Lipidomic signatures of post-hepatectomy liver failure using porcine hepatectomy models

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Background: Clinical diagnosis of post-hepatectomy liver failure (PHLF) can only be made on or after the 5th postoperative day. Biomarker for early diagnosis is considered as a critical unmet need.

Methods: Twenty domestic female crossbreed (Yorkshire-landrace and duroc) pigs underwent sham operation (n=6), 70% (n=7) and 90% (n=7) partial hepatectomy (PH). A comprehensive lipidomic analysis was conducted using sera collected at pre-operation (PO), 14, 30, and 48 h after PH using nanoflow ultrahigh performance liquid chromatography-electrospray ionization-tandem mass spectrometry.

Results: Of the 184 quantified lipids, 14 lipids showed significant differences between the two resection groups starting at 30 h after surgery. Four phosphatidylcholine (PC) plasmalogen species (P-16:0/16:0, P-18:0/18:2, P-18:0/20:4, and P-18:0/22:6) and PC 32:2 significantly increased in the 90% PH group while these returned to PO level after 30 h in the 70% PH group, presumably implying the failure markers. In contrast, eight triacylglycerol (TG) species (40:0, 42:1, 42:0, 44:1, 44:2, 46:1, 46:2, and 48:3) and sphingomyelin d18:1/20:0 showed an opposite trend, wherein they significantly decreased in the 90% PH group while these in the 70% PH group were abruptly increased until 30 h but returned to near PO levels at 48 h, implying the recovery markers. Same trends could also be observed in the level of whole lipid classes of PC plasmalogens and TGs, in addition to selected individual lipid species.

Conclusions: Characteristic lipidomic signatures of PHLF could be identified using large animal models. These candidates have a potential to serve as a tool for early diagnosis and may open new paths to the study to overcome PHLF.

Keywords: Biomarkers; liver failure; liver regeneration; lipidomics

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Introduction

Due to the extraordinary regeneration capability of the liver, liver resection has been used as an effective and safe therapy to treat tumors and is increasingly being used to cope with a variety of benign and malignant conditions (1,2). However, post-hepatectomy liver failure (PHLF) occurs with an incidence rate of 0.7–34% and is a predominant source of morbidity and mortality after liver resection (3-6). Therefore,
prevention, early diagnosis, and treatment of PHLF are important unmet needs in the treatment of liver diseases. PHLF is a postoperatively acquired deterioration in the ability of the liver to maintain its synthetic, excretory, and detoxifying functions, thus failing to meet one’s metabolic demands. It is known to be associated with the remnant liver volume as well as functional quality of liver parenchyma (1). The dominant underlying pathophysiology of PHLF is considered to be increased portal flow to reduced volume of liver parenchyma accompanied by the elevation of portal pressure, which leads to shear stress and injury to hepatic sinusoidal endothelium (7,8). Such injury process is initiated early after the liver resection and is sustained even before the clinical signs become evident.

Currently, the definition provided by the International Study Group of Liver Surgery (2) and the “50-50” criteria (9) are the most widely used methods for clinical diagnosis of PHLF; both criteria include serum bilirubin and prothrombin time. However, by definition, diagnosis can be made only at or after postoperative day 5, when damage to the remnant liver is already profound. Therefore, establishment of prognostic molecular markers enabling earlier diagnosis could be the most important step to develop strategies to overcome PHLF.

Lipids play important roles in various biological processes (10,11), and the liver plays important roles in lipid metabolism. Lipids are synthesized in the liver and exported to and from the rest of the body by lipoproteins (12). Lipid metabolism can be significantly altered during liver disease (13) or after liver resection (14-19), suggesting their potential to be used as biomarkers in the setting of PHLF. However, lipid profiles during PHLF have not been thoroughly examined. Considering the difficulties in the study using human-derived samples from this grave condition, a systematic lipidomic analysis at the molecular level using well-designed animal model is expected to provide an insight into the relation of PHLF with liver function and regeneration.

In this study, a comprehensive lipidomic analysis of pig serum samples obtained after extensive hepatectomy was carried out using nanoflow ultrahigh performance liquid chromatography with electrospray ionization mass spectrometry (nUHPLC-ESI-MS/MS), which could characterize various isoforms of lipid with the limit of detection (LOD) at low femtomole levels (20,21). The present study aimed to compare the time-dependent changes in the individual lipid levels after extensive hepatectomy to select potential prognostic lipid markers that can be utilized to predict the early stage of PHLF.

We present the following article in accordance with the ARRIVE reporting checklist (available at http://dx.doi.org/10.21037/atm-20-3596).

Methods

Animals and experimental groups

Twenty domestic female crossbreed (Yorkshire-landrace and duroc) pigs were employed in this study. The median age was 3 (range, 2–3) months, and body weight was 35.9 (32.8–43.0) kg. The animals were housed at 22±1 °C with a 12-h light/dark cycle with free access to water and food. Pigs were not fed for 8 hours before the operation. Pigs were divided into three groups: the 70% partial hepatectomy (PH) group (n=7), 90% PH group (n=7), and sham group (n=6) with the same open surgery except the liver resection. This study was approved by the Korea University Institutional Animal Care and Use Committee (IRB: KOREA-2017-0069-C3) and all animals were cared for in accordance with the National guidelines for ethical animal research.

Anesthesia and liver resection

All pigs were anesthetized in the following way. Initial sedation was carried out with an intramuscular injection of alfaxalone (4 mg/kg, Jurox Inc. North Kansas City, MO, USA), xylazine (1.5 mg/kg, Bayer Korea, Seoul, Korea), and azaperone (4 mg/kg, SF Inc., Ansan, Korea). A 6.5 mm endotracheal tube was inserted and anesthesia was maintained using 2% isoflurane (Hana pharm CO., LTD, Seoul, Korea) in oxygen titrated to a depth of anesthesia. Oxygen saturation and heart rate were monitored throughout the operation. Triple lumen central venous catheter (Cook medical LLC, Bloomington, IN, USA) was inserted via right jugular vein under direct visualization, fixed under the skin using tunneling method, and sutured with 2-0 nylon. This catheter remained in situ until sacrifice for blood sampling and intravenous fluid administration.

A midline laparotomy was performed extending from the xiphoid process to below the umbilicus. The liver was mobilized from ligamentous structures. The left lateral lobe, the left medial lobe, and the right medial lobe except the caudate area covering the inferior vena cava were resected for 70% hepatectomy. The second order or third order branch of the Glissonian pedicle was ligated to each lobe and parenchymal transection was performed using
the Kelly crushing method along the ischemic line. The left and middle hepatic veins were suture-ligated, and the right hepatic vein trunk was preserved for the right lateral lobe. For 90% hepatectomy, two-third of the remaining right lateral lobe was resected with the same maneuver. Abdominal wall was closed after adequate hemostasis. For pigs in the sham group, the abdominal wall was closed without liver resection after incision and exposure. After the surgery, 5% Hartmann dextrose (JW Pharmaceutical, Seoul, Korea) fluid was administered until sacrifice. In addition, ketoprofen (3 mg/kg, Ubtech, Anyang, Korea) was injected subcutaneously once after surgery. Each pig could access the food and water ad libitum in the post-operative phase.

**Serum samples and biomedical analysis**

Serum samples from all the animals were collected before skin incision and at seven time points after the operation (1, 6, 14, 22, 30, 38, and 48 h). Animals were sacrificed 48 hours after hepatectomy. The levels of aspartate aminotransferase (AST), alanine aminotransferase (ALT), total bilirubin (TBIL), and prothrombin time as international normalized ratio (PT-INR) were measured for each animal at different time points before and after the operation (Chemical analyzer AU5800, Beckmann coulter Inc., Brea, CA, USA and Blood Coagulation Diagnosis analyzer, Diagnostica Stago Inc., Parsippany, NJ, USA). A total of 80 serum samples (PO, 14, 30, and 80 h) were used for lipid analysis. Serum samples were stored at −80 ℃ until lipid extraction.

**Materials and reagents for lipid analysis**

A total of 38 lipid standards were utilized to optimize nUHPLC-ESI-MS/MS run conditions: lysophosphatidylcholine (LPC) 16:0, 17:0, phosphatidylcholine (PC) 12:0/12:0, 13:0/13:0, 16:0/16:0, PC plasmalogen P-18:0/22:6, lysophosphatidylethanolamine (LPE) 18:0, 17:1, phosphatidylethanolamine (PE) 12:0/12:0, 17:0/17:0, PE plasmalogen P-18:0/18:1, P-18:0/22:6, lysophosphatidylglycerol (LPG) 18:0, 17:1, phosphatidylglycerol (PG) 14:0/14:0, 15:0/15:0, lysophosphatidylinositol (LPI) 20:4, 18:0, 17:1, phosphatidylinositol (PI) 16:0/18:1, 18:0/18:0, 12:0/13:0, lysophosphatidylserine (LPS) 18:1, lysophosphatidic acid (LPA) 14:0, 17:0, diacylglycerol (DG) 16:0/18:1, 17:0/17:0, D4, triacylglycerol (TG) 18:0/18:1/18:1, 17:0/17:1/17:0 D4, sphingomyelin (SM) d18:1/16:0, d18:1/18:0, d18:1/17:0, ceramide (Cer) d18:1/14:0, d18:1/17:0, monohexosylceramide (HexCer) d18:1/16:0, d18:1/17:0, d18:1/24:0, and cardiolipin (CL) (14:0). Among these, 14 lipids with odd numbered acyl chain were used as internal standards (ISs) added to serum samples for quantitation of serum lipids. All lipid standards were purchased from Avanti Polar Lipids, Inc. (Alabaster, AL, USA). HPLC grade solvents were utilized for nUHPLC: MeOH, ACN, IPA, and H₂O were purchased from J.T. Baker (Phillipsburg, NJ, USA) and methyl-tert-butyl ether (MTBE), CHCl₃, NH₄HCO₃, and NH₄OH were purchased from Sigma-Aldrich (St. Louis, MO, USA). Fused silica capillaries with inner diameters of 20, 50, and 100 μm (360 μm outer diameter for all) were purchased from Polymicro Technology (Phoenix, AZ, USA). For the column packing, 1.7 μm ethylene bridged hybrid (BEH) particles unpacked from ACQUITY UPLC® BEH C18 column (2.1 mm × 100 mm) from Waters® (Milford, MA, USA) and Watchers® ODS-P C-18 particles (3 μm and 100 Å) from Isu Industry Corp. (Seoul, Korea) were utilized.

**Lipid extraction and nUHPLC-ESI-MS/MS analysis**

Lipids were extracted using the two-stage extraction method with MTBE/CH₃OH. For the lipid identification, a pooled serum sample was prepared for lipid extraction for each group by pooling the two serum samples [pre-operation (PO) and 48 h] in each group into a total volume of 100 μL. For targeted lipid quantitation, each sample was extracted individually. In both cases, 100 μL of serum was initially dried with N₂ gas using an Evatros Mini evaporator from Googung Engineering Co., Ltd. (Seoul, Korea). A total of 300 μL MeOH was then added to the dried sample and it was subsequently placed in an ice bath for 10 min. The dissolved serum was mixed with 1000 μL MTBE and vortexed for an hour. After vortexing, 250 μL of H₂O was added to the mixture followed by vortexing for 10 min and centrifugation at 1000 xg for 10 min. The upper organic layer was transferred to another tube and 300 μL MTBE was added to the remaining lower aqueous layer followed by tip sonication for 2 min and centrifugation at 1000 xg for 10 min. The resulting upper phase was then mixed with the previously collected organic phase. The final mixture was dried under N₂ gas and the dried lipids were re-dissolved in MeOH:CHCl₃ (9:1 v/v) and stored at −80 ℃. For nUHPLC-ESI-MS/MS analysis, the frozen lipid sample was diluted to final concentration of 5 μg/μL using MeOH:H₂O (8:2, v/v).

Two nUHPLC-ESI-MS/MS systems were employed...
in this study. For non-targeted lipid identification, pooled serum samples were analyzed by Thermo Fischer Scientific™ UltiMate™ 3000 RSLCnano System coupled with Thermo LTQ Velos ion trap mass spectrometer which was purchased from Thermo Fischer Scientific (Waltham, MA, USA). For the identification of lipid molecular structure, data-dependent collision induced dissociation experiments were accomplished during nUHPLC-ESI-MS/MS. Identified lipids were quantified by using nanoACQUITY UPLC system from Waters (Milford, MA, USA) coupled with TSQ Vantage triple-stage quadrupole mass spectrometer from Thermo Fischer Scientific. For data-dependent collision induced dissociation experiments, 40% normalized collision energy was utilized. Identification of the lipid molecular structures was achieved using LiPilot, a PC-based software in our laboratory (22).

nUHPLC-ESI-MS/MS analysis of lipids

The analytical column was prepared in our laboratory by packing 1.7 μm BEH C18 beads in a silica capillary (100 μm inner diameter) of which one end of tube was pulled into a sharp needle by flame to be used as a direct emitter for ESI. Prior to column packing, the pulled tip was packed with 3 μm Watchers ODS-P C18 particles to make self-assembled frit for 0.5 cm. The column was connected with a capillary tube (50 μm inner diameter) from the UHPLC pump via PEEK micro-cross, of which the remaining two ports were connected to a Pt wire for voltage supply and a pressure capillary (20 μm inner diameter) terminated with an on/off switching valve to split pump flow. The latter valve was closed during sample loading and open during separation so that the flow rate entering the column was adjusted to 300 nL/min.

Mobile phase solutions were (9:1, v/v) H2O:CH3CN for A and (2:2:6, v/v/v) CH3OH:CH2CN:isopropanol for B, both were added with 0.05% NH4H and 5 mM NH4HCO3 as a mixed ionization modifier. For non-targeted analysis, 2 μL of lipid extract sample (5 μg/μL) was loaded with 99% A at a flow rate of 700 nL/min for 10 min. After loading, the pump flow rate was increased to 7.5 μL/min with the switching valve on so that the dwell time can be minimized with the splitting of flow entering the column at 300 nL/min. Gradient elution at positive ion mode began with 65% B to 85% B for 7 min, further increased to 95% during 25 min, and then ramped to 99% for 2 min. After maintaining at 99% B for 10 min, it was resumed to 1% B for column reconditioning. Gradient at negative ion mode began with 60% B by ramping to 70% for 5 min., increasing to 95% for 30 min., and further to 99% for 4 min. After maintaining at 99% for 10 min, it was resumed to 1% B. For lipid detection, a precursor MS scan was set to m/z 300–1,500 amu with 3.0 kV of ESI voltage for both positive and negative ion modes.

For targeted quantification of lipids, 2 μL of individual serum sample added with a mixture of odd-numbered standards (2 pmol each) was loaded to column with 100% A at a flow rate of 800 nL/min for 10 min. After loading, the flow rate was adjusted to 15 μL/min with the column flow rate at 300 nL/min. Gradient elution began with 55% B and it was increased to 90% for 10 min, to 95% for 2 min, and further to 100% for 8 min. After maintaining at 100% B for 5 min, it was resumed to 100% A for 5 min. For quantification of lipids, selected reaction monitoring (SRM)-based analysis was made by scanning precursor ion and a selected product ion with specific CID energies in the polarity switching mode (alternating detection at positive and negative ion mode). Types of precursor ion and specific product ion for SRM quantification are listed in Table S1. While ESI voltage was fixed at 3 kV, collision energy was assigned differently depending on the lipid classes: 20 V for LPE and PE, 25 V for LPA, DG, and TG, 30 V for LPC and LPG, 35 V for PC and Cer, 40 V for PG, LPI, SM, HexCer, and CL, 45 V for Hex2Cer, and 50 V for PI. The amount of individual lipid species was determined by calculating the corrected peak area which is the ratio of peak area of a lipid species to the area of IS specific to each lipid class. The lipid classes of PC, PE, and TG were quantified by the total numbers of acyl chain and the double bonds because SRM quantification cannot distinguish the isomeric structures while their exact chain locations were identified in the non-targeted identification. All other lipids were quantified by the differences in chain location with each number of the double bond.

Statistical analysis

Results of biochemical analyses presented as mean with standard error were compared among groups using linear mixed models for repeated measurement. For lipidomic variables, data of each time point after the operation are presented as fold change compared to those of PO. In volcano plots, P values of lipid species were calculated using paired Student t-test or Wilcoxon signed-rank test as appropriate depending on the normality of data distribution. Comparison of each lipid class and species among three
groups were performed using Kruskal-Wallis test followed by Mann-Whitney U test with Bonferroni correction. The ROC analysis was performed and Pearson’s correlation coefficient was calculated for selected lipid species. Minitab 17 statistical software (http://www.minitab.com) was used for the principal component analysis and SPSS software (version 20.0, IBM Corp., Armonk, NY, USA) was used for all other statistical analyses. A P value <0.05 was considered significant, if not indicated otherwise.

**Results**

**Biochemical analysis after liver resection**

Serial changes of AST, ALT, TBIL, and PT-INR observed in three groups at PO, 1, 6, 14, 22, 30, 38, and 48 h after surgery are shown in Figure 1. All parameters in the sham group naturally maintained within the normal range at all time points. AST level at 22, 30, 38, 48 h and ALT level at 30, 38, 48 h after surgery were significantly higher in the 90% PH group than in the 70% PH group (P=0.015, P=0.013, P=0.017, and P=0.005, P<0.001, P<0.001, respectively). In terms of TBIL and PT-INR which are currently used to diagnose PHLF in a clinical setting, TBIL in the 90% PH group constantly increased from 14 h after surgery until the time of sacrifice and showed higher level at 38 and 48 h compared to 70% PH group (P=0.001, and P<0.001, respectively). PT-INR from 14 h after surgery was significantly higher in the 90% PH group than in the 70% PH group (P=0.004, P=0.002, P<0.001, P<0.001, and P<0.001, respectively).

**Figure 1** Postoperative evolutions of AST (A), ALT (B), TBIL (C), and PT-INR (D) among sham and each resection group. AST and ALT of the 90% PH group showed significantly higher values after 22 and 30 h, respectively, suggesting ongoing hepatocyte injury when compared to the 70% PH group. TBIL in the 90% PH group showed a tendency to increase above 1 mg/dL starting from 30 h after surgery and continued to increase until the time of sacrifice while that in the 70% PH group was almost normalized by the time of the sacrifice. PT-INR in the 90% PH group increased to around the level of 1.5 starting from 14 h after surgery and peaked at 30 h. In contrast, that of 70% PH group peaked around the level of 1.2 at 14 h after surgery, then followed the recovery trend observed in the sham group. Dots indicate the means, and whiskers indicate the standard error of the means. *, P<0.05 between 70% PH and 90% PH. PH, partial hepatectomy; PO, pre-operation; AST, aspartate aminotransferase; ALT, alanine aminotransferase; TBIL, total bilirubin; PT-INR, prothrombin time as international normalized ratio. Adapted from “Yoon KC, Do Kwon H, Jo HS, et al. Explorative study of serum biomarkers of liver failure after liver resection. Sci Rep 2020;10:9960.” Permission of reprint was waived according to the copyright policy of Scientific Reports.
Global identification of lipids and alterations in lipid levels upon extent of liver resection

Performance of nUHPLC-ESI-MS/MS runs used for the non-targeted lipid identification of serum lipids is illustrated in Figure S1 with the base peak chromatograms of standard lipids obtained at both positive and negative ion modes of MS detection. The average peak width and the average relative standard deviation in the retention time of lipid standards are 16.2±7.7 s and 0.4%±0.5%, respectively, along with LOD in the range of 0.006 (LPG 17:1)–0.097 pmol (SM d18:1/17:0), which was estimated from the calibration curves of standards spiked into the serum samples. LOD and limit of quantitation values for other lipid classes are listed in Table S2. For non-targeted lipid identification, a pooled serum sample from each group was utilized (Figure S2) and a total of 284 lipids were identified with their molecular structures. Among them, 184 lipids were quantified by SRM method as the quantification of lipids belonging to PC, PE, TG, and CL was carried out using the total number of acyl chains and double bonds. Quantification was accomplished with individual samples collected at different time points.

Changes in the lipid levels in each group at 30 h and 48 h after operation are illustrated in Figure 2 using the Volcano plots. The plots show the decreasing trends in many lipids at 30 and 48 h after operation when compared to PO. Apparently, more species in the 90% PH group showed decreased level as compared to the 70% PH and sham groups. Data for all quantified lipid levels are listed in Table S3 and the isomeric chain structures of PC, PE, and TG species are listed in Table S4.

Overall difference in the lipid profiles at different time points after the resection was investigated with principal component analysis plot (Figure 3). While the data points of the 70% PH at 30 h are clustered away from those at 14 h, those at 48 h are located between the clustered points for 14 and 30 h. However, data points of the 90% PH at three different time points are clustered nearby, demonstrating that the changes in the lipid profiles were not distinctive at different time points. This is clearly different from the pattern observed for the 70% PH group, implying that changes in the lipid profiles are correlated with the recovery of the liver function upon the degree of resection. Moreover, variations in the lipid profiles of individual animals after resection were not as large as those observed within the sham group, representing that the influence of liver resection on the lipid profiles is much larger than individual differences in the recovery capacity upon the sham surgery.

Alterations in lipid classes

Alterations in the level of each lipid class at different time points are displayed in Figure 4. Among 16 lipid classes, three classes (PE, PC plasmalogen, and TG) shown in Figure 4A exhibited a significant difference (>2-fold and P<0.05) at 30 h between the two resection groups. Level of PC plasmalogen was significantly increased in the 90% PH group, while those of PE and TG were increased in the 70% PH group at 30 h. On the other hand, four classes (LPC, LPE, LPA, and LPI) indicated in Figure 4B exhibited no large difference between the two resection groups until 30 h but showed a significant difference at 48 h. Lipid levels of these four classes in both resection groups showed a common trend in which they appeared to decrease at 14 h and tended to recover at 30 h; however, these two resection groups showed an opposite trend at 48 h in which the 90% PH group failed to recover while the 70% PH group appeared to recover continuously. Thus, these four lipid classes can be potential candidates for distinguishing the recovery status after 48 h. The sham group without the liver resection showed more than 50% increases in LPC, LPE, and LPI levels at 14 h but then decreased to the level of PO, indicating that the increased production of these lipid classes from the liver may indicate a recovery from injury induced by anesthesia, opening, and closure. The remaining nine lipid classes (LPG, PG, PC, PI, DG, SM, Cer, HexCer, and CL) did not show significant changes between the two resection groups as illustrated in Figure S3.

Alterations in the individual lipids

Alterations in the individual lipid levels can be viewed by the Z-score heat map based on lipid species with significant changes (>2-fold and P<0.05) between the two resection groups in Figure 5. Especially, lipid species in PC, PC plasmalogen, and TG exhibited striking differences between the two resection groups.

The data were further screened in two ways to select lipid species which showed a significant change over time. First, we selected lipid species which changed more than 2-fold with P<0.01 between the two resection groups both at 30 or 48 h after the operation. From 184 quantified lipid species, 12 lipid species showed significant differences between the two groups from 30 h; however, only 9 among them
Figure 2 Volcano plot based on fold ratio (vs. PO) of each lipid species at 30 and 48 h in (A) the sham, (B) the 70% PH, and (C) the 90% PH groups. Data are presented as the log2 (fold change of individual lipid) on the x axis and the -log10 (P value) on the y axis. The horizontal dashed lines represent the P value at 0.05, and the vertical dotted lines represent the 2-fold decrease (A,B,C) and increase. Data points in the left upper domain of each plot represent for lipids that were decreased by more than 2-fold with P<0.05, and those in the right upper domain represent for lipids that were increased by more than 2-fold with P<0.05. The plots show the decreasing trends in many lipids at 30 and 48 h after liver resection when compared to PO. Apparently, the level decreased for more species in the 90% PH group as compared to the 70% PH and sham groups. PO, pre-operation; PH, partial hepatectomy.
Figure 3 Principal component analysis plots showing the differences in the lipid profiles of the sham, 70% PH, and 90% PH groups at 14, 30, and 48 h after operation. Plots were based on lipid species showing significant changes (>2-fold and P<0.05) either in the 70% PH or the 90% PH group at 30 or 48 h after the operation. Each point in the plot represents the whole lipid profile of each animal at the specified time point. Data points in three experimental groups are showing distinctive clustering patterns with time point, respectively. Apparently, data points of the 70% PH group at 14, 30, and 48 h are clustered away from each other, indicating that the lipid profiles changed significantly after liver resection over time. However, data points of 90% PH group are clustered away from those of both sham and 70% PH group without significant change over time. PH, partial hepatectomy.

maintained the difference at 48 h as shown in Figure 6A. While the four PC plasmalogens (P-16:0/16:0, P-18:0/18:2, P-18:0/20:4, and P-18:0/22:6) continuously increased until 30 h in the 90% PH group, their levels in the 70% PH group increased to some degree at 14 h but returned to the level similar to those at PO after 30 h. As expected from Figure 4, five TG species (40:0, 42:0, 44:1, 44:2, and 48:3) continuously decreased after 90% PH, however, their levels in 70% PH were increased abruptly to a larger degree (4~6 folds) at 30 h followed by decreases at 48 h; the levels at 48 h were nonetheless much higher than those observed for extended resection. TG and PC plasmalogen exhibited an opposite trend between the two resection groups. The acyl chain structures of these TG species are relatively saturated or monounsaturated short chains composed of 14 and 16 carbons.

Next, we screened lipid species showing significant (P<0.05) differences between the two groups either from 14 or 30 h and maintaining significant differences thereafter; this selection yielded 14 lipid species. When these were compared with the lipid lists selected in the previous steps, all nine lipid species in Figure 6A were found to have been re-selected. The fold change plots of the five additional species (PC 32:2, TG 42:1, 46:1, 46:2, and SM d18:1/20:0) are displayed in Figure 6B.

Receiver operating characteristic (ROC) analysis and the linear correlation

To investigate the usefulness of the selected 14 lipid species showing significant differences as candidate markers, the ROC analysis was performed. In addition, Pearson correlation coefficient (r) was calculated to find out the relationship between each lipid species at 30 h and TBIL level or PT-INR. The resulting area under curve (AUC) values of ROC analysis and Pearson correlation coefficient (r) are listed in Table 1. When individual lipid species were analyzed using ROC analysis, their AUC values were larger than 0.900 for all the lipid candidates. On the other hand, calculation of Pearson correlation coefficient (r) for each lipid species in combination with TBIL and PT-INR, respectively, showed that all 4 PC plasmalogens were found to be highly correlated (r>0.7) with, both, TBIL and PT-INR.

Changes in PC and LPC species depending on the extent of resection

Since LPC is produced from PC via lecithin-cholesterol acyltransferase (LCAT) (23), decrease in LPC can be attributed to the reduced activity of LCAT, the production of which in the liver was reduced upon resection. Thus, extended liver resection may result in the substantial decrease in LPC level. To investigate the change in LPC levels in accordance with the corresponding PC molecule, the fold-change plot of PC 32:2, which was contributed from three PC molecules of different acyl chain combinations (PC 14:0/18:2, PC 16:0/16:2, and PC 16:1/16:1) was compared with those of the three possible LPC products (LPC 14:0, LPC 16:0, and LPC 16:1) in Figure 7. While PC 32:2 levels decreased at 30 and 40 h in the 70% PH group, those of the 90% PH group were not decreased, but were instead increased slightly. Levels of the
Figure 4  Plots of the fold changes (vs. PO) in lipid classes showing significant changes between the 70% PH and 90% PH groups (A) at 30 h and (B) at 48 h after the operation. Dots indicate the means, and whiskers indicate the standard error of the means. *, >2-fold and P<0.05 vs. 70% PH group in the same time point. PO, pre-operation; PH, partial hepatectomy; PE, phosphatidylethanolamine; TG, triacylglycerol; PCp, phosphatidylcholine plasmalogen; LPC, lysophosphatidylcholine; LPE, lysophosphatidylethanolamine; LPI, lysophosphatidylinositol; LPA, lysophosphatidic acid.

Figure 5  Z-score heat map of lipid species showing significant fold-changes (vs. PO, >2-fold and P<0.05) between the 70% PH and the 90% PH at 30 or 48 h after the operation. Each row represents individual lipid species belonged to lipid class as indicated. Each column indicates the Z-score of lipids obtained from each pig at specified time point. Red color indicates increase in the level of lipid compared to that of PO, whereas blue color indicates decrease. Overall, lipid species in PC and PCp showed increase in 90% PH group, however, lipid species in the other classes showed increase in 70% PH group. The most striking differences between the two resection groups can be observed in lipid species of PC, PCp and TG. PO, pre-operation; PH, partial hepatectomy; LPC, lysophosphatidylcholine; PC, phosphatidylcholine; PCp, phosphatidylcholine plasmalogen; LPE, lysophosphatidylethanolamine; PE, phosphatidylethanolamine; PI, phosphatidylinositol; LPA, lysophosphatidic acid; TG, triacylglycerol; SM, sphingomyelin; Cer, ceramide.
three LPC species showed a recovering trend after 30 h for the 70% PH group but those observed with the extended resection were decreased at 48 h. This may support the hypothesis that the reduced production of LPC species is attributed to the deficiency of LCAT upon the failure of the liver function after extended resection.

**Discussion**

Considering the clinical significance of PHLF in surgical treatments of various liver diseases, current diagnostic methods have clear limitations with the requirement of better biomarkers to enable earlier diagnosis and development of potential treatments. An important hurdle in investigating PHLF in a clinical setting is difficulties in obtaining well-controlled investigational materials from patients in a reasonable time-frame. In contrast, various porcine models of hepatectomy for the study of liver failure have been developed (24-26), which can provide reasonable alternative research materials for this grave condition. Although a recent study reported a serum metabolic biomarker to predict mortality risk associated with extensive hepatectomy (27), lipidomic analysis to evaluate the time-dependent changes in the individual lipid levels using a PHLF model has not yet been investigated. We employed two PH models that have a different extent of liver resection. The 70% PH model was used as a normal recovery group after massive hepatectomy, considering that 30% of remnant liver volume is accepted to recover with its regenerative capacity (28). On the other hand, the 90%
Figure 7 Fold changes (vs. PO) of PC 32:2 and three LPC species (14:0, 16:0, and 16:1) showing difference with P<0.01 between the 70% PH and 90% PH group to investigate the change in LPC levels in accordance with the corresponding PC molecule. Those LPC species have the common acyl chain contained in these PC species. The level of PC 32:2 decreased in the 70% PH group at 30 and 48 h while that in the 90% PH group increased slightly. The levels of three LPC species in the 70% PH group decreased after the operation and recovered after 30 h, but those in the 90% PH group did not recover until the time of sacrifice. PO, pre-operation; LPC, lysophosphatidylcholine; PH, partial hepatectomy; PC, phosphatidylcholine.

Table 1 AUC of ROC analysis for the levels of lipid species selected as characteristic signatures to differentiate post-hepatectomy hepatic failure between 70% PH and 90% PH at 30 hours after the operation. Pearson correlation coefficient, r, value of each individual lipid was calculated in correlation with TBIL and PT-INR levels, respectively.

<table>
<thead>
<tr>
<th>Lipid species in Figure 6A</th>
<th>AUC</th>
<th>Pearson’s r</th>
</tr>
</thead>
<tbody>
<tr>
<td>Lipid only</td>
<td></td>
<td></td>
</tr>
<tr>
<td>PC P-16:0/16:0</td>
<td>0.980</td>
<td>0.776</td>
</tr>
<tr>
<td>PC P-18:0/18:2</td>
<td>0.980</td>
<td>0.858</td>
</tr>
<tr>
<td>PC P-18:0/20:4</td>
<td>0.980</td>
<td>0.793</td>
</tr>
<tr>
<td>PC P-18:0/22:6</td>
<td>0.980</td>
<td>0.860</td>
</tr>
<tr>
<td>TG 40:0</td>
<td>1.000</td>
<td>-0.677</td>
</tr>
<tr>
<td>TG 42:0</td>
<td>1.000</td>
<td>-0.710</td>
</tr>
<tr>
<td>TG 44:1</td>
<td>1.000</td>
<td>-0.572</td>
</tr>
<tr>
<td>TG 44:2</td>
<td>1.000</td>
<td>-0.514</td>
</tr>
<tr>
<td>TG 48:3</td>
<td>0.980</td>
<td>-0.461</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Lipid species in Figure 6B</th>
<th>AUC</th>
<th>Pearson’s r</th>
</tr>
</thead>
<tbody>
<tr>
<td>Lipid only</td>
<td></td>
<td></td>
</tr>
<tr>
<td>PC 32:2</td>
<td>0.959</td>
<td>0.574</td>
</tr>
<tr>
<td>TG 42:1</td>
<td>1.000</td>
<td>-0.454</td>
</tr>
<tr>
<td>TG 46:1</td>
<td>0.980</td>
<td>-0.506</td>
</tr>
<tr>
<td>TG 46:2</td>
<td>1.000</td>
<td>-0.591</td>
</tr>
<tr>
<td>SM d18:1/20:0</td>
<td>0.918</td>
<td>-0.541</td>
</tr>
</tbody>
</table>

Species marked with bold represent significant correlations (r>0.7 or <-0.7) with both TBIL and PT-INR. AUC, area under curve; ROC, receiver operating characteristic; PH, partial hepatectomy; TBIL, total bilirubin; PT-INR, prothrombin time as international normalized ratio; PC P, phosphatidylcholine plasmalogen; TG, triacylglycerol; SM, sphingomyelin.
PH model was regarded as a clinically relevant model to induce PHLF (29). Previous studies have reported that all animals in their PHLF model died before 51 h following hepatectomy (30). Therefore, end-point in the present experiment was set as 48 h following hepatectomy. The adequacy of experimental models used in this study is well supported by Figure 1. AST and ALT are present in the hepatocytes, and these enzymes leak into the serum when hepatocytes are damaged in various conditions (31). Therefore, higher AST and ALT levels in the 90% PH group indicated more ongoing hepatocyte injury compared to the 70% PH group. TBIL and PT-INR reflecting excretory and synthetic function of the liver (2) dramatically increased in the 90% PH group or showed returning trends toward baseline level in the 70% PH group over time. These four biochemical parameters are widely used to assess the functional status of the liver in a clinical setting.

The use of nUHPLC-ESI-MS/MS for lipid analysis greatly enhanced the resolution of lipid separation with the LOD at low femtomole levels as well as facilitated high speed, targeted quantification of several hundred lipids with only a few micrograms of lipid sample (20,21). Lipid species selected in Figure 6 can be classified into two subgroups. Four PC plasmalogens and PC 32:2, which showed significantly increased level in 90% PH group reflecting severity of injury or inflammation, can be considered as failure marker group. In contrast, 8 TGs and SM d18:1/20:0, which showed significant increase in 70% PH group and return to baseline by 48 h, can be considered as recovery marker group. Interestingly, the serial changes in lipid class of PC plasmalogen and TG showed the same trend as selected individual species (Figure 4A).

Plasmalogens are phospholipids that constitute a significant amount of total membrane lipids and are known to protect from oxidative damage (32). Plasmalogens are predominantly synthesized in the liver and excreted into blood stream as lipoproteins. In mammals, plasmalogens are enriched in brain, kidney and heart, however, the lowest amounts of plasmalogen are found in liver (32). The levels of PC plasmalogens between the two PH groups in this study exhibited clear differences. While PC plasmalogen levels of the 90% PH group were continuously elevated with the maximum at or around 30 h and then were maintained at high levels or slightly decreased, those of the 70% PH group were similar to or little lower than that of PO. One possible explanation for this finding is a dysregulated excessive synthesis of plasmalogens by the liver due to very large oxidative stress after excessive liver resection. Liver resection induces inflammatory response and oxidative stress, which may consume the antioxidant capacity to maintain the oxidative stress within certain range during normal recovery (33), as observed in the 70% PH group. However, if the extent of liver resection exceeds recoverable range facing excessive oxidative stress, the homeostasis of plasmalogen biosynthesis might be dysregulated, resulting in an abnormally high level of plasmalogens in the serum. Another potential mechanism is that the high plasmalogens levels in the serum of the 90% PH group might originate from injury in remote organs inflicted by acute liver failure after extensive liver resection. It is well known that kidney and brain can exhibit remote organ injury from acute liver failure (34). Though the plasmalogen level in the liver is very low, the serum levels of plasmalogen in patients with mild liver inflammation or dysfunction such as non-alcoholic steatohepatitis were significantly decreased in comparison to those of healthy controls, which could be due to peroxisomal dysfunction and/or impaired hepatic biosynthesis of plasmalogens (35). In contrast, kidney and brain contain high levels of plasmalogen and are easily injured in the setting of acute liver failure suggesting that high levels of plasmalogen in the serum of the 90% PH group could originate from the remote injury in kidney or brain.

It has long been recognized that the regenerating liver generates signals that couple release of fatty acids from peripheral adipose stores to augment the hepatic fatty acid uptake and leads to rapid accumulation of intracellular TG (15,36-38); nonetheless, there is a controversy regarding an increase in the secretion of TG into the blood during regeneration (36,39). TG is also known to be regulated by bilirubin (40). Studies have shown that bilirubin decreased the serum levels of total cholesterol and TG as it suppressed the expression of few protein factors involved in TG synthesis, which were elevated in the rat livers with diabetes (40). In the present study, the levels of most TGs showed an opposite trend at 30 h between 70% and 90% PH groups, suggesting that there were significant differences in TG metabolism and trafficking between the two groups; however, it remains unclear whether these contrasts were due to the difference in the capacity of liver regeneration or due to that of serum bilirubin levels at this time point. However, TG levels of the 90% PH group at 48 h dropped down significantly to make the difference between the two groups less significant than that at 30 h, suggesting less predictive power. Nevertheless, TG can be recognized as a recovery marker after the liver resection while PC plasmalogen can be considered as a failure
marker, provided PHLF occurs with the 90% PH group.

LPC levels were reported to decrease in the rat serum and liver after extended liver resection (19), which is similar to the observed decrease in this study (Figure 4). On the other hand, although the overall PC levels of the two resection groups were found to decrease in this study (Figure S3) similar to other report (19), that of PC 32:2 in 90% PH group was increased. Decrease in serum LPC levels was reported to be attributed to the resection-induced impairment of the liver, thus, reducing the production of albumin, which transports LPC through blood (41). Decrease in LPC can originate from the reduced activity of LCAT, which is accompanied by increase in certain PC species. Due to the decrease in the liver function upon resection, synthesis of LCAT in the liver is reduced, resulting in the decreased production of LPC. This may imply that the recovery in LPC levels at 48 h in the 70% PH group and the continuous decrease in the extended resection group strongly support the recovery and the failure of the liver function, respectively (Figure 7). Moreover, LCAT levels in patients with liver disease were reported to decrease upon increase in the bilirubin level (42). In our study, TBIL levels increased to 0.85±0.81 ng/dL (70% PH) and 1.37±0.47 ng/dL (90% PH) at 30 h, which was about 3–6 folds higher as compared to those at PO; however, at 48 h, the TBIL level further increased significantly in the extended resection group (2.30±1.15 ng/dL) whereas it decreased to 0.58±0.96 ng/dL for the 70% PH. This supports the increase in the TBIL level at 48 h caused by the liver damage is correlated with the decrease in LCAT level and further to LPC levels.

Considering both that serum TBIL and PT-INR are the most widely used biochemical parameters reflecting liver function and that they cannot accurately predict PHLF by postoperative day 5, significant correlation of certain lipid species with those in the early postoperative period does not necessarily imply higher potential as a biomarker. Rather, human-derived studies are warranted to establish a model for predicting PHLF in the early postoperative period by combining the recovery and failure lipid markers identified in this study. Eventually, it may pave the way to overcome PHLF by enabling the rapid application of potential treatments and evaluating their effects.

Conclusions

Although the present study was conducted with limited number of animals using experimental settings at its extreme, the results revealed the potential of the utilization of lipid species as markers to distinguish the early stage of PHLF after the liver resection, which can be critical for early diagnosis and helpful to develop a timely intervention for the recovery.

Acknowledgments

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Footnote

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Ethical Statement: The authors are accountable for all aspects of the work in ensuring that questions related to the accuracy or integrity of any part of the work are appropriately investigated and resolved. This study was approved by the Korea University Institutional Animal Care and Use Committee (Institutional Review Board: KOREA-2017-0069-C3) and all animals were cared for in accordance with the National guidelines for ethical animal research.

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