

DHCR7 Expression Predicts Porsusor Outcomes and Mortality From Sepsis

IMPORTANCE: This is a study of lipid metabolic gene expression patterns to discover precision medicine for sepsis.

OBJECTIVES: Sepsis patients experience poor outcomes including chronic critical illness (CCI) or early death (within 14 d). We investigated lipid metabolic gene expression differences by outcome to discover therapeutic targets.

DESIGN, SETTING, AND PARTICIPANTS: Secondary analysis of samples from prospectively enrolled sepsis patients (first 24 hr) and a zebrafish endotoxemia model for drug discovery. Patients were enrolled from the emergency department or ICU at an urban teaching hospital. Enrollment samples from sepsis patients were analyzed. Clinical data and cholesterol levels were recorded. Leukocytes were processed for RNA sequencing and reverse transcriptase polymerase chain reaction. A lipopolysaccharide zebrafish endotoxemia model was used for confirmation of human transcriptomic findings and drug discovery.

MAIN OUTCOMES AND MEASURES: The derivation cohort included 96 patients and controls (12 early death, 13 CCI, 51 rapid recovery, and 20 controls) and the validation cohort had 52 patients (6 early death, 8 CCI, and 38 rapid recovery).

RESULTS: The cholesterol metabolism gene *7-dehydrocholesterol reductase* (*DHCR7*) was significantly up-regulated in both derivation and validation cohorts in poor outcome sepsis compared with rapid recovery patients and in 90-day non-survivors (validation only) and validated using RT-qPCR analysis. Our zebrafish sepsis model showed up-regulation of *dhcr7* and several of the same lipid genes up-regulated in poor outcome human sepsis (*dhcr24*, *sqlea*, *cyp51*, *msmo1*, and *ldlra*) compared with controls. We then tested six lipid-based drugs in the zebrafish endotoxemia model. Of these, only the *Dhcr7* inhibitor AY9944 completely rescued zebrafish from lipopolysaccharide death in a model with 100% lethality.

CONCLUSIONS: *DHCR7*, an important cholesterol metabolism gene, was up-regulated in poor outcome sepsis patients warranting external validation. This pathway may serve as a potential therapeutic target to improve sepsis outcomes.

KEY WORDS: genetics; lipids; sepsis; transcriptomics; zebrafish

Sepsis is life-threatening organ dysfunction caused by a dysregulated host response to infection and is the costliest reason for hospital admission world-wide (1–4). It occurs when a systemic infection results in a dysregulated immune response that leads to organ dysfunction and potentially death (3). Survivors of sepsis are frequently left with reduced quality of life physical function, and long-term survival (5–7). Our group has defined and described clinically relevant outcomes that include early death (death within the first 14 d of sepsis), chronic critical illness (CCI, ICU stay > 14 d with organ dysfunction), and rapid recovery (neither early death nor CCI). CCI patients frequently develop the persistent inflammation immunosuppression and catabolism syndrome (PICS), characterized

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KEY POINTS

Question: Can lipid metabolism gene expression patterns distinguish between poor versus favorable outcomes in sepsis and can they be used to identify drug targets for sepsis?

Findings: In this prospective cohort study with a derivation/validation design, the cholesterol metabolism gene *7-dehydrocholesterol reductase (DHCR7)* was significantly up-regulated in poor outcome sepsis compared with rapid recovery patients and in 90-day nonsurvivors. Blockade of *Dhcr7* in a zebrafish endotoxemia model led to complete rescue from death in a model with 100% lethality.

Meaning: *DHCR7* was up-regulated in poor outcome sepsis patients and may serve as a potential therapeutic target in sepsis.

by impaired physical function and 1-year mortality rates over 40% (7, 8).

We and others have described the protective role of lipids and lipoproteins in sepsis (9–12). High-density lipoprotein (HDL) has antioxidant and anti-inflammatory proteins (paraoxonase-1 and apolipoprotein A-I) that protect against lipid oxidation, prevent inflammatory cell activation and chemotaxis, bind and clear bacterial toxins, and down-regulate inflammatory pathways (9–17). Similarly low-density lipoprotein (LDL) may play a role in bacterial endotoxin clearance via the LDL receptor, particularly in gram negative sepsis, with proprotein convertase subtilisin/kexin type 9 playing an important regulatory role (18–21). However, dysregulated lipid metabolism occurs in sepsis leading to HDL's conversion to dysfunctional and pro-inflammatory HDL (Dys-HDL) that may play a role in progression of organ dysfunction, and the pathogenesis of CCI, and PICS (9, 22, 23).

Recent studies have shed some light on the genetic underpinnings of lipid metabolism in sepsis. A U.K. Biobank study identified an important link between genetically determined HDL cholesterol (HDL-C) levels and decreased risk of hospitalizations for infectious disease, lower odds of outpatient antibiotic usage, and reduced risk of mortality from sepsis (24). LDL cholesterol (LDL-C) and triglyceride levels did not confer the

same risk reduction (24). However, the U.K. Biobank population was of homogenous ancestry. Another study identified that a rare missense variant in the cholesteryl ester transfer protein (*CETP*) gene (lowers HDL-C levels) was linked with reductions in HDL-C during sepsis (25). Carriers of this risk allele had more severe organ failure and reduced 28-day survival.

Genetic studies of diverse cohorts are needed to understand the role of dysregulated lipid and lipoprotein metabolism in sepsis. This study sought to leverage a diverse prospective cohort of sepsis patients to investigate transcriptional profiles relevant to lipid metabolism in sepsis and associate these differences with relevant outcomes. The primary objective was to analyze leukocyte gene expression patterns of sepsis patients by clinical outcomes by performing both an unbiased RNA sequencing (RNA-seq) analysis and a focused analysis of relevant lipid metabolism genes (47 genes selected a priori). Results were corroborated in a zebrafish endotoxemia model, which further allowed the functional testing of genes relevant to sepsis. Zebrafish were selected as they are vertebrates that share many anatomic and physiologic similarities with humans, most aspects of the immune response, and nearly all elements of lipid and lipoprotein metabolism (26–28). These investigations may aid the identification of lipid metabolic pathways that are critical for regulating the response to sepsis and identifying new potential therapies.

METHODS

Design

We performed a secondary analysis of transcriptomic data from four prospective studies of sepsis patients enrolled between November 2016 and July 2022 from the emergency department at UF Health Jacksonville. All human studies were approved by the University of Florida Institutional Review Board (IRB-01, approved through September 18, 2025) and registered with clinicaltrials.gov (NCT02934997, NCT04576819, and NCT03405870). STrengthening the Reporting of OBservational studies in Epidemiology guidelines for observational studies were followed (29). Approval for all zebrafish work was granted by the Institutional Animal Care and Use Committee (IACUC protocol PRO00010679; expiration date March 10, 2025) at The University of Michigan (Animal Welfare Assurance

Number on file with the NIH Office of Laboratory Animal Welfare is A3114-01). All animal experiments were performed in accordance with the ARRIVE 2.0 guidelines (30).

Patient Selection and Enrollment

Patients enrolled in the UF JAX Sepsis Biobank were considered eligible for inclusion after IRB approval. UF Health Jacksonville emergency department patients meeting Sepsis-3 criteria were identified prospectively by trained research coordinators or providers within 24 hours of sepsis recognition (3). Patient enrollment occurred 7 days per week between the hours of 8 AM and 10 PM. Patients from three observational studies and one ongoing clinical trial (LIPid Intensive Drug Therapy for Sepsis Pilot) were included in this analysis (31, 32). Exclusion criteria were overall similar to prior studies (31, 32). Healthy controls were patients presenting to the emergency department (ED) with minor noninfectious complaints (e.g., medication refills, or similar) and with normal vital signs (excluded for fever, tachycardia, hypotension, or hypoxia). Patients were excluded if they had abdominal pain, bleeding, respiratory complaints, suspicion of viral or bacterial infection, or fever or infection in the week preceding enrollment. They were also excluded if they had received antibiotics in the preceding 2 weeks.

Data Collection

All clinical and laboratory data were reviewed and entered into a Research Electronic Data Capture database by trained research coordinators (33, 34). Prospectively collected data included demographics, place of residence, source of infection, and comorbidities. Clinical variables included triage and enrollment vital signs, Sequential Organ Failure Assessment (SOFA) score, timing of antibiotics, volume of IV fluids, vasopressor use and duration, and mechanical ventilation use and duration. Hospital length of stay (LOS), and ICU LOS were documented.

Clinical Outcomes and Adjudication

The primary outcome was one of three categories: 1) early death (within 2 wk of sepsis onset), 2) CCI (total ICU stay > 14 d with organ dysfunction or total ICU ≤ 14 d but discharged to long-term acute care,

another hospital, or hospice), or 3) rapid recovery (all others) (8). Group adjudication by at least two clinician-investigators was performed for the sepsis diagnosis, primary outcomes, primary and secondary source of infection, culture positivity, and hospital disposition during sepsis adjudication meetings (35). Discrepancies were resolved by the inclusion of a third clinician-investigator. The social security death index was used to determine mortality for patients lost to follow-up. Twenty-eight ninety-day mortality was also recorded.

Blood Sampling, RNA-seq, and RT-qPCR Analysis

Blood was drawn at the time of enrollment and within 24 hours of sepsis recognition and before any clinical trial drug administration. Clinical laboratory testing included cholesterol levels, and SOFA score laboratory measures including platelets, creatinine, and total bilirubin levels. Serum total cholesterol, HDL-C, and triglyceride levels were directly measured from serum samples. LDL-C was calculated using the Friedewald formula (36). RNA-seq was performed using the Illumina NextSeq 550 system (San Diego, CA). Reverse transcriptase polymerase chain reaction (RT-qPCR) was performed using Bio-Rad (Hercules, CA) iQ SYBR Green Supermix (Cat no. 1708882). For details on RNA-seq and RT-qPCR refer to **Supplemental Digital Content** (<http://links.lww.com/CCX/B201>).

Zebrafish Experiments

Zebrafish were maintained according to protocols approved by the University of Michigan

Animal Care and Use Committee. All wild-type fish were a hybrid line generated by crossing AB and TL fish acquired from the Zebrafish International Resource Center (Eugene, OR). For details on cholesterol metabolism drug experiments, RT-qPCR, and RNA-seq analysis refer to Supplemental Digital Content (<http://links.lww.com/CCX/B201>).

Data Analysis

Univariate Comparisons. Presenting vital signs, cholesterol levels, demographic information, clinical features, and clinical management data across the outcome groups and by mortality (28 and 90 d) were

analyzed. We calculated medians and interquartile ranges for continuous variables and counts and proportions for categorical variables. To test for differences among outcome groups, we ran the Shapiro-Wilkes test of normality for each of the continuous variables. Only age was found to be normally distributed. Age was also found to have homogeneity of variances, per Bartlett's test, thereby meeting the requirements to use an analysis of variance procedure (37). For all other continuous variables, we used the nonparametric Kruskal-Wallis procedure. We used Fisher exact test to compare differences in categorical variables. We conducted a total of 28 tests comparing differences with the outcome group variable (Tables 1 and 2), then applied Bonferroni adjustment to proportionally correct our presented p values. Analysis and calculations were completed in R (R Statistical Software v4.1.2; R Core Team 2021; Vienna, Austria) using statistical tests from the Stats package.

Differential Expression Data Analysis

For data alignment, gene counts were obtained by aligning reads to the hg38 genome (GRCh38.p11) using STAR (38) (v.2.7.9a) and featureCounts (39) (v.2.0.3). We had two steps of analysis for the differential expression analysis: derivation and validation. We ensured a similar distribution of clinical outcomes across derivation and validation sets to detect differential expression patterns by outcome. To simplify the differential expression analysis, we combined early death and CCI patients into a "poor outcomes" group and compared them to rapid recovery patients who had more favorable outcomes. In a similar manner, we also performed a differential expression analysis by 90-day mortality. Twenty healthy control samples were analyzed with the sepsis samples in the derivation set to compare gene expression patterns between the broader cohort of sepsis patients to healthy controls. The same differentially expressed genes detection protocol was used for both the derivation and validation steps of analysis. We included samples from two duplicate patients (both included in the validation set) enrolled in the study during two different sepsis episodes, over 1 year apart. Data were analyzed with and without these two additional patient encounters; their inclusion did not change the significant differentially expressed genes and so these encounters were included in the final results. In brief, the differential

expression analysis was performed using DESeq2 (40) in R (R Statistical Software v4.1.2; R Core Team 2021). Gene counts were modeled with a negative binomial generalized linear model and adjusted for batch effects. Wald tests were conducted for pairwise comparisons. We identified genes with adjusted p values (i.e., p values after false discovery rate correction) less than 0.05 as the differentially expressed genes. We focused our analysis on a set of 47 prespecified lipid metabolism genes (Supplemental Digital Content—Table 1, <http://links.lww.com/CCX/B201>).

RESULTS

The analysis included 128 sepsis patient encounters and 20 healthy controls. The derivation cohort included 96 patients and controls (12 early death, 13 CCI, 51 rapid recovery, and 20 controls) and the validation cohort had 52 patients (6 early death, 8 CCI, and 38 rapid recovery). For sepsis patients, presenting vital signs were similar in outcomes. Distribution of comorbidities across the outcome groups was similar (Table 1). Initial LDL-C levels were significantly lower for patients with early death or CCI compared with rapid recovery patients. Total cholesterol, HDL-C, and triglyceride levels were not statistically significantly different between groups. CCI patients were significantly older (median 72 yr) than early death (median 61.5 yr) or rapid recovery (median 60 yr). Median SOFA and Acute Physiology And Chronic Health Evaluation (APACHE) II scores were significantly higher for CCI (11, 18, respectively) and early death (10, 21, respectively) compared with rapid recovery (5, 13, respectively) patients. There was a higher proportion of septic shock patients in the early death and CCI groups compared with rapid recovery. The most common source of infection was pulmonary (27%), urinary tract (25%), and multiple sources of infection (17%). There were no significant differences inpatient management characteristics (Table 2).

For the differential expression analysis, the derivation cohort had 96 single-end sequencing samples, including 12 early death, 13 CCI, 51 rapid recoveries, and 20 healthy control patient samples. The validation cohort had 58 paired-end sequencing samples of sepsis patients, including eight early death, 12 CCI, and 38 rapid recoveries. Patients included in the derivation cohort had a similar age, gender, and race distribution compared with patients in the validation set. With the

TABLE 1.
Demographic Features, Presenting Vital Signs, and Presenting Lipid Levels by Outcome

Variable	All Patients (n = 128)	Rapid Recovery (n = 89)	Chronic Critical Illness (n = 21)	Early Death (n = 18)	p
Demographic features					
Age (yr), median (interquartile range [IQR])	61.5 (56.0–70.0)	60.0 (54.0–66.0)	72.0 (65.0–78.0)	61.5 (57.0–65.8)	0.036 ^a
Gender, n (%)					
Male	76 (59%)	59 (66%)	9 (43%)	8 (44%)	1 ^b
Female	52 (41%)	30 (34%)	12 (57%)	10 (56%)	
Race, n (%)					
African American	71 (55%)	49 (55%)	13 (62%)	9 (50%)	1 ^b
Caucasian	54 (42%)	38 (43%)	7 (33%)	9 (50%)	
Other	3 (2%)	2 (2%)	1 (5%)	0 (0%)	
Presenting vital signs					
Systolic blood pressure (mm Hg), median (IQR)	112.0 (97.0–129.8)	115.0 (103.0–129.0)	106.0 (92.0–136.0)	102.5 (87.5–124.5)	1 ^c
Diastolic blood pressure (mm Hg), median (IQR)	61.0 (53.0–74.0)	61.0 (54.0–74.0)	65.0 (53.0–77.0)	60.5 (44.8–69.8)	1 ^c
Heart rate (beats/min), median (IQR)	97.0 (84.0–117.5) (1 missing)	97.0 (86.0–116.5) (1 missing)	88.0 (73.0–101.0)	106.0 (90.5–121.5)	1 ^c
Respiratory rate (breaths/min), median (IQR)	19.0 (17.0–22.5) (1 missing)	19.0 (16.0–22.0)	20.0 (16.0–24.0)	22.0 (19.0–26.0) (1 missing)	1 ^c
Temperature (F), median (IQR)	99.0 (98.1–100.5) (1 missing)	99.1 (98.1–100.7) (1 missing)	98.4 (97.7–99.3)	99.3 (98.4–100.2)	1 ^c
Oxygen saturation (%), median (IQR)	98.0 (95.0–99.0) (1 missing)	98.0 (95.0–99.0)	98.0 (96.0–99.3) (1 missing)	97.0 (95.0–99.0)	1 ^c
Presenting lipid levels					
High-density lipoprotein (mg/dL), median (IQR)	21.7 (13.1–34.6)	21.0 (13.8–34.5)	18.1 (10.0–30.0)	26.0 (14.7–35.8)	1 ^c
Low-density lipoprotein (mg/dL), median (IQR)	58.5 (29.3–84.8) (2 missing)	67.0 (47.0–99.0)	27.0 (21.0–61.1)	26.5 (17.8–45.3) (2 missing)	< 0.001 ^c
Triglycerides (mg/dL), median (IQR)	99.5 (58.8–142.3)	95.5 (47.0–131.0)	116.0 (65.0–144.0)	99.0 (69.8–153.0)	1 ^c
Total cholesterol (mg/dL), median (IQR)	90.9 (74.0–122.3)	102.0 (79.8–125.0)	75.0 (65.0–120.0)	76.5 (70.3–95.3)	0.709 ^c

^aOne-way analysis of variance.

^bFisher exact test.

^cKruskal-Wallis test.

TABLE 2.
Clinical Features and Management by Outcome

Variable	All Patients (n = 128)	Rapid Recovery (n = 89)	Chronic Critical Illness (n = 21)	Early Death (n = 18)	p
Clinical features					
T0 Sequential Organ Failure Assessment score, median (interquartile range [IQR])	6.0 (4.0–10.0)	5.0 (3.0–8.0)	11.0 (8.0–11.0)	10.0 (6.5–13.0)	< 0.001 ^b
Acute Physiology and Chronic Health Evaluation II score, median (IQR)	17.0 (11.0–21.0) (39 missing)	13.0 (9.0–18.0) (32 missing)	18.0 (14.8–29.0) (5 missing)	21.0 (17.8–25.0) (2 missing)	0.010 ^b
Vasopressor use (0/1), n (%)	57 (45%)	25 (28%)	15 (71%)	17 (94%)	< 0.001 ^c
Pressor duration ^a (hr), median (IQR)	41.0 (24.0–66.0)	34.0 (17.2–41.0)	43.0 (26.1–97.5)	62.1 (44.0–128.8)	0.343 ^b
Diabetes (0/1), n (%)	54 (42%)	38 (43%)	8 (38%)	8 (44%)	1 ^c
Chronic obstructive pulmonary disease (0/1), n (%)	18 (14%)	11 (12%)	3 (14%)	4 (22%)	1 ^c
End-stage renal disease (0/1), n (%)	15 (12%)	11 (12%)	3 (14%)	1 (6%)	1 ^c
HIV (0/1), n (%)	4 (3%)	4 (4%)	0 (0%)	0 (0%)	1 ^c
Primary infection source, n (%) (2 missing)					
Blood without another source	5 (4%)	4 (4%)	0 (0%)	1 (6%)	
Endocarditis	4 (3%)	2 (2%)	1 (5%)	1 (6%)	
Intra-abdominal	11 (9%)	6 (7%)	2 (10%)	3 (18%)	
IV catheter-related bloodstream	2 (2%)	1 (1%)	0 (0%)	1 (6%)	
Necrotizing soft tissue	1 (1%)	0 (0%)	1 (5%)	0 (0%)	
Other	3 (2%)	3 (3%)	0 (0%)	0 (0%)	
Pulmonary	39 (30%)	24 (27%)	10 (48%)	5 (28%)	
Skin/soft tissue	17 (13%)	14 (16%)	2 (10%)	1 (6%)	
Surgical site	1 (1%)	1 (1%)	0 (0%)	0 (0%)	
Surgical thoracic	1 (1%)	0 (0%)	1 (5%)	0 (0%)	
Unknown	1 (1%)	1 (1%)	0 (0%)	0 (0%)	
Urinary tract	42 (33%)	33 (37%)	4 (19%)	5 (28%)	

(Continued)

TABLE 2. (Continued)
Clinical Features and Management by Outcome

Variable	All Patients (n = 128)	Rapid Recovery (n = 89)	Chronic Critical Illness (n = 21)	Early Death (n = 18)	p
Treatment variables					
Time to antibiotics from triage (min), median (IQR)	120.0 (76.5–179.0) (1 missing)	122.0 (77.0–180.0)	109.0 (67.0–156.0)	134.0 (90.0–190.0) (1 missing)	1 ^b
Fluids volume in first 6 hr from triage (mL), median (IQR)	2,000 (1,000–3,137)	2,000 (1,000–3,000)	3,000 (1,500–3,330)	2,500 (1,000–3,500)	1 ^b
Mechanical ventilation use (0/1), n (%)	46 (36%)	16 (18%)	15 (71%)	15 (83%)	< 0.001 ^c
Mechanical ventilation duration (d), median (IQR) (2 missing)	2.9 (0.6–9.5) (2 missing)	2.3 (0.7–3.2)	7.8 (1.2–19.4) (1 missing)	4.5 (0.5–9.6) (1 missing)	1 ^b
Length of hospital stay (d), median (IQR)	8.0 (4.9–13.4)	7.1 (5.0–12.9)	19.5 (12.0–27.9)	6.3 (1.0–9.0)	0.044 ^b
ICU (0/1), n (%)	90 (70%)	52 (58%)	20 (95%)	18 (100%)	< 0.001 ^c
Length of ICU stay ^a (d), median (IQR)	5.0 (3.0–11.0)	4.0 (2.0–5.3)	17.0 (8.0–29.0)	7.5 (3.3–10.8)	< 0.001 ^b

^aStatistical test and comparisons were applied, respectively, for 57 patients on vasopressors and 90 patients in ICU.

^bKruskal-Wallis test.

^cFisher exact test.

exception of triglycerides, presenting cholesterol and lipid levels were similar between derivation and validation cohorts. They also had similar APACHE II and SOFA scores, proportions of shock patients, and clinical management (**Supplemental Digital Content, Tables 2 and 3**, <http://links.lww.com/CCX/B201>).

Figure 1 depicts the workflow for RNA-seq data analysis (**Fig. 1A**) and significantly differentially expressed genes for the derivation and validation cohorts (**Fig. 1B**) and by 90-day mortality (**Fig. 1C**). In the derivation cohort, 458 of 39,372 genes were differentially expressed by the patient outcome, including six of the 47 lipid metabolism genes of interest. In the validation cohort, 501 of 36,585 genes were identified as differentially expressed genes, including 2 lipid genes of interest. Of the 47 lipid metabolism genes of interest, there were 6 significant genes identified in the derivation cohort (*CYP51A1*, *DHCR24*, *DHCR7*, *MSMO1*, *SQLE*, and *LDLR*) and 2 genes identified in the validation cohort (*DHCR7* and *ALOX5*). All of these genes were up-regulated in early death/CCI patients when compared with rapid recovery patients. **Figure 2** displays heatmaps of differentially expressed genes for derivation and validation cohorts. Five of the significant derivation cohort genes encode enzymes that catalyze critical steps in the biosynthesis of cholesterol (*CYP51A1*, *DHCR24*, *DHCR7*, *MSMO1*, and *SQLE*). *CYP51A1* is critical for cholesterol synthesis, steroid synthesis, and drug metabolism (41). *LDLR* encodes the LDL receptor which endocytoses LDL-C from circulation (18). Both significant genes from the validation cohort were up-regulated in CCI/early death patients compared with rapid recovery. *ALOX5* is the critical enzyme for the generation of all leukotrienes, potent mediators of inflammation (42). The only gene identified to be significantly up-regulated in both cohorts was *DHCR7*. The log₂fold change in *DHCR7* expression between CCI/ED versus rapid recovery patients was 1.4020 in the derivation cohort, and 2.1563 in the validation cohort. All the differentially expressed genes for derivation and validation cohorts are presented in **Supplemental Data File 1** (<http://links.lww.com/CCX/B202>).

We performed a differential expression analysis by 90-day mortality. None of the lipid metabolism genes of interest were detected in the derivation cohort. However, *DHCR7* and *PLTP* were detected and up-regulated in the validation cohort (**Fig. 1**). *PLTP*

encodes a protein that is important for cholesterol and lipopolysaccharide clearance, and transfers phospholipids from triglyceride-rich lipoproteins. It also helps to regulate HDL size and is involved in cholesterol and lipopolysaccharide clearance (23).

We next examined gene expression in sepsis patients and healthy controls by RT-qPCR. Based on availability of total RNA, we picked 10 CCI, 12 early death, 12 rapid recovery patients, and 11 healthy controls for RT-qPCR. Demographics of patients included in RT-qPCR are presented in **Supplemental Digital Content, Table 4** (<http://links.lww.com/CCX/B201>). Five of the six genes (*LDLR*, *DHCR24*, *DHCR7*, *MSMO1*, and *SQLE*) identified in the RNA-seq analysis were significantly up-regulated in comparison to controls, whereas *CYP51A1* was not (**Supplemental Digital Content, Fig. 1**, <http://links.lww.com/CCX/B201>).

Workflow for zebrafish experiments with lipopolysaccharide versus controls is depicted in **Figure 3A**. RT-qPCR of cholesterol-related genes showed up-regulation of genes for the LDL receptor (*ldlra*, *ldlr*), *dhcr7*, *dhcr24*, *msmo1*, and *cyp51* in lipopolysaccharide-treated zebrafish compared with controls (**Fig. 3B**). Differential expression analysis of RNA-seq data from three lipopolysaccharide-treated zebrafish and three controls identified 12 lipid metabolism genes that were up-regulated in lipopolysaccharide-treated zebrafish compared with controls (**Fig. 3C**). Notably, six of the genes (*dhcr7*, *dhcr24*, *sqlea*, *cyp51*, *msmo1*, and *ldlra*) were also up-regulated in CCI/early death sepsis patients in the derivation cohort, as was *dhcr7* in the validation cohort. Overlap of significantly differentially expressed genes between derivation, validation, and zebrafish groups is depicted in **Figure 3D**. Gene primers for zebrafish experiments are noted in **Supplemental Data File 2** (<http://links.lww.com/CCX/B203>).

We tested several cholesterol metabolism drugs in our zebrafish model including AY9944 (*Dhcr7* inhibitor), triparanol (*Dhcr24* inhibitor), atorvastatin (HMG-CoA reductase inhibitor), torcetrapib (Cetp inhibitor), and ezetimibe (cholesterol absorption inhibitor). Results of all zebrafish drug experiments are displayed in **Supplemental Figure 2** (<http://links.lww.com/CCX/B201>). Varying concentrations of each drug were administered at 3 dpf (days postfertilization) with or without a dose of lipopolysaccharide that caused

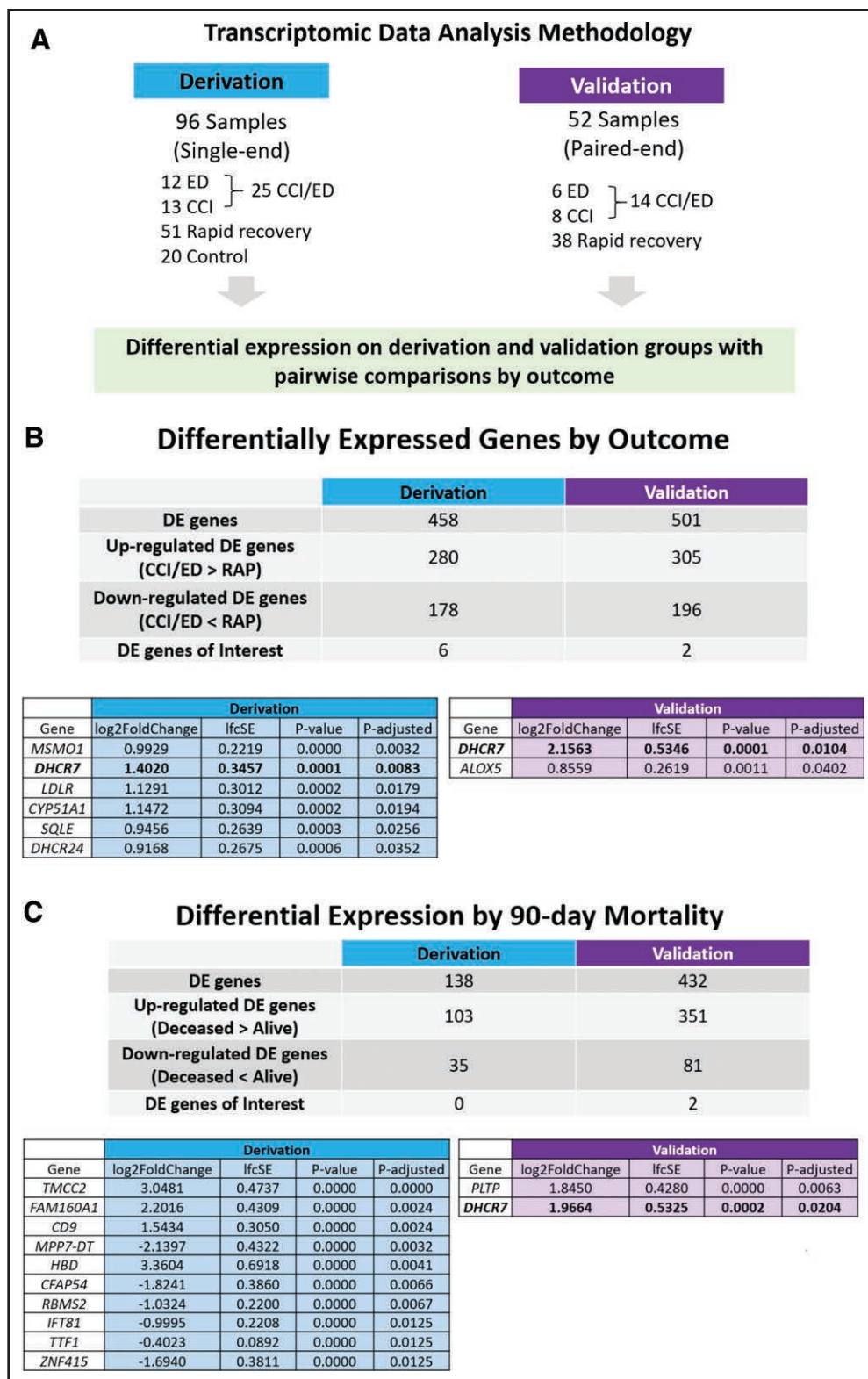


Figure 1. Transcriptomic data analysis methodology and results by outcome and mortality. **A**, Methodologic flow for transcriptomic data analysis for derivation and validation groups. **B**, Differentially expressed genes for derivation and validation groups by outcomes of chronic critical illness (CCI)/early death compared with rapid recovery. **C**, Differentially expressed genes for derivation and validation groups by 90-day mortality. ED = early death, RAP = rapid recovery.

complete lethality by 4 dpf. For AY9944 (*Dhcr7* inhibitor), 10–20 μ M of AY9944 alone showed no effects on survival. When administered with lipopolysaccharide, the 10 μ M dose led to partial protection against mortality, whereas 20 μ M resulted in 100% survival up to 6 dpf. None of the other drugs tested protected against lipopolysaccharide death.

DISCUSSION

In this study, we performed an unbiased differential expression analysis of leukocyte gene expression RNA-seq data from diverse, prospective cohorts of sepsis patients. We further investigated 47 lipid metabolism genes to delineate lipid metabolic changes in sepsis patients by outcome and identified *DHCR7* to be significantly and consistently up-regulated for patients with CCI/early death and in the 90-day mortality group when compared with healthy controls and rapid recovery patients. *DHCR7* encodes an enzyme that removes the double bond in the B ring of sterols and catalyzes the conversion of 7-dehydrocholesterol (7DHC) to cholesterol (43). 7DHC is also a precursor to vitamin D, catalyzed by *DHCR7* (43). In a parallel set of RNA-seq studies conducted in a zebrafish endotoxemia

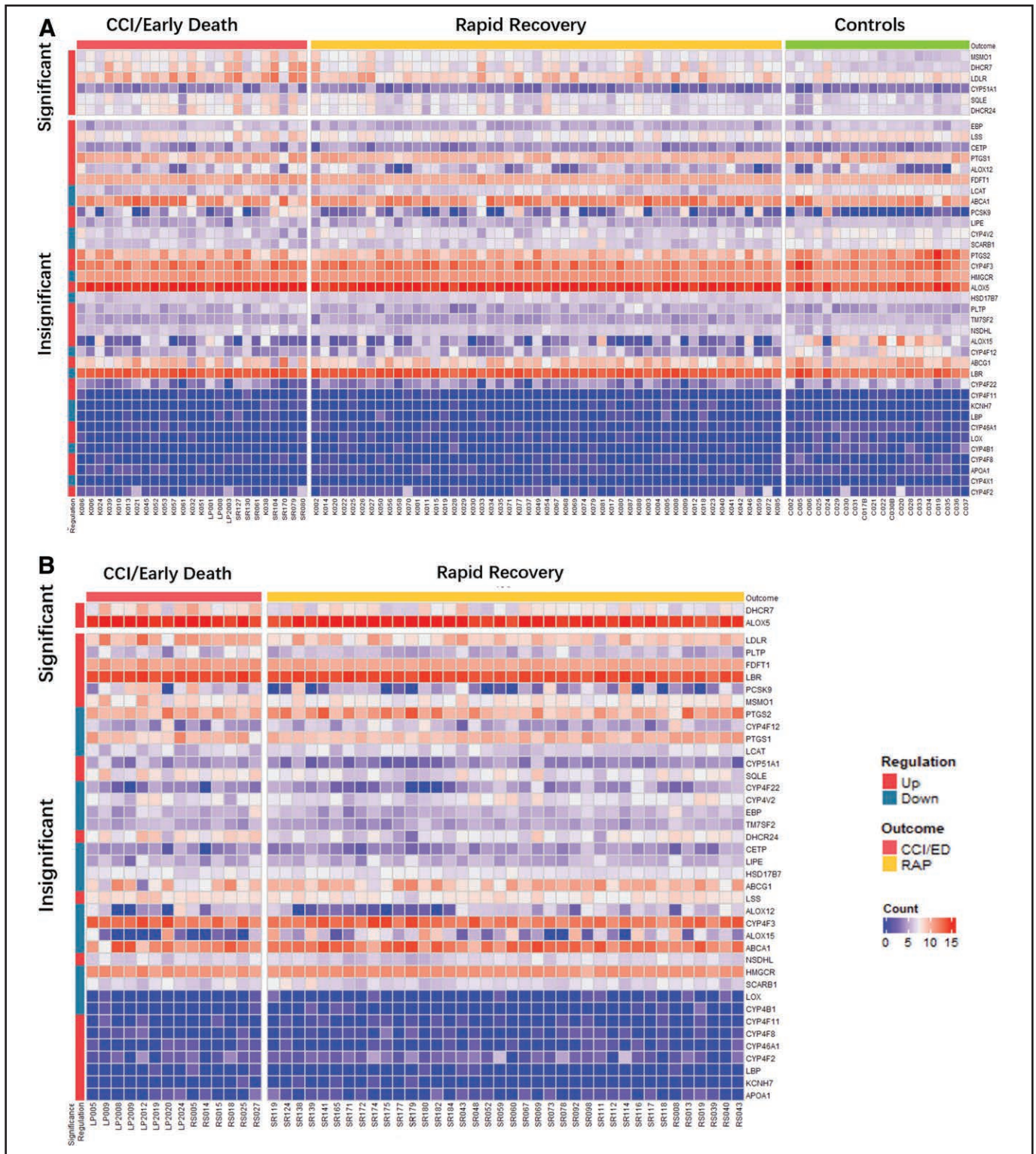


Figure 2. Heatmaps of differentially expressed genes for derivation (A) and validation (B) groups by outcomes of chronic critical illness (CCI)/early death compared with rapid recovery.

model, we observed that *dhcr7* was significantly up-regulated in samples from zebrafish that received lethal doses of lipopolysaccharide when compared with controls. Furthermore, pharmacologic blockade of *Dhcr7*

resulted in complete rescue from death. These results are consistent with *dhcr7* having a potential mechanistic link to endotoxic death in a zebrafish endotoxemia model.

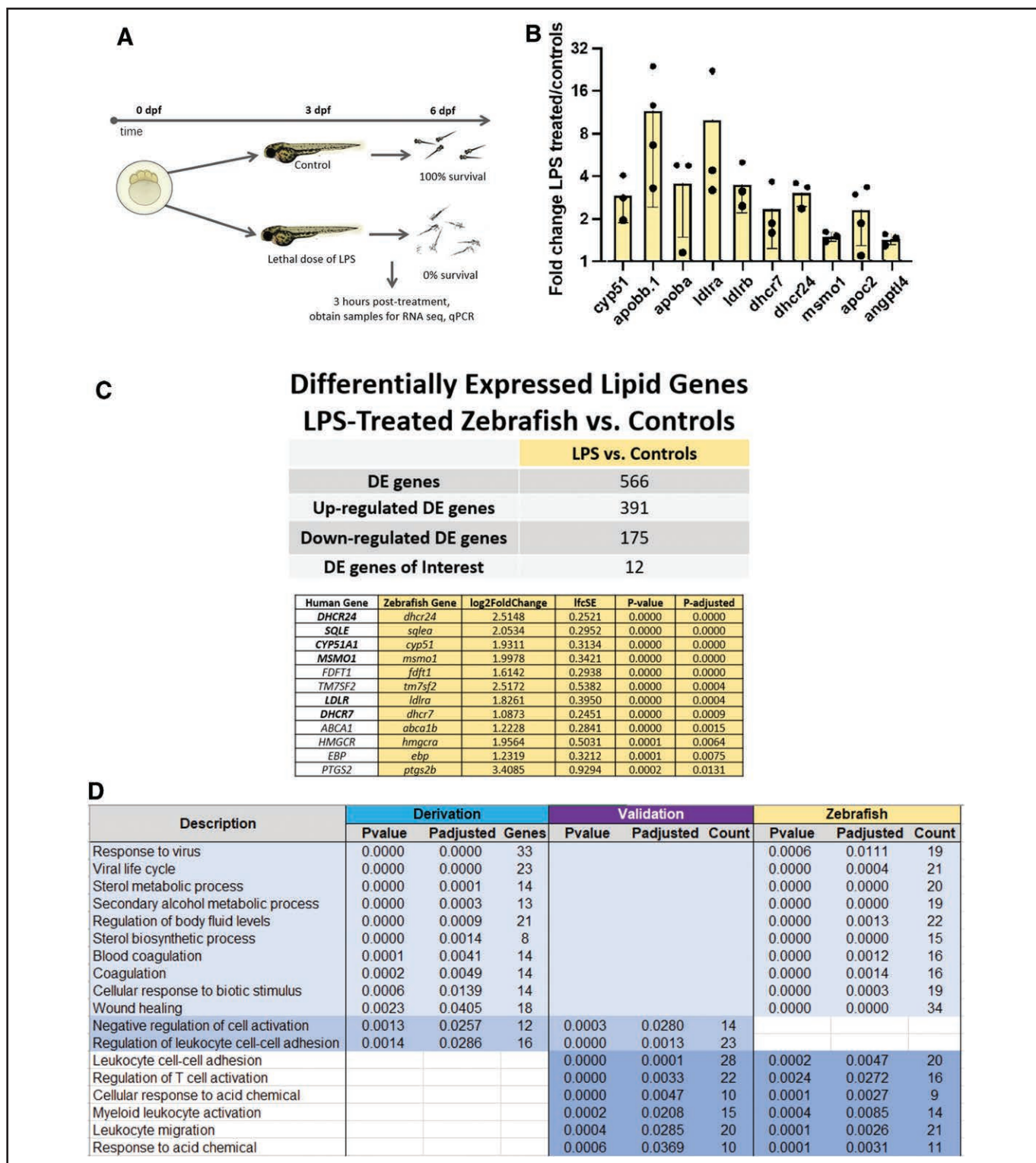


Figure 3. Drug testing in zebrafish model of endotaxemia. **A**, Methodology for zebrafish experiments. Zebrafish are treated with a lethal dose of lipopolysaccharide or maintained in control embryo medium at 3 (days postfertilization) dpf and examined for survival at 4, 5, and 6 dpf.

B, Reverse transcriptase polymerase chain reaction (RT-qPCR) of cholesterol related genes from lipopolysaccharide-treated fish versus controls 3 hours after treatment at 3 dpf. Data represented as fold change lipopolysaccharide/controls. A value of 1 would signify no change, value greater than 1 is up-regulation in lipopolysaccharide treated versus controls, and value less than 1 is down-regulation. Individual dots represent separate experiments. The graph bars represent mean and sd. **C**, Differential expression analysis of RNA sequencing (RNA-seq) data from three lipopolysaccharide-treated zebrafish and three controls identified 12 lipid metabolism genes that were up-regulated in lipopolysaccharide-treated zebrafish compared with controls. **D**, Overlap of significantly differentially expressed genes between derivation, validation, and zebrafish groups.

DHCR7 is a critical gene involved in cholesterol biosynthesis, immune regulation, and metabolism. Patients with loss of function mutations in *DHCR7* develop Smith-Lemli-Optiz syndrome, which results in branchial and cardiac defects, electrolyte abnormalities (hypocalcemia, hyponatremia, and hyperkalemia), and extremely low cholesterol levels (< 38.7 mg/dL) associated with necrotizing enterocolitis, recurrent infections, sepsis-like episodes, and death in several patients (44). In a recent study, the genetic association of variants in the *DHCR7* gene (and other genes for vitamin D metabolism) with subsequent bacterial pneumonia was studied (45). They found that genetic variants of *CYP2R1* but not *DHCR7*, *GEMIN2*, or *HAL* were associated with increased risk of bacterial pneumonia.

Recently, the potential mechanistic role of *DHCR7* in combatting systemic infections has been studied. Xiao and colleagues showed that *DHCR7* inhibition or genetic ablation enhanced both in vivo and in vitro macrophage-mediated anti-viral function (46). They demonstrated that two *DHCR7* inhibitors (AY9944 and tamoxifen) led to increased clearance of vesicular stomatitis virus (VSV) and Zika virus. AY9944 administered to virus-infected (VSV or murine cytomegalovirus) macrophages led to enhanced *Ifnb* production in control macrophages but failed to enhance *Ifnb* production in *DHCR7*-deficient macrophages. The treatment of macrophages with tamoxifen also resulted in enhanced *Ifnb* expression upon treatment with a TLR3 agonist or VSV. Tamoxifen has also been shown to enhance neutrophil-mediated phagocytosis and extracellular trap formation to clear bacteria and has been proposed as a potential agent for combatting multi-drug resistant gram-negative infections (47, 48).

We discovered a number of genes involved in the cholesterol synthesis pathway to be up-regulated in sepsis patients when compared with healthy controls. While this could be a general response to reduced LDL-C and HDL-C levels in sepsis, the expression of some of these genes discriminated sepsis patients with CCI/early death outcomes from those in the rapid recovery and control groups, suggesting potential bedside prognostic utility. Our mortality analysis also revealed some additional insights. The up-regulation of *DHCR7* and *PLTP* for 90-day mortality emphasizes the important role that *DHCR7* (and *PLTP*) may play in death from sepsis. In addition to regulating HDL

size and facilitating cholesterol and lipopolysaccharide clearance, *PLTP* is critical to the immunomodulatory action of HDL and is a key factor in maintaining plasma sphingosine-1-phosphate levels (S1P) (22). S1P, which is primarily carried on HDL in association with apolipoprotein M, has antiapoptotic and chemotactic effects and levels decline in sepsis. Declining S1P levels have a strong inverse relationship with organ failure (49).

This study had several limitations. First, this was a small prospective study of gene expression from a single center. Findings from this analysis should be confirmed in a larger and multi-center study. However, to increase the generalizability of our results, we used a diverse cohort of patients (gender and race) and derived and validated our results in two separate cohorts. Our initial RNA-seq analysis involved single-end sequencing, whereas the validation involved paired-end sequencing. This difference was due to technical advances in the Department of Pathology that sequenced our samples but should not affect interpretation of our results. Though our lipopolysaccharide zebrafish model of endotoxemia is a sterile model, we were able to recapitulate several aspects of human sepsis, namely mortality and similar differential expression patterns for the lipid metabolism genes of interest. Finally, being an observational study, there is no way to infer causality between observed gene expression differences and outcomes.

CONCLUSIONS

In conclusion, this study identified *DHCR7* up-regulation as potentially influencing poor outcomes after sepsis (CCI/early death) in humans. Our robust findings in human sepsis, confirmed in a validation cohort as well as with RT-qPCR analysis, were then recapitulated in a zebrafish endotoxemia model with similar differential expression of *DHCR7* in lipopolysaccharide-treated zebrafish. Blockade of *Dhcr7* led to complete rescue of lipopolysaccharide-treated zebrafish from death and may lead to therapeutic opportunities and drug repurposing for sepsis. These findings should be validated in larger, multi-center studies.

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