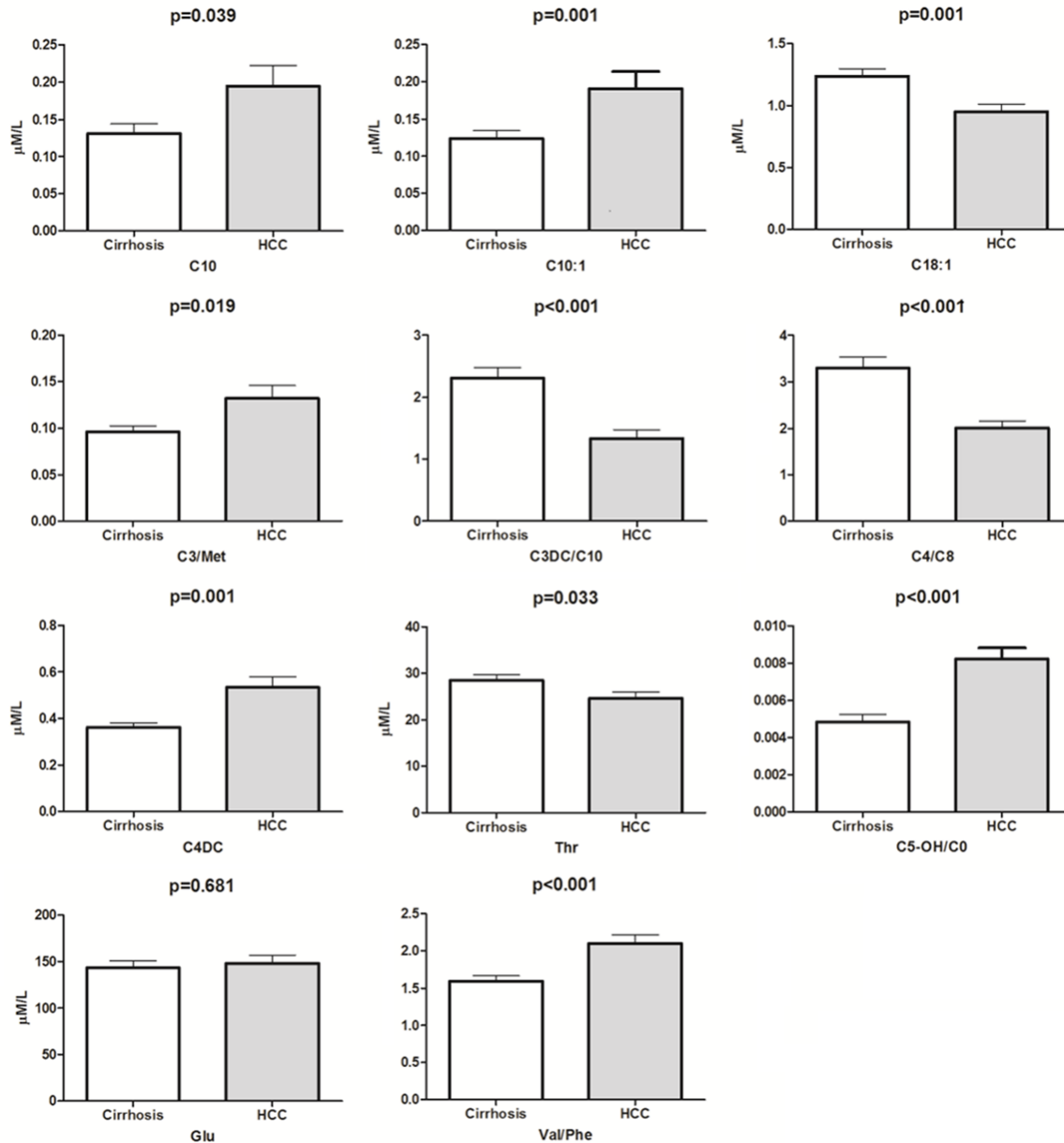


Figure 3. Concentration difference of the metabolite parameters in the regression model. C10: decanoylcarnitine; C3DC/C10: malonylcarnitine/decanoylcarnitine; C10:1: decenoylcarnitine; C18:1: octadecenoylcarnitine; Glu: glutamate; Thr: Threonine; Val/Phe: valine/phenylalanine; C5-OH/C0: 3-Hydroxy-isovalerylcarnitine/carnitine; C4DC: Methylmalonylcarnitine; C4/C8: butyrylcarnitine/octanoylcarnitine and C3/Met: propionylcarnitine/methionine.

permutation test ensured that some metabolites were of different concentrations in samples of HCC and cirrhosis. **Figure 1C** showed the metabolites that could be used to differentiate HCC and cirrhosis and their individual VIP values after multivariate analysis.

Metabolite parameters can be used for a satisfied diagnosis model

For differential diagnosis purpose, significantly different metabolites between the HCC and cir-

rhosis groups (**Figure 1C**) were subjected to binary regression analysis to construct a diagnosis model. This yielded a regression equation of $y = -0.94 - 7.97 C10 + 9.31 C10:1 - 2.71 C18:1 + 21.42 C3/Met - 0.841 C3DC/C10 - 1.048 C4/C8 + 2.53 C4DC + 188.6 C5-OH/C0 + 0.01624 Glu - 0.0944 Thr + 1.003 Val/Phe$. When the cutoff value was set to -0.675, the regression model could realize the HCC diagnosis specificity of 88.1% and sensitivity of 87.5% (**Figure 2**). **Figure 3** showed the content

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Table 1. The odds ratios of the parameters in the regression model

Parameter	Odds ratio	95% confidential interval
C5-OH/C0	7.34×10^{81}	7.86×10^5 - 7.62×10^{157}
C3/Met	2.01×10^9	6.55×10^4 - 6.16×10^{13}
Val/Phe	2.73	1.02-7.27
Glu	1.02	1.00-1.03
C4DC	12.49	0.60 - 2.60×10^2
C10:1	1.10×10^4	0.59 - 2.08×10^8
C10	3.00×10^{-4}	0-3.01
Thr	0.91	0.84-0.99
C3DC/C10	0.43	0.19-0.97
C18:1	6.67×10^{-2}	8.80×10^{-3} -0.51

difference of the metabolites included in the equation. The individual odds ratios of the parameters were listed in **Table 1**. By using this model, 78% of the patients in the prediction group could be accurately diagnosed.

Discussion

Tumor cells conduct metabolism in an abnormal way compared to their normal counterparts. Patients suffering from various malignancies showed distinct serum metabolites changes. NBS pays attention to the metabolites fluctuation of some amino acids and acylcarnitines. Notably, cancer patients sometimes exhibited serum metabolites change profiles which were comparable to the findings in inherited disorders [20]. Thus, the traditional MS-based NBS strategy was intended to employ in this study to seek potential differential metabolites of HCC and cirrhosis.

This study showed that PLS-DA only exhibited a partial separation of HCC from cirrhosis (**Figure 1A**). Distinct separation could not be acquired. This might be due to the fact that most of the HCC patients have a background of cirrhosis. Although the partial overlap of the two groups, the PLS-DA model was acceptable. As the permutation test result did not indicate evidence of over-fitting of this PLS-DA (**Figure 1B**), metabolites played key roles in separating the HCC and cirrhosis groups were defined (**Figure 1C**) and could be readily used for subsequent differential analysis.

After regression analysis, 6 metabolites including 2 amino acids and 5 ratios were kept in the binary model. Most of them were involved

in acylcarnitines. Combined using these parameters really showed comparable diagnosis ability against traditional protein markers as showed in **Figure 2**. Additionally, except Glu, the others parameters exhibited a statistically significant difference between HCC and cirrhosis after univariate analysis (**Figure 3**).

In view of their individual odds ratios, C5-OH/C0, C3/Met, and Val/Phe seemed to be the most important risk factors for HCC (**Table 1**). Increased C5-OH was usually due to the deficiency or inactivity of 3-hydroxy-3-methylglutaryl-coenzyme A (HMG-CoA) lyase [21]. Currently, there are no reports on how this enzyme affects cancer development. Deficiency of HMG-CoA lyase really caused oxidative stress and contributed to liver damage [22]. Carnitine was reported to favor HCC therapy [23]. Apoptosis is thought to be a protective process against tumor development. In HepG2, one of the typical HCC cell lines, it was found that apoptotic cells showed decreased intercellular C3 [24]. As of Met, a recent report showed that patients suffering from hepatitis C virus infection showed higher serum Met concentrations compared to the HCC patients [25]. This evidence, combined with the findings in this study, coincide with the notion that deregulated lipid metabolism is related to HCC development.

Val and Phe are essential amino acids. The former, a branched-chain amino acid, is mainly metabolized in the muscle and the latter, an aromatic amino acid, is in the liver. Clinically, the ratio of branched-chain/aromatic amino acids is used to evaluate the liver functions state. The lower the level of the ratio, the worse the liver functions. A previous study demonstrated Val/Phe elevated in ischemic diseases [26]. Many solid tumors will suffer from ischemic state due to their rapid proliferation. This might help to explain the increased Val/Phe in malignant liver diseases.

Thr, C3DC/C10 and C18:1 seemed to be the risk factors for cirrhosis (**Table 1**). Thr is also one of the essential amino acids. A study carried out in Egyptian patients showed no serum Thr difference between cirrhosis and HCC patients [27]. This discrepancy might arise from different diet styles between Western and Eastern people. Additionally, the major reason for Chinese people's cirrhosis is hepatitis virus infection, especially hepatitis B virus. Whe-

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reas, the Western people's cirrhosis is mainly due to alcohol consumption. Whether the different reasons of cirrhosis might result in serum Thr difference should also be explored.

According to the results of this study, risk factors for HCC are most short- or medium-chain carnitines. Whereas the unfavorable factors for cirrhosis are largely long-chain carnitines (**Table 1**). C18:1 has been found to be closely linked to fibrosis in a cell model study [28]. A previous report demonstrated that long-chain fatty acid oxidation was impaired in hepatoma cells [29]. This might explain the findings of lower short-chain and long-chain carnitine ratio-C3DC/C10 in the HCC group.

In this study, a traditionally used DBS-based MS analysis was adopted to differentiate HCC and cirrhosis. By combined using 11 parameters, a feasible diagnosis model was formulated and could achieve satisfied HCC and cirrhosis differentiation. The diagnosis ability was comparable to that of the traditional protein biomarkers. If this tactic could be incorporated with traditional serum biomarker analysis, improved differentiation ability might be expected.

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Disclosure of conflict of interest

None.

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