

# **HHS Public Access**

Author manuscript *Cell Metab.* Author manuscript; available in PMC 2020 February 05.

Published in final edited form as:

Cell Metab. 2019 February 05; 29(2): 383–398.e7. doi:10.1016/j.cmet.2018.10.015.

# Hepatocyte-macrophage acetoacetate shuttle protects against tissue fibrosis

Patrycja Puchalska<sup>1,2</sup>, Shannon E. Martin<sup>2,3</sup>, Xiaojing Huang<sup>2,4,5</sup>, Justin E. Lengfeld<sup>1</sup>, Bence Daniel<sup>2,6</sup>, Mark J. Graham<sup>7</sup>, Xianlin Han<sup>2,8</sup>, Laszlo Nagy<sup>2,6,9</sup>, Gary J. Patti<sup>4</sup>, and Peter A. Crawford<sup>1,2,10,11</sup>

<sup>1</sup>Division of Molecular Medicine, Department of Medicine, University of Minnesota, Minneapolis, MN 55455 USA

<sup>2</sup>Center for Metabolic Origins of Disease, Sanford Burnham Prebys Medical Discovery Institute, Orlando, FL 32827 USA

<sup>3</sup>Pathobiology Graduate Program, Brown University, Providence, RI 02912 USA

<sup>4</sup>Department of Chemistry, Washington University, St. Louis, MO 63110 USA

<sup>5</sup>Department of Radiation Oncology, Memorial Sloan Kettering Cancer Center, New York, NY 10065 USA

<sup>6</sup>Department of Medicine, Johns Hopkins University School of Medicine, Johns Hopkins All Children's Hospital, Saint Petersburg, FL 33701 USA

<sup>7</sup>Ionis Pharmaceuticals, Carlsbad, CA 92010 USA

<sup>8</sup>Barshop Institute for Longevity and Aging Studies, Department of Medicine, Division of Diabetes, University of Texas Health Science Center at San Antonio, San Antonio, TX 78229 USA

<sup>9</sup>Department of Biological Chemistry, Johns Hopkins University School of Medicine, Johns Hopkins All Children's Hospital, Saint Petersburg, FL 33701 USA

<sup>10</sup>Department of Biochemistry, Molecular Biology, and Biophysics, University of Minnesota, Minneapolis, MN 55455 USA

<sup>11</sup>Lead contact: Peter A. Crawford MD, PhD, University of Minnesota, 401 East River Parkway, MMC 194, Minneapolis, MN 55455, USA, Tel: +1 612-301-2202, crawforp@umn.edu

# SUMMARY

Author Contributions

Conceptualization, P.P., X.H., and P.A.C.; Methodology, P.P., S.E.M., X.H., J.E.L., B.D., L.N., M.J.G., X.Ha., G.J.P., and P.A.C.; Investigation, P.P., S.E.M., X.H., J.E.L., and B.D.; Resources, P.A.C., M.J.G.; Writing – Original Draft, P.P. and P.A.C.; Writing – Review & Editing, all authors; Visualization, P.P., X.H., J.E.L., B.D., and P.A.C.; Supervision, X.Ha., L.N., G.J.P. and P.A.C.; Funding Acquisition, P.A.C.

**Publisher's Disclaimer:** This is a PDF file of an unedited manuscript that has been accepted for publication. As a service to our customers we are providing this early version of the manuscript. The manuscript will undergo copyediting, typesetting, and review of the resulting proof before it is published in its final citable form. Please note that during the production process errors may be discovered which could affect the content, and all legal disclaimers that apply to the journal pertain.

Declaration of Interests

Mark J. Graham is an employee and shareholder of Ionis Pharmaceuticals, Inc.

Metabolic plasticity has been linked to polarized macrophage function, but mechanisms connecting specific fuels to tissue macrophage function remain unresolved. Here we apply a stable isotope tracing, mass spectrometry-based untargeted metabolomics approach to reveal the metabolome penetrated by hepatocyte-derived glucose and ketone bodies. In both classically and alternatively polarized macrophages, [<sup>13</sup>C]acetoacetate (AcAc) labeled ~200 chemical features, but its reduced form D-[<sup>13</sup>C] $\beta$ -hydroxybutyrate (D- $\beta$ OHB) labeled almost none. [<sup>13</sup>C]glucose labeled ~500 features, and while unlabeled AcAc competed with only ~15% of them, the vast majority required the mitochondrial enzyme succinyl-CoA-oxoacid transferase (SCOT). AcAc carbon labeled metabolites within the cytoplasmic glycosaminoglycan pathway, which regulates tissue fibrogenesis. Accordingly, livers of mice lacking SCOT in macrophages were predisposed to accelerated fibrogenesis. Exogenous AcAc, but not D- $\beta$ OHB, ameliorated diet-induced hepatic fibrosis. These data support a hepatocyte-macrophage ketone shuttle that segregates AcAc from D- $\beta$ OHB, coordinating the fibrogenic response to hepatic injury via mitochondrial metabolism in tissue macrophages.

## **Graphical Abstract**



# eTOC blurb

XXX et al combine stable isotope tracing with untargeted metabolomics to identify the specific roles of the ketone bodies, acetoacetate (AcAc) and D-hydroxybutyrate (D- $\beta$ OHB), in mediating metabolic plasticity in macrophages. They unveil a hepatocyte-macrophage ketone shuttle and show that AcAc protects the liver from high fat diet-induced fibrosis.

## Keywords

Ketone bodies; beta-hydroxybutyrate; acetoacetate; macrophages; stable isotope tracing untargeted metabolomics; non-alcoholic fatty liver disease; fibrosis; immunometabolism

# INTRODUCTION

Ketone bodies are an alternative source of metabolic energy especially during states of diminished carbohydrate availability (McGarry and Foster, 1980; Robinson and Williamson, 1980). Ketones are generated from fatty acid-derived acetyl-CoA through a series of reactions requiring the fate committing mitochondrial 3-hydroxymethylglutaryl (HMG)-CoA synthase (HMGCS2) expressed in hepatocytes and gut epithelial cells. Acetoacetate (AcAc) represents 25–50% of the total ketone body pool produced by the liver, with the balance secreted as its reduced form D-β-hydroxybutyrate (D-βOHB), produced by mitochondrial D-BOHB dehydrogenase (BDH1) (Krebs and Hems, 1970; McGarry and Foster, 1971). Robust ketogenesis is relatively restricted to hepatocytes due to abundant HMGCS2 expression. After ketones are released from hepatocytes into the circulation, DβOHB is oxidized to AcAc in mitochondria of extrahepatic cells via BDH1, and a CoA moiety is transferred from succinyl-CoA to AcAc via SCOT (succinyl-CoA-oxoacid transferase, encoded by the Oxct1 gene), which prepares AcAc for terminal oxidation. SCOT's ubiquitous expression is excluded from hepatocytes, preventing ketone oxidation in these cells. While numerous metabolic pathways, such as  $\beta$ -oxidation, the tricarboxylic acid (TCA) cycle and gluconeogenesis intersect with ketone body metabolism, the only known physiologically relevant metabolic fate of ketone bodies is their SCOT-dependent terminal oxidation in the TCA cycle. Multiple studies suggest diverse signaling roles for ketones, even in carbohydrate replete states, a subset of which could be independent of their metabolism (Puchalska and Crawford, 2017). For example, BOHB inhibits the NLRP3 inflammasome in macrophages and has neuroprotective effects on macrophages that may require signaling through the G protein coupled receptor GPR109A (Rahman et al., 2014; Youm et al., 2015).

Macrophage phenotypes in mammalian tissues exhibit marked metabolic plasticity, depending on cell ontogeny, tissue localization, and environmental stimuli (Puleston et al., 2017; Saha et al., 2017). Phenotypic features of classically polarized inflammatory (M1) and alternatively polarized reparative (M2) macrophages helps to orient the wide spectrum of macrophage populations and functions (Kelly and O'Neill, 2015). The classically polarized phenotype is associated with tissue injury and inflammatory signaling and is triggered by pathogen-associated mediators such as lipopolysaccharides (LPS) (Martinez and Gordon, 2014). The alternatively polarized phenotype antagonizes the inflammatory response, favoring tissue repair, remodeling, and fibrosis, and is triggered by activation of the IL-4/ STAT6-dependent pathway (Minutti et al., 2017). Classically polarized macrophages employ glycolysis and the pentose phosphate pathway (PPP) to support microbicidal functions, whereas alternatively polarized macrophages leverage fatty acid oxidation for metabolic demands (Vats et al., 2006; Xu et al., 2015). Recent observations raise questions regarding the roles of metabolic fuels in macrophage function, and whether all fuels are handled equivalently by polarized macrophages (Gonzalez-Hurtado et al., 2017; Nomura et al., 2016). Oxidation of alternative metabolic fuels such as ketones has been relatively unexplored in macrophages, although SCOT is abundantly expressed in bone marrow derived macrophages (BMDM) (Youm et al., 2015). To determine the roles of ketone body metabolism in macrophages, we used a novel stable isotope tracing untargeted metabolomics

(ITUM) utilizing liquid chromatography/high accuracy mass spectrometry (LC/MS). Until now, the utilization of stable isotopes has largely been confined either to differential distribution of label through known substrate-product relationships, or to quantify canonical fluxes performed in stationary or non-stationary analysis. The convergence of stable isotope labels with untargeted metabolomics approaches until now has not been applied in diseaserelevant contexts [also within (Puchalska et al., 2018)]. We used cultured primary BMDMs to discover a set of mitochondrial and cytoplasmic metabolic pathways to which AcAc but not  $\beta$ OHB can contribute, many of which are shared with glucose-utilizing networks. Use of SCOT-deficient macrophages revealed mitochondrial metabolism as the predominant route. Loss of SCOT in hepatic tissue macrophages, lobular neighbors to ketone- and glucoseproducing hepatocytes, predisposed mice to an exuberant fibrotic hepatic phenotype. These findings reveal a ketone shuttle between hepatocytes and local macrophages that modulates the liver's fibrotic response to increased fat ingestion and support the notion that metabolism of the two ketone bodies AcAc and  $\beta$ OHB have segregated roles in macrophage biology.

# RESULTS

#### Macrophages oxidize AcAc but not βOHB

To study the metabolic fates of ketone bodies in macrophages, we cultured primary BMDMs and first confirmed phenotypic responses to stimulants of the classical (Tnfa gene, induced by LPS) and alternative (Arg1 gene, induced by IL-4) polarization phenotypes (Fig. S1A-B). To quantitatively determine the metabolic transformations of [<sup>13</sup>C]AcAc or D-<sup>[13</sup>C]<sup>β</sup>OHB in BMDMs, we applied isotope tracking LC/MS untargeted metabolomics (ITUM), and analyzed the data with X<sup>13</sup>CMS (Huang et al., 2014). This analytical platform sorts features (pairs of m/z and retention time) into isotopologue groups of putatively labeled metabolites and calculates the relative isotopic enrichment for each member. We tested ketone bodies at 1 mM, a concentration high enough to reveal cellular oxidation but still lower than achieved through starvation or ketogenic diets (Robinson and Williamson, 1980; Wildenhoff et al., 1974). After treatment for 6h or 24h of BMDM with 1 mM  $[U-^{13}C_4]$ AcAc, we observed up to 50% fractional <sup>13</sup>C-enrichment of TCA cycle intermediates (Fig. 1A, S1C, S1D). Among polarized macrophage states, fractional 13Cenrichment of glutamate (a reporter of  $\alpha$ -ketoglutarate), and malate, were decreased by  $\sim 25\%$  (p values < 0.001) in LPS-stimulated macrophages, compared to unpolarized and IL-4-polarized BMDMs (Fig. 1A). In contrast to AcAc, 1 mM D- $[U^{-13}C_4]\beta$ OHB did not produce any <sup>13</sup>C-labeling of TCA cycle intermediates in macrophages (Fig. 1B), despite its avid uptake into these cells (Fig. S1E). To become accessible for terminal oxidation, DβOHB first requires NAD<sup>+</sup> dependent oxidation to AcAc by mitochondrial BDH1, whose

G favors D- $\beta$ OHB formation, and is sensitive to the mitochondrial NAD<sup>+</sup>/NADH ratio (Krebs et al., 1969; Williamson et al., 1967) (Fig. 1C). While trace reduction to [<sup>13</sup>C] $\beta$ OHB was evident in extracts from [<sup>13</sup>C]AcAc-treated BMDMs (Fig. 1D), oxidation of [<sup>13</sup>C] $\beta$ OHB to [<sup>13</sup>C]AcAc was undetectable (not shown). Accordingly, immunoblots revealed no observable BDH1 protein expression in BMDMs (Fig. 1E). To confirm the absence of mitochondrial BDH activity in BMDMs, we increased the mitochondrial NAD<sup>+</sup>/NADH ratio by treatment with the ionophore FCCP (0.5–2  $\mu$ M) for 6h. Under these conditions that favor D- $\beta$ OHB oxidation to AcAc, [<sup>13</sup>C] $\beta$ OHB also did not enrich TCA

cycle pools (Fig. 1F). Thus, irrespective of polarization state, BMDMs selectively oxidize AcAc but not D- $\beta$ OHB. To the best of our knowledge, our data report for the first time impaired BDH1 expression in extrahepatic cells and selective utilization of ketone body redox partners.

# AcAc metabolism converges with non-oxidative pathways in macrophages

To determine whether macrophages allocate metabolites of  $[^{13}C]$ AcAc beyond TCA cycle intermediates, we used X<sup>13</sup>CMS to interrogate datasets derived from BMDMs cultured in 1 mM [<sup>13</sup>C]AcAc for 24h. The results were analyzed using the pipeline schematized in Fig. 2A. In this approach, each labeled sample is compared to control unlabeled samples prepared under identical conditions, conferring datasets revealing increased abundances of 13C-isotopologues of identical metabolites, rather than increased abundances of alternative metabolites. We retrieved 187, 162, and 170 [<sup>13</sup>C]AcAc-derived isotopologue groups for unpolarized, LPS-polarized, and IL-4-polarized macrophages, respectively (Table S1A). Mitochondrial acetyl-CoA can be exported to the cytosol as citrate through the citrate transporter (CIC)/ATP-citrate lyase system, which contributes to a multitude of pathways (Fig. S1C). Indeed, intracellular substrate compartmentalization is highly polarization state dependent in macrophages [see also (Puchalska et al., 2018)]. As observed for TCA cycle intermediates, D-[<sup>13</sup>C] $\beta$ OHB-derived <sup>13</sup>C-labeling was negligible (Fig. 2B, Table S1A).

To assign putative identities to the features labeled by [<sup>13</sup>C]AcAc, we applied the PIUMet package [(Pirhaji et al., 2016) and see Table S1A for putative identification of all labeled features]. PIUMet supported the putative identification of 68 metabolites in unpolarized, and 70 in each of the polarized (LPS or IL-4) macrophages (Fig. S2A). Although the majority (45 IDs) of [<sup>13</sup>C]AcAc-labeled metabolites were observed in all three macrophage states, the highest number (13 IDs) of uniquely labeled metabolites was observed in IL-4-polarized macrophages (Fig. S2A). [<sup>13</sup>C]AcAc-derived carbon was dispersed among amino acids, organic acids, nucleosides, nucleotides and lipids (Fig. 2C), indicating that AcAc is directed also into cytoplasmic and other cellular compartment pathways (Fig. S2B). Mapping of [<sup>13</sup>C]AcAc derived putative metabolites into the KEGG database revealed major contributions of AcAc-derived carbon into amino acid metabolism (Fig. S2C, Table S1B). Thus, conversion of AcAc into acetyl-CoA opens fates beyond TCA intermediates, many of which are metabolic precursors of these downstream products (Fig. S1C).

Interrogation of [<sup>13</sup>C]AcAc-labeled metabolites against the BioCyc database revealed, uniquely in IL-4-polarized macrophages, contribution of AcAc to putative glucuronide conjugates that mapped to the chondroitin and dermatan sulfate (CS/DS) pathways, proline/ arginine degradation, and UDP-biosynthetic pathways (Fig. 2D). Selective labeling among macrophage states was evident for numerous features, including labeling of putative uridine diphosphate N-acetylglucosamine (UDP-GlcNAc) (Fig. 2B–E, Table S1C). UDP-GlcNAc is the product of the hexosamine biosynthetic pathway (HBP), and the precursor of Nacetylneuraminic acid (NeuAc; a sialic acid), both of which contribute to the glycoprotein and/or glycosaminoglycan (GAG) pathways. However, the total labeled fraction varied among macrophage polarization states, suggesting polarization-dependent engagement of pathways connected to the HBP [see details in (Puchalska et al., 2018)]. These data

underscore that AcAc-derived carbon has fates beyond TCA cycle in primary macrophages, with variations that depend on polarization state. Furthermore, the exclusive ability of  $[^{13}C]AcAc$ , but not its reduced form D- $[^{13}C]\betaOHB$ , to contribute to both TCA intermediates and also large repertoire of additional metabolites, raise the hypothesis that mitochondria play key role in the generation of these downstream cellular metabolites.

# AcAc successfully competes with glucose to contribute to diverse metabolic pathways in alternatively polarized macrophages

As with most mammalian cells, tissue macrophages are simultaneously exposed to multiple substrates that can serve as carbon sources. To determine how macrophages coordinate the use of competing substrates, we first replaced glucose in BMDM culture medium with 10 mM [U-<sup>13</sup>C<sub>6</sub>]glucose. As expected (Xu et al., 2015), in LPS-polarized macrophages the relative abundance of the <sup>13</sup>C-labeled PPP intermediates were increased compared to unpolarized or IL-4-polarized states (Fig. S3A). In contrast, labeling of downstream TCA intermediates in the LPS-polarized state was diminished by 29% for glutamate and 16% for malate (p values < 0.001 and 0.01, respectively) (Fig. S3B, S1C) similar to  $[^{13}C]AcAc$ labeling (Fig. 1A). We then tested the ability of unlabeled 1 mM AcAc to compete with 10 mM [U-<sup>13</sup>C<sub>6</sub>]glucose. Because mitochondrial acetyl-CoA decreases glucose-derived pyruvate entry into the TCA cycle by inhibiting pyruvate dehydrogenase (PDH) (Fig. S3C) we expected less incorporation of [<sup>13</sup>C]glucose-derived acetyl-CoA into downstream metabolites in the presence of unlabeled AcAc (Cooper et al., 1975). Indeed, [<sup>13</sup>C]glucose labeling of TCA intermediates in LPS- and IL-4-polarized macrophages was diminished 43-60% and 33–44% (all p values < 0.001), respectively, in presence of unlabeled AcAc (Fig. 3A). These observations suggest preferential oxidation of AcAc over glucose in macrophages irrespective of their polarization state.

The metabolic conduit linking mitochondrial conversion of AcAc to acetyl-CoA, via SCOT⇒thiolase-dependent catalysis, to cytoplasmic metabolism is largely dependent on citrate export from mitochondria via the ATP citrate lyase-dependent shuttle. However, cytosolic acetoacetyl-CoA synthetase (AACS) also supports the conversion of AcAc to acetyl-CoA (Edmond, 1974; Endemann et al., 1982). Therefore, we measured the expression of both Aacs and Oxct1 genes in BMDMs, and observed unique Oxct1 induction three-fold by IL-4 (Fig. S4A). RNA-Seq analysis of IL-4-polarized BMDMs revealed a 5-fold increase of Oxct1 mRNA 6h and 24h after IL-4 treatment, compared to control (Fig. 3B-C). Accordingly, BMDMs harvested from STAT6 knockout mice (S6KO), which lack the transcription factor mediator downstream of IL-4 signaling, failed to increase Oxct1 expression (Fig. 3B) (Czimmerer et al., 2018; Kapoor et al., 2015). Analysis of STAT6chromatin immunoprecipitation (ChIP) datasets revealed IL-4-dependent augmentation of STAT6 occupancy at -43 kb and -1.7 kb relative to the Oxct1 transcription start site (Fig. 3C) (Czimmerer et al., 2018). Thus, Oxct1 is a potential STAT6 target in alternatively polarized macrophages, suggesting a dynamic role of mitochondrial ketone metabolism in this phenotypic state.

Given the potential role in alternatively polarized macrophages for SCOT, and thus AcAc metabolism, we focused our analysis on the fates of <sup>13</sup>C-labeled substrates in IL-4-polarized

macrophages. [U-<sup>13</sup>C<sub>6</sub>]glucose labeled 249 features in both control and IL-4-polarized cells, with 63 of these exhibiting significant differences in label enrichment (Fig. S4B). An additional 240 features were uniquely labeled by [U-<sup>13</sup>C<sub>6</sub>]glucose only in IL-4-polarized cells. Together, these 303 features were mapped to KEGG pathways, which confirmed increased labeling of TCA cycle, pyrimidine, arginine, proline, and purine pathways in alternatively polarized macrophages (Fig. S4C). In IL-4-polarized macrophages, 71 out of the 446 (16%) features labeled by  $[U^{-13}C_6]$  glucose preferentially incorporated carbon derived from unlabeled AcAc (Fig. 3D, Table S2). To reveal the cross-talk between mitochondrial-dependent ketone metabolism and glucose metabolism, we repeated substrate competition experiments in SCOT knockout (KO) IL-4-polarized macrophages. We confirmed loss of SCOT in BMDMs via immunoblot (Fig. S4D) and demonstrated preserved canonical responses to LPS- and IL-4-polarization in SCOT KO BMDMs (Fig. S4E). <sup>[13</sup>C]AcAc was unable to label TCA intermediates in SCOT KO BMDMs, while <sup>[13</sup>C]glucose-derived labeling of TCA intermediates was normal (Fig. S4F–G). However, in IL-4-polarized SCOT KO BMDMs, AcAc competed with [<sup>13</sup>C]glucose-derived labeling of only 20 out of 418 glucose-labeled features (a 72% decrease compared to WT BMDMs, p <0.0001 by Mann Whitney U test) (Fig. 3D, Table S2), indicating a primary role of mitochondrial ketone metabolism in the context of mixed substrate exposure. To determine the requirement of mitochondrial AcAc metabolism in alternatively polarized macrophages, the 51 SCOT-dependent competed features were analyzed using PIUMet and MBRole pathway analysis (Table S2-S3), which revealed CS degradation (Fig. S4H) similar to our <sup>[13</sup>C]AcAc datasets (Fig. 2D). One of the characteristic chemical features of this SCOTdependent pathway was NeuAc (Fig. 3E), a terminal sugar residue of glycan chains, which can be synthetized from UDP-GlcNAc (Fig. S4I). Competition between AcAc and glucose for NeuAc labeling in WT IL-4-polarized BMDMs was abrogated in SCOT KO (Fig. 3E). While mapping of the 51 SCOT-dependent [<sup>13</sup>C]glucose-AcAc competing features to KEGG, the TCA cycle was a significant, but not major contributor among the enriched pathways. Ala, Asp, Glu, Arg and Pro metabolism (24% of SCOT-dependent features) contribute to the urea cycle, which includes the reaction catalyzed by the canonical alternatively polarized macrophage mediator arginase (Fig. 3F, Table S3). Collectively, in the context of a physiological mix of substrate fuels, alternatively polarized macrophages leverage mitochondrial metabolism of AcAc to generate intermediates in multiple downstream metabolic pathways not directly linked to terminal oxidation.

#### Mitochondrial ketone metabolism in macrophages protects against hepatic fibrosis

The liver harbors one of the largest resident macrophage populations, Kupffer cells (Guilliams et al., 2016). Neighboring lobular hepatocytes release signals and metabolites, including glucose and ketone bodies, into the surrounding stroma. Ketogenesis occurs solely in hepatocytes, due to the abundant expression of mitochondrial HMGCS2, and due to the absence of SCOT expression, hepatocytes do not oxidize the ketone bodies they generate (Orii et al., 2008). To determine the extent to which mitochondrial metabolism of AcAc supports homeostatic function of tissue macrophages *in vivo*, we generated macrophage-specific SCOT KO mice using the LysM-Cre driver and maintained these mice and their littermate controls on a 60% kcal fat diet for 8 weeks (Fig. 4A–C). Administration of high fat diet for 8 weeks in WT mice causes hepatic steatosis, and mild hepatocyte injury,

necrosis and lobular inflammation, but typically does not cause fibrosis (Machado et al., 2015). SCOT-Macrophage-KO mice exhibited similar plasma total ketone body levels as littermate controls (Fig. 4D), and blood glucose was increased 14% (Fig. 4E, p = 0.047, n >10/group) in SCOT-Macrophage-KO mice, although intraperitoneal glucose tolerance tests yielded similar excursions (Fig. 4F). High fat diet-fed mice with loss of SCOT in macrophages maintain the same body weight as their littermates (Fig. 4G), and liver steatosis was similar as determined by Oil Red O staining (Fig. 4H) and triacylglycerol quantification (Fig. 4I). Hematoxylin and eosin (H&E) stains of liver sections from SCOT-Macrophage-KO mice revealed comparable histological architecture to littermate controls (Fig. 4J), and similar density of F4/80<sup>+</sup> macrophages (Fig. S5A).

To reflect variations in hepatocyte-macrophage cross-talk through AcAc exchange, we acquired untargeted metabolomics data derived from liver extracts of SCOT-Macrophage-KO and littermate control mice. Analysis using XCMS online yielded 7,074 total features, of which 238 exhibited a statistically significant 2-fold change (Fig. S5B, Table S4). Among the pathways with the most favorable p values (p < 0.05) were purine metabolism, histone degradation, UDP-GlcNAc/UDP-GalNAc biosynthesis, amino acid degradation, protein glycosylation, ketolysis, and DS degradation. Among the putative dysregulated metabolites was iduronate, whose total ion counts were downregulated 14% in livers of SCOT-Macrophage-KO mice (p < 0.03; Fig. 5A). The identity of iduronate was corroborated using the Compound Discoverer package, which uses natural isotopic distribution to predict compound composition. While no direct relationship was evident between AcAc mitochondrial metabolism in macrophages and diminished static iduronate content in livers of SCOT-Macrophage-KO mice, L-iduronic acid (IdoA) is the major uronic acid within GAGs, and drew our attention due to preferential use of AcAc carbon to amino sugar and NeuAc GAG components within IL-4 polarized BMDMs [Figs. 2D and 3E]. Diverse GAGs, including CS/DS, are comprised of polymers of varying amino sugar-uronic acid disaccharides, with varying degrees of sulfation. Macrophages exhibit increased GAG content upon IL-4-polarization, and perturbations in the GAG DS/CS pathways are associated with expansion of extracellular matrix (ECM) that lead to the development of hepatic fibrosis (Decaris et al., 2017; Habuchi et al., 2016; Martinez et al., 2015). Thus, we next asked if metabolic perturbations of GAG metabolism observed both in cultured macrophages lacking SCOT, and liver tissue from animals lacking SCOT in macrophages were linked to hepatic fibrogenesis.

Transcriptional signatures of altered fibrogenesis were evident in livers of SCOT-Macrophage-KO mice, with upregulation of the mRNAs for angiogenic factor *Vegfc* (vascular endothelial growth factor C), mitogen *Pdgfa* (platelet-derived growth factor A), pro-fibrotic cytokine *II13*, and a marker of monocyte recruitment *Cd11b* (Fig. 5B). Mediators of immune cell recruitment upon liver injury (*Ccl3, Ccl5, Lox11*) were also significantly upregulated in livers of SCOT-Macrophage-KO mice (Fig. 5C), together with *Ym1* and *Fizz1* genes, canonical markers of M2 polarization (Fig. 5D). *Arg1* mRNA was unchanged due to the presence in both macrophages and hepatocytes (Fig. S5C). *Tgfb* (transforming growth factor  $\beta$ ), inflammatory cytokines (*Tnfa, II1b*, and *II6*), and oxidative stress markers (*Nos2, Hmox1*, and *Nrf2*) were unchanged in livers of SCOT-Macrophage-KO mice (Fig. S5C). However, markers of hepatic stellate cell activation and trans-

differentiation into myofibroblasts (*Shh, Igfbp5, Acta2*) were elevated, suggesting that hepatic stellate cells may also be a target of hepatocyte-derived AcAc (Fig. 5C). Because a proportion of hepatic stellate cells may derive from hematopoietic progenitors (Miyata et al., 2008), and be susceptible to Cre-mediated recombination in the LysM-Cre model, we performed anti-desmin/anti-SCOT double labeling confocal immunohistochemistry in livers obtained from high fat diet fed control and SCOT-Macrophage-KO mice. Abundant desmin/ SCOT double-positive cells persisted in SCOT-Macrophage-KO livers (Fig. S5D), suggesting that stellate cell phenotypes in SCOT-Macrophage-KO mice are downstream of loss of SCOT in LysM-Cre<sup>+</sup> cells. Phenotypes observed in livers of SCOT-Macrophage-KO mice are likely restricted to hepatic macrophages, as adipokine and inflammatory mediators exhibited normal expression in subcutaneous (inguinal) adipose tissue (Fig. S5E–F).

Consistent with the metabolomics and gene expression datasets, picrosirius red stains showed a 55% increase (p < 0.006, n >7 animals/group, 20 fields analyzed/animal) in the total fibrotic area compared to littermate controls (Fig. 5E-F). The magnitude of fibrosis correlated inversely with the fraction of SCOT<sup>+</sup>/F4/80<sup>+</sup> macrophages, normalized to all F4/80<sup>+</sup> macrophages present in the tissue sections ( $r^2 = 0.4623$ , p = 0.03) (Fig. 5G), but had no relationship to the magnitude of steatosis ( $r^2 = 0.0001$ ) (Fig. 5H). To confirm the role of locally-derived ketogenesis from neighboring hepatocytes, we quantified fibrogenesis in ketogenesis insufficient mice that are unable to produce ketones in liver [Hmgcs2-targeted antisense oligonucleotides (ASO)], and maintained these mice on high fat diet for 8 weeks (Cotter et al., 2014). These mice fail to express HMGCS2 protein in liver, while gut HMGCS2 protein is preserved, and irrespective of the presence of SCOT in macrophages, these mice exhibited hypoketonemia in the random fed state (Fig. S6A-C). Untargeted metabolomics studies of livers of ketogenesis insufficient mice revealed 1,306 features dysregulated >2 fold compared to livers of controls (Fig. 6A, Table S4). Putative features corresponding to iduronate were altered in livers of ketogenesis insufficient animals, indicating perturbation of the DS/CS pathway (Table S4, Fig. S6D). Indeed, Hmgcs2 ASO treatment increased susceptibility to hepatic injury to high fat diet, increased inflammation and evidence of activated stellate cells (Cotter et al., 2014). Strikingly, livers of Hmgcs2 ASO-treated animals that also lacked SCOT selectively in macrophages exhibited exuberant inflammation, hepatocyte injury, and profound degradation of hepatic lobular structure (Fig. 6B-C). Picrosirius red staining revealed increased fibrosis in livers of mice lacking both hepatocyte HMGCS2 and macrophage SCOT (Fig. 6C-D). In summary, ketogenic insufficiency increased lobular fibrosis in both wild-type and SCOT-Macrophage-KO mice, and loss of SCOT in macrophages predisposed to hepatic fibrosis, independent of *Hmgcs2* ASO treatment [>50% increase in fibrosis in both ketogenesis sufficient and insufficient states, p < 0.05 for each comparison (Fig. 6B–D)].

To determine whether exogenously administered AcAc recapitulates an anti-fibrotic effect, we maintained wild-type mice on a fibrogenic diet composed of *trans* fat, fructose, and cholesterol for four weeks (Soufi et al., 2014). During the fibrogenic interval, either AcAc (10  $\mu$ mol/g body weight), D- $\beta$ OHB (10  $\mu$ mol/g body weight), or vehicle controls were administered every 12h via i.p. injections. Pilot kinetic analyses indicated that ketones are completely metabolized within 15 min (AcAc more rapidly than D- $\beta$ OHB) (Fig. S7A). No significant changes in caloric consumption were observed between ketone injected groups

(Fig. S7B), and body weights were comparable among groups (Fig. S7C). Blood glucose concentrations at the end of the fibrogenic interval were not altered by ketone injections (Fig. S7D). Because in vitro synthesis of AcAc generates equimolar ethanol, an equivalent ethanol concentration was used as vehicle, and saline was used as a vehicle for D-βOHB. Each dose (AcAc or vehicle) corresponded to <0.5 g ethanol/kg body weight, far below doses used to induce alcoholic hepatitis, and were not associated with systemic signs of toxicity, compared to saline control-treated animals (Gao et al., 2017). At the end of study, picrosirius red staining of liver sections from AcAc-treated animals showed a 52% reduction of hepatic fibrosis compared to vehicle control animals fed the fibrogenic diet (p = 0.004, n=7/group; Fig. 6E, 6G). Consistent with the divergent metabolic response of cultured primary BMDMs to the two ketone bodies, liver sections from mice injected with D-BOHB exhibited modestly augmented fibrosis in comparison to control animals (Fig. 6F, S7E). It is possible that low concentration ethanol dosing enhances the toxic effects of the fibrogenic diet [comparing the two different vehicle groups (Fig. 6E-F)]. Nonetheless, the added presence of AcAc to this vehicle was protective. These results strongly support the contention that mitochondrial macrophage metabolism of either locally produced, or systemically administered AcAc, but not D-BOHB, attenuates the hepatic fibrogenic response triggered by elevated nutritional fat.

# DISCUSSION

The studies presented herein reveal two primary conclusions. First, an AcAc shuttle released from hepatocytes to neighboring macrophages transduces a mitochondrial metabolismdependent signal that protects against hepatic lobular fibrogenesis in response to high fat diet. Second,  $\beta$ OHB is restricted from this shuttle because it cannot be metabolized by macrophage mitochondria. Both findings were generated through ITUM platform, in which stable isotope tracing analysis was fully untargeted. Multiple analyses revealed a strong molecular metabolite candidate as a potential conduit for AcAc carbon in alternatively polarized macrophages, the GAGs. Indeed, revelation of macrophage GAG metabolism stimulated the hypothesis that a hepatocyte-macrophage AcAc shuttle regulates hepatic lobular fibrosis, which was further supported by genetic mouse models. A protective effect of AcAc was observed in animals in the energy replete fed state and did not require provocation by fasting-induced ketogenesis, while exogenous AcAc (and not βOHB) was also protective from diet-induced hepatic lobular fibrosis. Thus, analogous to the lactate shuttle posed in the central nervous system, or the branched chain amino acid metabolite 3hydroxyisobutyrate in muscle, liver is a highly plausible organ in which a local AcAc shuttle could exist (Brooks, 2018; Buck et al., 2017; Liu et al., 2017). Our observations also indicate that substrate fuel selection, availability, and partitioning directly influence polarized macrophage function (Saha et al., 2017; Verdeguer and Aouadi, 2017).

While the observations herein are consistent with the benefits of nutritionally provoked ketogenesis in both human and animal models of nonalcoholic fatty liver disease (NAFLD)/ nonalcoholic steatohepatitis (NASH), they indicate that independent effects of AcAc versus  $\beta$ OHB may elucidate benefits of ketosis (Mardinoglu et al., 2018; Pawlak et al., 2015). Independent effects of ketones are important to consider due to physiological variations in the AcAc/ $\beta$ OHB ratio secreted by the liver (Krebs and Hems, 1970; McGarry and Foster,

1971). Responses to individual ketone bodies may vary and depend on target cell type and ketogenic rate (Puchalska and Crawford, 2017). Indeed, BOHB has been linked to antiinflammatory responses in macrophages (Rahman et al., 2014; Youm et al., 2015), while AcAc can promote inflammatory signaling and oxidative stress (Jain et al., 2002; Kanikarla-Marie and Jain, 2015; Kurepa et al., 2012). Macrophages integrate numerous signals, and intact βOHB macrophage signaling could explain the lack of inflammation in fibrogenic livers of SCOT-Macrophage-KO mice, while superimposed HMGCS2 deficiency [which limits, but does not eliminate ketogenesis (Cotter et al., 2014; d'Avignon et al., 2018)] yields both inflammation and fibrosis. However, recurrent boluses of high D-βOHB concentrations may provoke toxic responses in non-macrophages. Indeed, high concentration  $\beta OHB$ activates pro-inflammatory and oxidative stress in calf hepatocytes and in other cell types (Meroni et al., 2018; Shi et al., 2014). Thus, tissue responses to ketone bodies require attentiveness to (i) distinct cell type responses within a tissue; (ii) the delivered AcAc/ $\beta$ OHB ratio (including, but not limited to mitochondrial redox potential effect); (iii) total ketone body concentration and kinetics; and (iv) augmenting or competing signals. Exogenous ketone preparations for prospective therapeutic or health-maintaining ends, including ketone esters, requires diligent attention to all of these principles.

While AcAc contributes to sterol and fatty acid biosynthesis through cytosolic AACS in extrahepatic cell types, the contribution of AcAc through mitochondrial (SCOT dependent) routes to cytosolic pathways has not been previously demonstrated (Hasegawa et al., 2012; Yamasaki et al., 2016). Here and in (Puchalska et al., 2018) we demonstrate that AcAc-derived carbon, in a SCOT-dependent manner, contributes to GAG/glycoprotein/ proteoglycan canonical metabolic pathways via labeling of UDP GlcNAc/GalNAc or NeuAc in macrophages. Indeed, substrate selection and downstream metabolism may be equally important to support anabolic pathways and provide covalent modifiers for post-translational modifications, rather than fulfilling obligate cellular energy requirements (Schoors et al., 2015; Wong et al., 2017).

The composition of GAGs/ECM is remodeled under diet-induced metabolic disorders, hypercholesterolemia, diabetes and cirrhosis, and while exogenous administration of purified GAGs ameliorates inflammation, oxidative stress, and fibrogenesis, decreases in GAG synthesis are fibrogenic (Campo et al., 2004; Liu et al., 2017). The cellular component of GAGs is remodeled during monocyte-macrophage differentiation, and depends on polarization (Chang et al., 2012; Martinez et al., 2015). While the primary drivers of ECM expansion and fibrosis in liver are hepatic stellate cells, macrophages produce proteoglycans (*i.e.*, protein-GAG complexes) and ECM modifying enzymes that may configure the fibrogenic cascade (Laskin et al., 1991; Matsubayashi et al., 2017; Winberg et al., 2000). GAG species may exert opposing actions on tissue fibrogenesis, with some exerting inhibitory roles in tissue fibrosis (Chen and Birk, 2013; Vogel et al., 1984). These results support a model in which hepatocyte-derived AcAc represents a safe signal to neighboring macrophages in a manner that is critical for GAG homeostasis in the fed state.

Hepatic fibrosis develops in response to numerous insults, including persistent overnutrition, genetic abnormalities of lipid metabolism, viral infection, toxins, ethanol, and autoimmune reactions, all of which lead to chronic immune activation that results in excessive production

of ECM (Diehl and Day, 2017; Koyama and Brenner, 2017). Additionally, stimuli derived from injured hepatocytes, tissue macrophages, and/or endothelial cells activate hepatic stellate cells and promote their differentiation to myofibroblasts (Friedman, 2008; Pellicoro et al., 2014). Inflammation-independent hepatic fibrosis has been observed in select circumstances (*e.g.*, hemochromatosis), and thus while inflammation is a key trigger, it is not absolutely required to induce a fibrogenic cascade. While the mRNA encoding TGF $\beta$ was not augmented in our studies, it is possible that metabolic cues sensed by tissue macrophages operate through downstream mechanisms. Indeed, we observed activation of stellate cell, angiogenic factors, mediators of hedgehog pathway, and metabolomics signals consistent with cell proliferation, amino acid degradation, protein glycosylation, the HBP pathway, and DS/CS synthesis.

Metabolic and histopathological features influenced by hepatic tissue macrophages could represent the effects on resident and/or recruited macrophages, as myeloid cells throughout the body lack SCOT in the LysM-Cre-driven SCOT-Macrophage-KO model. Resident (fetal liver/volk sac-derived, F4/80<sup>Hi</sup>Cd11b<sup>Lo/Int</sup>) macrophages in the liver (Kupffer cells) may indeed harbor important functional differences compared to recruited bone marrow-derived (F4/80<sup>Lo/Int</sup>/Cd11b<sup>Hi</sup>) macrophages (Mowat et al., 2017). Commonly in NAFLD progression to NASH, inflammation is mediated by recruited macrophages, while Kupffer cells exhibit an anti-inflammatory alternatively polarized phenotype, though bone marrow monocytes can generate self-renewing and fully differentiated Kupffer cells (Koyama and Brenner, 2017; Scott et al., 2016). Although hematopoiesis-derived, LysM-Cre<sup>+</sup>/desmin<sup>-</sup> fibrocytes may directly contribute to the fibrogenic hepatic myofibroblast population, the contributing fractions remain incompletely understood, and non-hematopoietic (LysM-Cre<sup>-</sup>/desmin<sup>+</sup>) trans-differentiated hepatic stellate cells are likely the primarily fibrogenic myofibroblast population (Mederacke et al., 2013; Xu and Kisseleva, 2015). The likelihood that an AcAc shuttle's coordination of hepatic fibrogenesis signals first through lobular macrophages is supported by a lack of phenotype in adipose tissue of SCOT-Macrophage-KO mice. Thus, extrahepatic alteration of myeloid cells and/or secretion of adipokines are likely not significant contributors to hepatic fibrogenesis in the SCOT-Macrophage-KO mice model (Adolph et al., 2017). Finally, the presence of abundant desmin<sup>+</sup>/SCOT<sup>+</sup> cells in livers of fibrogenic SCOT-Macrophage-KO mice suggests effects of AcAc on these effector cells is first modulated through local LysM-Cre<sup>+</sup> cells. Thus, although trans-differentiation of hepatic stellate cells is probably promoted by Kupffer cell macrophages that lack SCOT, future studies need to segregate the roles of mitochondrial ketone metabolism among cell types, and also between AcAc versus D-βOHB among different immune and fibrosis effectors in steatohepatitis amelioration. Due to the highly conserved wound healing process leading to fibrogenesis (Dobie et al., 2015; Pellicoro et al., 2014) our observations in the liver may be relevant in other organs, although the liver is especially poised to leverage ketones due to their abundant production in neighboring hepatocytes, even in the fed state.

#### Limitations of study.

Isotope tracing untargeted metabolomics highlights the contribution of hepatocyte-derived AcAc into diverse macrophage metabolic pathways beyond the TCA cycle, including the glycosaminoglycan cytosolic synthetic pathway. Quantitative measures of AcAc's dynamic

influence over substrate-product relationships in the turnover of diverse glycosaminoglycan species in hepatic macrophages, and in liver tissue, remain to be determined. In addition, future studies will resolve quantitative shifts in glycosaminoglycan species diversity, and the associated impact on hepatic fibrogenesis.

# STAR METHODS

## CONTACT FOR REAGENT AND RESOURCE SHARING

Further information and requests for resources and reagents should be directed to and will be fulfilled by the Lead Contact, Peter Crawford (crawforp@umn.edu).

#### EXPERIMENTAL MODEL AND SUBJECT DETAILS

**Animal models and animal model for primary cells**—Primary macrophage cultures were obtained from 9- to 16-week old male and female C57BL/6NJ sub-strain hybrid mice carrying the *Oxct1<sup>flox/flox</sup>* allele previously described (Cotter et al., 2013). This allele encodes SCOT and is functionally wild type with no obvious phenotype in carriers. Germline ubiquitous SCOT-KO mice are fully lethal in the neonatal period. To generate adult whole-body SCOT knockout mice, *Oxct1<sup>flox/flox</sup>* animals were crossed with the ubiquitously expressed *Cre/ESR1* fusion [B6.Cg-Tg(CAG-cre/Esr1\*)5Amc/J, stock number 004682, Jackson Laboratory], and 6-week old Cre-positive offspring and their Cre-negative littermate controls were subjected to a 17-day tamoxifen (Cayman Chemical) injection regimen at 20 mg/kg animal weight. A two-week washout period after the final injection was allowed for pre-existing SCOT protein turnover (Schugar et al., 2014). These animals are designated as 'SCOT-KO' and 'WT', respectively, where they were used in the experiments described below. Successful KO was confirmed via Western blot for SCOT protein in heart and skeletal muscle and via lack of [<sup>13</sup>C]AcAc oxidation in bone marrow-derived macrophages (BMDM).

Macrophage specific SCOT-KO mice were generated by successive rounds of breeding of Oxct1<sup>*flox/flox*</sup> mice to the LysM-Cre strain from Jackson Laboratories (B6.129P2-Lyz2tm1(cre)ifo/J, stock number 004781, Jackson). Genotyping primers can be found in Table S5.

To create HMGCS2 knockdown mice, ASO treatment was initiated in six week-old mice by injecting (25 mg/kg) of Hmgcs2-targeted ASO (Ionis 191229; 5'-CTGTTTGTCACTGCTGGATG) or scrambled sequence control ASOs (Ionis 141923; 5'-CCTTCCCTGAAGGTTCCTCC) biweekly for 4 weeks prior to initiation of high fat diet, and were continued through high fat diet administration.

To study the role of exogenously-delivered ketone bodies in liver fibrosis, 7 week-old male C57BL/6J mice (stock number 000664) were purchased from Jackson Laboratories.

Mice were maintained on a standard low-fat chow diet (2016 Teklad global 16% protein rodent diet), 8 weeks on high fat diet (D12492; Research Diets; 60% kcal fat, 20% protein, 20% carbohydrate) or 4 weeks on a hepatic fibrogenic diet [D09100301; Research Diets: 40% kcal fat, predominantly *trans* fat (*trans* oleic and *trans* linoleic acids), 20% kcal fructose

Page 14

(total carbohydrate, 40% kcal), and cholesterol (2% w/w)], and given autoclaved water ad libitum. Lights were off between 1900 and 0700 in a room maintained at 22°C. All animal experiments were per formed through protocols formally approved by the Institutional Animal Care and Use Committees at Sanford Burnham Prebys Medical Discovery Institute-Lake Nona and the University of Minnesota.

Bone marrow- derived macrophage (BMDM) isolation and culture—Animals were sacrificed by cervical dislocation prior to harvest of the femurs and tibia of both legs. The marrow was flushed out using cold Ca<sup>2+</sup> and Mg<sup>2+</sup>-free Hank's buffered salt solution (HBSS) delivered through 3-mL syringes and 23- to 27-guage needles, respectively. The pooled marrow from one animal was dispersed using a P1000 micropipette, and debris was allowed to settle before the suspension was transferred into fresh tubes and centrifuged. The resulting pellet was resuspended in BMDM differentiation media (RPMI (Thermo Fisher) with 10% L929 conditioned media, 10% fetal bovine serum (FBS), 10 mM glucose, 2 mM glutamine, 10 U/mL penicillin/streptomycin) and distributed into tissue culture plates at an average density of one animal into 100-cm<sup>2</sup> total surface area for growth. Fresh differentiation media was added two days after isolation. At day 4, exhausted media and non-adherent cells were aspirated from the plates, cells were washed with pre-warmed HBSS, and fresh media was added. After a second media change on day 6, mature macrophages were used on day 7 for labeling and treatment studies. L929 conditioned media was generated by culturing L929 cells to confluence over the course of 4–5 days in 10% FBS supplemented DMEM (50 mL per 175 cm<sup>2</sup> flask), after which the media was removed, filtered, and aliquoted for frozen storage. In all studies, cells isolated from a single animal were counted as a single replicate unless otherwise indicated.

#### METHOD DETAILS

**Synthesis of ACAC**—AcAc was synthetized by a base-catalyzed hydrolysis of ethylacetoacetate (ethyl-AcAc): 8 mL of 1 M NaOH was added to 1 mL ethyl-AcAc while stirring at 60°C. After 30 min, the reaction was neutralized with 50% HCl to pH 8, and the concentration of AcAc was determined with a colorimetric enzyme-based total ketone body (TKB) assay (Wako) prior to aliquoting and storage at  $-80^{\circ}$ C.

**Exogenous delivery of ketone bodies**—To study the role of exogenously-delivered ketone bodies in liver fibrosis, 7 week-old male C57BL/6J mice were acclimatized for one week, and then maintained on fibrogenic diet for 4 weeks and injected twice daily i.p. (10 µmol/g body weight) with AcAc, D- $\beta$ OHB or their vehicles. Because the AcAc synthesis reaction generates equimolar quantities of ethanol and AcAc and no further purification of AcAc was undertaken, ethanol was used as a vehicle for AcAc injections: 250 µL i.p. equimolar (=~5%) ethanol. Sodium D- $\beta$ OHB (Santa Cruz, pH corrected to 7.5, 250 µL i.p.), and equimolar NaCl was used as a vehicle control for D- $\beta$ OHB mice (250 µL). C57BL/6J mice were used for the exogenous ketone (compared to vehicle control) mice fed fibrogenic diet fed for four weeks, receiving injections every 12 hours.

Labeling of cultured primary cells by stable isotopes—BMDMs were incubated in glucose- and serum-free DMEM containing 2 mM glutamine for 1 h prior to the introduction

of 13C-labeled substrates (Cambridge Isotope Laboratories). Uniformly labeled sodium D-[U-<sup>13</sup>C]βOHB (1 mM), or [U-<sup>13</sup>C]AcAc (1 mM) were added to DMEM containing 10 mM glucose and 2 mM glutamine. For experiments using exogenously added [U-13C]glucose (10 mM), glucose-free DMEM was used. Uniformly labeled AcAc was generated by a basecatalyzed hydrolysis of  $[1,2,3,4-^{13}C_4]$  ethylacetoacetate using same protocol as for unlabeled AcAc. EtOH was added to control experiments at a concentration equal to that of the highest amount of AcAc used due to the equimolar quantity of EtOH in the sample after AcAc synthesis. Labeling experiments were done for 6h and/or 24h, at which points the media was removed and cells were processed using the metabolite extraction method described below. To induce M1 or M2 activation in BMDMs, lipopolysaccharide (LPS, Millipore) or IL-4 (PeproTech), respectively, were added to a final concentration of 25 ng/mL to the labeling media at the same time the media was introduced to the cells after their 1 h incubation in glucose- and serum-free DMEM. All drug (carbonyl cyanide-4-(trifluoromethoxy)phenylhydrazone (FCCP, Enzo Life Sciences) and substrate treatments (AcAc) were introduced simultaneously with the labeling media and macrophage activators and maintained for either 6 h or 24 h.

Extraction of metabolites from cells, liver tissue and conditioned media—Cells, liver tissues and conditioned media were extracted using previously described method (Chen et al., 2016) with modifications. Cells were washed twice with pre-warmed PBS and once with Milli-Q water. The tissue culture plate was then placed in a liquid nitrogen bath for 30 s to quench metabolism and initiate cell lysis. Cold MeOH (-20°C) was added at a ratio of  $500 \,\mu\text{L}$  per 6-cm dish or single well of a 6-well plate, the cells were scraped, transferred to 1.7 mL polypropylene microfuge tubes, and MeOH was evaporated using a Speed-Vac (Savant SPD 1010). Frozen lobes of liver tissue were lyophilized prior to extraction. Cells, and lyophilized liver tissue were extracted using cold (-20°C) 1000 µL of 2:2:1 MeOH:acetonitrile:H2O. Conditioned media (200 µL) was extracted with cold (-20°C) 800 µL of 1:1 MeOH:acetonitrile (ACN). Therefore, all samples were extracted by three cycles of vortexing, freeze-thawing, and water bath sonication. The samples were then incubated at  $-20^{\circ}$ C for 1 h followed by a 10 min spin at maximum speed to remove proteins from the solvent, which was then transferred to fresh tubes and evaporated off in the speed-vac. The dried metabolite pellet was reconstituted in 40 µL (cells) or 100 µL (liver tissue or conditioning media) 1:1 acetonitrile:H2O with the aid of vortexing and sonication, and incubated at 4°C for 1 h. Samples were then spun down and the supernatant was analyzed by LC/MS.

**Targeted and untargeted LC/MS analysis**—Liquid chromatography was performed on a Dionex Ultimate 3000 RSLC using a Phenomenex Luna NH<sub>2</sub> column (100 mm × 1 mm, 3 µm particle size) for untargeted metabolomics surveys. We used hydrophilic interaction liquid chromatography (HILIC) mode, with the following mobile phase compositions: A = 95% H<sub>2</sub>O, 5% ACN, 10 mM NH<sub>4</sub>OAc/NH<sub>4</sub>OH, pH 9.5; B = 95% ACN, 5% H<sub>2</sub>O, 10 mM NH<sub>4</sub>OAc/NH<sub>4</sub>OH, pH 9.5. Unless otherwise stated, the extracts were usually separated using binary gradient 75–0% B for 45 min, then 0% B for 12 min, and 75% B for 13 min at 50 µL/min. [<sup>13</sup>C]glucose analysis of SCOT WT and SCOT KO IL4 stimulated BMDMs, and tissue extract analysis were performed with extended gradient starting at 100% B for 5 min,

100-0% of B for 45 min, 0-100% of B for 7 min, and 100% B for next 13 min. Column temperature was maintained at 30°C, and injection volume was 4 µL. Citrulline quantification in conditioned media was performed using isocratic elution of 75% B for 6 min; flow rate 50  $\mu$ L/min; column temperature at 30°C; and injection volume 4  $\mu$ L. Prior to the analysis, to the conditioned media, the standard of alanine at the concentration of 15  $\mu$ M was added as an internal standard. Mass spectrometry (MS) was performed on a Thermo Q Exactive Plus with heated ESI source. The MS was operated mostly in negative mode with exception of citrulline analysis where positive mode was applied. MS resolution was set to 70,000 and the AGC target to  $3e^{6}$  ions with a maximum injection time of 200 ms. The mass scan for extract analysis was 68–1020 m/z, while for citrulline was 80–200 m/z. In targeted analysis, full scan mode was used with the addition of inclusion list of the ions of interests. The resolution was set to 35,000, AGC target to 2e<sup>5</sup> ions with a maximum injection time of 100 ms, isolation width 4.0 m/z, and fixed normalized collision energy 35 (arbitrary unit). Common ESI parameters were: auxiliary gas 10, sweep gas 1, spray voltage -3 kV, capillary temperature 275°C, S-lens RF 50, and auxiliary gas temperature 150°C. The she ath gas flow for extract analysis was set to 35 (arbitrary unit).

LC/MS data processing—Data from liver metabolomics and stable isotope tracing untargeted metabolomics (ITUM) experiments (.RAW files) were converted to the mzXML format using MSConvert with the vendor peak-picking option selected, and processed using XCMSonline or X<sup>13</sup>CMS R package as described previously (Cotter et al., 2014; Huang et al., 2014; Mahieu et al., 2016a; Mahieu et al., 2016b). The .RAW data files were uploaded for analysis using Compound Discoverer (ver. 2.1). Liver metabolomics data was uploaded to XCMSonline, and analyzed based on a method "HPLC / Orbitrap - HPLC with ~60 min gradient / Orbitrap" available online with modifications. The feature detection parameters were 5 ppm, peak width interval to 10-180 min, integration method to 2, and prefilter intensity to 500. Retention time correction was changed to 0.5 prof Step (in m/z), while alignment by to 30 and mzwid to 0.025. Peaks with fold change greater than 2 were selected, with median fold change normalization option. For Compound Discoverer 2.1. the analysis was performed based on the "untarg. Metabolomics w Statistics Detect Unknowns w Mapped Pathways and ID using online databases" workflow with modifications. To select the spectra, 60-1500 Da m/z span was used with intensity threshold 500, and highest charge 4. We applied adaptive alignment curve method with maximum 4 min RT shift and 5 ppm mass tolerance. Unknown compounds were detected with 5 ppm mass tolerance, and grouped with 1 min RT tolerance. Maximum of 10 compounds per feature were predicted and searched against ChemSpider and KEGG database with 5 ppm mass tolerance. For ITUM  $X^{13}$ CMS base analysis, the data was processed using R studio where the XCMS (v. 1.4) package was used to pick chromatographic (method = 'centWave', ppm = 2.5, peakwidth = c(20, 180)) peaks and align retention time (bw=10, mzwid=0.015, retention time correction method = 'obiwarp') across samples within an experiment.  $X^{13}CMS$  (v.1.4) was used on the output to extract isotopologue groups. The parameters used for X<sup>13</sup>CMS are RTwindow = 10, ppm = 5, noiseCutoff = 10000, intChoice = "intb", alpha = 0.05 within getIsoLabelReport().

**Identification of metabolites detected in LC/MS and pathway analysis**—The identity of a subset of metabolites was confirmed by matching the retention time and MS/MS of standard compounds run using identical chromatographic separation conditions (Table S5). Another subset was assigned putative identifications based on (i) match of unlabeled accurate masses in the Metlin database, (ii) molecular formulas and structures, which could produce the observed number of carbon labels in a biological context, and (iii) predicted retention time based on chemical similarity to standard compounds (Table S5). Pathway analysis was performed with the aid of PIUMet analysis (Pirhaji et al., 2016) and MBRole web-based application (Lopez-Ibanez et al., 2016). For PIUMet analysis the files containing input m/z values, polarization modes, and –log of p values were uploaded for the analysis. For labeled compound found just in one macrophage polarization state, the p value was assumed to be 0.05. For MBRole analysis, the putative identification were assigned based on the hmdb.ca (Wishart et al., 2013) database search from PIUMet output. HMDB output was mapped using MBRole against mouse KEGG or BioCyc database.

**Gene expression analysis**—RNA was purified from whole liver or inguinal subcutaneous fat lysates homogenized in RLT Buffer (Qiagen) with 1% of 2-Mercaptoethanol or from cell extracts using the RNeasy Mini Kit (Qiagen) or RNeasy Lipid Tissue Mini Kit (Qiagen) following the manufacturer's guidelines. Reverse transcripts were generated using SuperScript II (Invitrogen), while real-time reverse-transcription polymerase chain reaction (RT-PCR) was performed using SsoAdvanced<sup>TM</sup> Universal SYBR® Green Supermix (Bio-Rad) on the CFX384 Real-Time System (Bio-Rad). Transcripts were quantified using the  $2^{-}$  Ct method, with *Rpl32* as an internal reference. Primer sequences are listed in Table S5.

**Immunoblotting**—Protein extracts were collected from 6-well macrophage cultures by scraping in protein lysis buffer (PLB) containing 20 mM Tris-HCl, 150 mM NaCl, 1 mM EDTA, 1% Triton-X 100 at pH 7.5 and supplemented with protease inhibitor cocktail (cOmplete, mini, EDTA-free, Roche), phosphatase inhibitor cocktail (Sigma). Whole liver protein lysates were prepared from frozen tissue sections and homogenized in ten times volume (microliters) to mass in PLB with inhibitors. Immunoblot analysis was performed as described previously (Wentz et al., 2010). Protein targets of interest were probed with the following primary antibodies: polyclonal rabbit anti-BDH1 (Proteintech Group; 1:1200); polyclonal rabbit anti-SCOT (Proteintech Group; 1:5000), rabbit anti-mHMGCS2 (Santa Cruz Biotechnology Inc.; 1:2000). Secondary antibodies conjugated to horseradish peroxidase was goat anti-rabbit IgG (Southern Biotech; 1:2000 for BDH1; 1:15000 for SCOT; 1:50000 for HMHCS2). All targets were normalized to actin, which was probed with a polyclonal rabbit anti-actin (Sigma; varying dilutions) and goat anti-rabbit IgG HRP (Southern Biotech). Band intensities were measured densitometrically using Quantity One software (Bio-Rad).

**Histology and Immunohistochemical Staining**—Following sacrifice, mouse liver sections were either fixed in 10% neutral buffered formalin (VWR International) or cryopreserved in Optimal Cutting Temperature (OCT) compound (Tissue-Tek). Formalin tissues were embedded in paraffin, sectioned via microtome, and stained with hematoxylin and

eosin, PicroSirius Red (Sanford Burnham Prebys Histology and University of Minnesota CTSI Histology Cores), or Oil Red O. Bright field hematoxylin and eosin and Oil Red O images were obtained using the EVOSTM XL Core Cell Imaging System (Life Technologies), polarized-light PicroSirius Red images were acquired using the Eclipse LV100N POL (Nikon) or Leica DFC7000T (Leica). PicroSirius Red was quantified using ImageJ software, followed by averaging the percent area of fibrosis for 20 randomly selected fields at  $20 \times$  magnification. To selectively quantify sinusoidal fibrosis and exclude collagen juxtaposed to luminal openings of the central vasculature, central veins and portal triads were excluded from the quantification. Frozen tissue sections preserved in OCT were cut in 10 µm slices using the Leica 1900 UV Cryostat at -20°C. Tissue s lices were fixed onto slides in 2% paraformaldehyde from 1 hour, depermeabilized for 20 minutes in 0.25% Triton X-100 (Tx-100), and blocked in 5% BSA/PBS-0.1% Tx-100 1 hour. Immunostaining for F4/80-positive cells was performed as previously described (Schugar et al., 2013). Rabbit polyclonal anti-SCOT (Proteintech Group; 1:150) was incubated for 1 hour at room temperature, followed by Alexa Flour 488 conjugated goat anti-rabbit IgG (Invitrogen) for 30 minutes, and counterstained with 4, 6-diamidino-2-phenylindole (DAPI: 1:10,000 in  $10\times$ PBS/0.1% Tx-100) for 5 minutes. Goat polyclonal anti-desmin (R&D Systems; 1:40) was incubated overnight at 4°C, followed by Alexa Fluor 647 conjugated donkey anti-goat IgG (Invitrogen) for 2 hours at room temperature and mounted with Vectashield mounting medium with DAPI (Vector Laboratories). Primary and secondary antibodies were prepared in 5% BSA/10× PBS/0.1% Tx-100. All immunofluorescent images were captured using a Nikon A1R VAAS Inverted Confocal Microscope at 400× magnification for images included in the results, and quantifications were at  $20 \times$  magnification. The number of F4/80<sup>+</sup> macrophages per mm<sup>2</sup> depicts the average number in 20 acquired images.

**RNA-Seq and Analysis**—RNA-Seq library was prepared from two biological replicates by using TruSeq RNA Sample Preparation Kit (Illumina) according to manufacturer protocol. Briefly, 2.5 µg total RNA was used for the library preparation. In the first step poly-A tailed RNA molecules (mRNA) were purified with poly-T oligo-attached magnetic beads. Following the purification mRNA is fragmented using divalent cations at 85 °C, then first strand cDNA was generated using random primers and SuperScript II reverse transcriptase (Invitrogen). This was followed by the second strand cDNA synthesis, then double stranded cDNA fragments went through an end repair process, the addition of a single 'A' base and then barcode indexed adapter ligation. Adapter-ligated products were enriched with adapter specific PCR to create cDNA library. Agarose gel electrophoresis was performed on E-Gel EX 2% agarose gel (Invitrogen) and the library was purified from the gel using QIAquick Gel Extraction Kit (Qiagen). Fragment size and molar concentration were checked on Agilent BioAnalyzer using DNA1000 chip (Agilent Technologies). Libraries were sequenced with Illumina HiScanSQ sequencer. The TopHat-Cufflinks-CummeRbund toolkit trio (Trapnell et al., 2012) was used for mapping spliced reads, making transcript assemblies, and getting, sorting and visualizing gene expression data. Expressional values were in FPKM format: Fragments Per Kilobase of exon per Million fragments mapped. Data is available under the following accession number: GSE106706.

**ChIP-seq (Chromatin immunoprecipitation followed by sequencing) and analysis**—ChIP was performed as previously described (Daniel et al., 2014; Daniel et al., 2014b). Libraries were prepared either with TruSeq ChIP library systems (Illumina) according to the manufacturer's instructions STAT6 (sc-981). Fragment distribution of libraries was assessed with Agilent Bioanalyzer and libraries were sequenced on a HiSeq 2500 platform. The primary analysis of ChIP-seq derived raw sequence reads has been carried out using our ChIP-seq analysis command line pipeline (Barta, 2011). Data is available under the following accession number: GSE106706.

**Shotgun lipidomics-guided TAG quantification**—Frozen liver samples were weighted (20–30 mg) and homogenized in ice cold water (Han et al., 2004). According to the BCA protein concentration result, an appropriate amount of internal standard (T17:1 Triheptadecanoylglycerol from Nu-Chekprep, Inc. USA) was added to the homogenate. Around 130  $\mu$ L of homogenate with internal standard was extracted using previously described method (Wang et al., 2014), dried under the nitrogen, diluted to a final concentration of ~500 fmol/ $\mu$ L and infused directly to TSQ Vantage triple quadrupole mass spectrometer (Thermo Fisher). Shotgun lipidomics was performed according to published method (Yang et al., 2009) where acyl chains were identified by neutral loss scan of [TAG +Li]<sup>+</sup> adducts at -35 eV collision energy and quantified using in house program.

Serum ketone body, glucose assays and Glucose Tolerance Test (GTT)—Serum total ketone body (TKB),  $\beta$ OHB (Autokit 3-HB) (Wako) and glucose assays were performed according to manufactures protocols. GTT test was performed as described previously (Cotter et al., 2014).

#### QUANTIFICATION AND STATISTICAL ANALYSIS

Data were plotted and statistical analysis was performed on Prism (GraphPad) v7.0. Numbers of observations, assessments of normal distributions, and statistical tests applied are provided in the Figure Legends. In most of the experiments, investigators were blinded to the genotype of mice.

#### DATA AND SOFTWARE AVAILABILITY

All data obtained from X13CMS and XCMSonline analysis is available in Supplementary Tables of this manuscript. Chip-seq and RNA-seq data are available under the following accession number: GSE106706 or in (Czimmerer et al., 2018). Most of utilized software platforms used in this manuscript have free open source licenses.

#### Supplementary Material

Refer to Web version on PubMed Central for supplementary material.

# Acknowledgments

The authors thank J. Matthew Gandy and Matthew Longo for mouse husbandry, Peter E. Phelan for guidance on primary macrophage isolation and culture, and Laura Kyro for graphics expertise. This work was supported in part by grants from the NIH (DK091538, DK115924, CA235482, ES028365, and OD024624). B.D. is supported by the American Heart Association (AHA) postdoctoral fellowship (17POST33660450).

# References

- Adolph TE, Grander C, Grabherr F, and Tilg H (2017). Adipokines and Non-Alcoholic Fatty Liver Disease: Multiple Interactions. Int. J. Mol. Sci 18, 10.3390/ijms18081649.
- Barta E (2011). Command line analysis of ChIP-seq results. EMBnet. Journal 17, 13–17.
- Booth SC, Weljie AM, and Turner RJ (2013). Computational tools for the secondary analysis of metabolomics experiments. Comput. Struct. Biotechnol. J 4, e201301003. [PubMed: 24688685]
- Brooks GA (2018). The Science and Translation of Lactate Shuttle Theory. Cell. Metab 27, 757–785. [PubMed: 29617642]
- Buck MD, Sowell RT, Kaech SM, and Pearce EL (2017). Metabolic Instruction of Immunity. Cell 169, 570–586. [PubMed: 28475890]
- Campo GM, Avenoso A, Campo S, Ferlazzo AM, Micali C, Zanghi L, and Calatroni A (2004). Hyaluronic acid and chondroitin-4-sulphate treatment reduces damage in carbon tetrachlorideinduced acute rat liver injury. Life Sci 74, 1289–1305. [PubMed: 14697411]
- Chang MY, Chan CK, Braun KR, Green PS, O'Brien KD, Chait A, Day AJ, and Wight TN (2012). Monocyte-to-macrophage differentiation: synthesis and secretion of a complex extracellular matrix. J. Biol. Chem 287, 14122–14135. [PubMed: 22351750]
- Chen S, and Birk DE (2013). The regulatory roles of small leucine-rich proteoglycans in extracellular matrix assembly. Febs J 280, 2120–2137. [PubMed: 23331954]
- Chen YJ, Mahieu NG, Huang X, Singh M, Crawford PA, Johnson SL, Gross RW, Schaefer J, and Patti GJ (2016). Lactate metabolism is associated with mammalian mitochondria. Nat. Chem. Biol 12, 937–943. [PubMed: 27618187]
- Cooper RH, Randle PJ, and Denton RM (1975). Stimulation of phosphorylation and inactivation of pyruvate dehydrogenase by physiological inhibitors of the pyruvate dehydrogenase reaction. Nature 257, 808–809. [PubMed: 171583]
- Cotter DG, Ercal B, Huang X, Leid JM, d'Avignon DA, Graham MJ, Dietzen DJ, Brunt EM, Patti GJ, and Crawford PA (2014). Ketogenesis prevents diet-induced fatty liver injury and hyperglycemia. J. Clin. Invest 124, 5175–5190. [PubMed: 25347470]
- Cotter DG, Schugar RC, Wentz AE, d'Avignon DA, and Crawford PA (2013). Successful adaptation to ketosis by mice with tissue-specific deficiency of ketone body oxidation. Am. J. Physiol. Endocrinol. Metab 304, E363–74. [PubMed: 23233542]
- Czimmerer Z, Daniel B, Horvath A, Rückerl D, Nagy G, Kiss M, Peloquin M, Budai MM, Cuaranta-Monroy I, Simandi Z, et al. (2018). The Transcription Factor STAT6 Mediates Direct Repression of Inflammatory Enhancers and Limits Activation of Alternatively Polarized Macrophages. Immunity 48, 75–90.e6. [PubMed: 29343442]
- Daniel B, Balint BL, Nagy ZS, and Nagy L (2014). Mapping the genomic binding sites of the activated retinoid 0× receptor in murine bone marrow-derived macrophages using chromatin immunoprecipitation sequencing. Methods Mol. Biol 1204, 15–24. [PubMed: 25182757]
- Daniel B, Nagy G, Hah N, Horvath A, Czimmerer Z, Poliska S, Gyuris T, Keirsse J, Gysemans C, Van Ginderachter JA, et al. (2014b). The active enhancer network operated by liganded RXR supports angiogenic activity in macrophages. Genes Dev 28, 1562–1577. [PubMed: 25030696]
- d'Avignon DA, Puchalska P, Ercal B, Chang Y, Martin SE, Graham MJ, Patti GJ, Han X, and Crawford PA (2018). Hepatic ketogenic insufficiency reprograms hepatic glycogen metabolism and the lipidome. JCI Insight 3, e99762.
- Decaris ML, Li KW, Emson CL, Gatmaitan M, Liu S, Wang Y, Nyangau E, Colangelo M, Angel TE, Beysen C, et al. (2017). Identifying nonalcoholic fatty liver disease patients with active fibrosis by measuring extracellular matrix remodeling rates in tissue and blood. Hepatology 65, 78–88. [PubMed: 27706836]
- Diehl AM, and Day C (2017). Cause, Pathogenesis, and Treatment of Nonalcoholic Steatohepatitis. N. Engl. J. Med 377, 2063–2072. [PubMed: 29166236]
- Dobie R, Connelly J, and Henderson NC (2015). PDGF-Mediated Regulation of Liver Fibrosis. Current Pathobiology Reports 3, 225–233.
- Edmond J (1974). Ketone bodies as precursors of sterols and fatty acids in the developing rat. J. Biol. Chem 249, 72–80. [PubMed: 4809632]

- Endemann G, Goetz PG, Edmond J, and Brunengraber H (1982). Lipogenesis from ketone bodies in the isolated perfused rat liver. Evidence for the cytosolic activation of acetoacetate. J. Biol. Chem 257, 3434–3440. [PubMed: 7061490]
- Friedman SL (2008). Hepatic stellate cells: protean, multifunctional, and enigmatic cells of the liver. Physiol. Rev 88, 125–172. [PubMed: 18195085]
- Gao B, Xu MJ, Bertola A, Wang H, Zhou Z, and Liangpunsakul S (2017). Animal Models of Alcoholic Liver Disease: Pathogenesis and Clinical Relevance. Gene Expr 17, 173–186. [PubMed: 28411363]
- Gonzalez-Hurtado E, Lee J, Choi J, Selen Alpergin ES, Collins SL, Horton MR, and Wolfgang MJ (2017). The Loss Of Macrophage Fatty Acid Oxidation Does Not Potentiate Systemic Metabolic Dysfunction. Am. J. Physiol. Endocrinol. Metab 312, E381–E393. [PubMed: 28223293]
- Guilliams M, Dutertre CA, Scott CL, McGovern N, Sichien D, Chakarov S, Van Gassen S, Chen J, Poidinger M, De Prijck S, et al. (2016). Unsupervised High-Dimensional Analysis Aligns Dendritic Cells across Tissues and Species. Immunity 45, 669–684. [PubMed: 27637149]
- Habuchi H, Ushida T, and Habuchi O (2016). Mice deficient in N-acetylgalactosamine 4-sulfate 6-Osulfotransferase exhibit enhanced liver fibrosis and delayed recovery from fibrosis in carbon tetrachloride-treated mice. Heliyon 2, e00138. [PubMed: 27547834]
- Han X, Yang J, Cheng H, Ye H, and Gross RW (2004). Toward fingerprinting cellular lipidomes directly from biological samples by two-dimensional electrospray ionization mass spectrometry. Anal. Biochem 330, 317–331. [PubMed: 15203339]
- Hasegawa S, Ikeda Y, Yamasaki M, and Fukui T (2012). The Role of Acetoacetyl-CoA Synthetase, a Ketone Body-Utilizing Enzyme, in 3T3-L1 Adipocyte Differentiation. Biological and Pharmaceutical Bulletin 35, 1980–1985. [PubMed: 23123469]
- Huang X, Chen YJ, Cho K, Nikolskiy I, Crawford PA, and Patti GJ (2014). X13CMS: global tracking of isotopic labels in untargeted metabolomics. Anal. Chem 86, 1632–1639. [PubMed: 24397582]
- Jain SK, Kannan K, Lim G, McVie R, and Bocchini JA Jr. (2002). Hyperketonemia increases tumor necrosis factor-alpha secretion in cultured U937 monocytes and Type 1 diabetic patients and is apparently mediated by oxidative stress and cAMP deficiency. Diabetes 51, 2287–2293. [PubMed: 12086962]
- Kanikarla-Marie P, and Jain SK (2015). Hyperketonemia (acetoacetate) upregulates NADPH oxidase 4 and elevates oxidative stress, ICAM-1, and monocyte adhesivity in endothelial cells. Cell. Physiol. Biochem 35, 364–373. [PubMed: 25591777]
- Kapoor N, Niu J, Saad Y, Kumar S, Sirakova T, Becerra E, Li X, and Kolattukudy PE (2015). Transcription Factors STAT6 and KLF4 Implement Macrophage Polarization via the Dual Catalytic Powers of MCPIP. The Journal of Immunology 194, 6011–6023. [PubMed: 25934862]
- Kelly B, and O'Neill LA (2015). Metabolic reprogramming in macrophages and dendritic cells in innate immunity. Cell Res 25, 771–784. [PubMed: 26045163]
- Koyama Y, and Brenner DA (2017). Liver inflammation and fibrosis. J. Clin. Invest 127, 55–64. [PubMed: 28045404]
- Krebs HA, and Hems R (1970). Fatty acid metabolism in the perfused rat liver. Biochem. J 119, 525– 533. [PubMed: 5500312]
- Krebs HA, Wallace PG, Hems R, and Freedland RA (1969). Rates of ketone-body formation in the perfused rat liver. Biochem. J 112, 595–600. [PubMed: 5822063]
- Kurepa D, Pramanik AK, Kakkilaya V, Caldito G, Groome LJ, Bocchini JA, and Jain SK (2012). Elevated acetoacetate and monocyte chemotactic protein-1 levels in cord blood of infants of diabetic mothers. Neonatology 102, 163–168. [PubMed: 22776897]
- Laskin JD, Dokidis A, Gardner CR, and Laskin DL (1991). Changes in sulfated proteoglycan production after activation of rat liver macrophages. Hepatology 14, 306–312. [PubMed: 1860687]
- Liu CH, Lan CT, Chou JF, Tseng TJ, and Liao WC (2017). CHSY1 promotes aggressive phenotypes of hepatocellular carcinoma cells via activation of the hedgehog signaling pathway. Cancer Lett 403, 280–288. [PubMed: 28652022]
- Liu L, MacKenzie KR, Putluri N, Maleti -Savati M, and Bellen HJ (2017). The Glia-Neuron Lactate Shuttle and Elevated ROS Promote Lipid Synthesis in Neurons and Lipid Droplet Accumulation in Glia via APOE/D. Cell Metabolism 26, 719–737. [PubMed: 28965825]

- Lopez-Ibanez J, Pazos F, and Chagoyen M (2016). MBROLE 2.0-functional enrichment of chemical compounds. Nucleic Acids Res 44, W201–4. [PubMed: 27084944]
- Machado MV, Michelotti GA, Xie G, Almeida Pereira T, Boursier J, Bohnic B, Guy CD, and Diehl AM (2015). Mouse models of diet-induced nonalcoholic steatohepatitis reproduce the heterogeneity of the human disease. PLoS One 10, e0127991. [PubMed: 26017539]
- Mahieu NG, Spalding JL, and Patti GJ (2016a). Warpgroup: increased precision of metabolomic data processing by consensus integration bound analysis. Bioinformatics 32, 268–275. [PubMed: 26424859]
- Mahieu NG, Genenbacher JL, and Patti GJ (2016b). A roadmap for the XCMS family of software solutions in metabolomics. Current Opinion in Chemical Biology 30, 87–93. [PubMed: 26673825]
- Mardinoglu A, Wu H, Bjornson E, Zhang C, Hakkarainen A, Rasanen SM, Lee S, Mancina RM, Bergentall M, Pietilainen KH, et al. (2018). An Integrated Understanding of the Rapid Metabolic Benefits of a Carbohydrate-Restricted Diet on Hepatic Steatosis in Humans. Cell Metabolism 27, 559–571. [PubMed: 29456073]
- Martinez FO, and Gordon S (2014). The M1 and M2 paradigm of macrophage activation: time for reassessment. F1000Prime Rep 6, 13–13. eCollection 2014. [PubMed: 24669294]
- Martinez P, Denys A, Delos M, Sikora AS, Carpentier M, Julien S, Pestel J, and Allain F (2015). Macrophage polarization alters the expression and sulfation pattern of glycosaminoglycans. Glycobiology 25, 502–513. [PubMed: 25504800]
- Matsubayashi Y, Louani A, Dragu A, Sanchez-Sanchez BJ, Serna-Morales E, Yolland L, Gyoergy A, Vizcay G, Fleck RA, Heddleston JM, et al. (2017). A Moving Source of Matrix Components Is Essential for De Novo Basement Membrane Formation. Curr. Biol 27, 3526–3534.e4. [PubMed: 29129537]
- McGarry JD, and Foster DW (1980). Regulation of hepatic fatty acid oxidation and ketone body production. Annu. Rev. Biochem 49, 395–420. [PubMed: 6157353]
- McGarry JD, and Foster DW (1971). The regulation of ketogenesis from octanoic acid. The role of the tricarboxylic acid cycle and fatty acid synthesis. J. Biol. Chem 246, 1149–1159. [PubMed: 5543682]
- Mederacke I, Hsu CC, Troeger JS, Huebener P, Mu X, Dapito DH, Pradere JP, and Schwabe RF (2013). Fate tracing reveals hepatic stellate cells as dominant contributors to liver fibrosis independent of its aetiology. Nat. Commun 4, 2823. [PubMed: 24264436]
- Meroni E, Papini N, Criscuoli F, Casiraghi MC, Massaccesi L, Basilico N, and Erba D (2018). Metabolic Responses in Endothelial Cells Following Exposure to Ketone Bodies. Nutrients 10, E250. [PubMed: 29470430]
- Minutti CM, Knipper JA, Allen JE, and Zaiss DMW (2017). Tissue-specific contribution of macrophages to wound healing. Semin. Cell Dev. Biol 61, 3–11. [PubMed: 27521521]
- Miyata E, Masuya M, Yoshida S, Nakamura S, Kato K, Sugimoto Y, Shibasaki T, Yamamura K, Ohishi K, Nishii K, et al. (2008). Hematopoietic origin of hepatic stellate cells in the adult liver. Blood 111, 2427–2435. [PubMed: 18042797]
- Mowat AM, Scott CL, and Bain CC (2017). Barrier-tissue macrophages: functional adaptation to environmental challenges. Nat. Med 23, 1258–1270. [PubMed: 29117177]
- Nomura M, Liu J, Rovira II, Gonzalez-Hurtado E, Lee J, Wolfgang MJ, and Finkel T (2016). Fatty acid oxidation in macrophage polarization. Nat. Immunol 17, 216–217. [PubMed: 26882249]
- Orii KE, Fukao T, Song XQ, Mitchell GA, and Kondo N (2008). Liver-specific silencing of the human gene encoding succinyl-CoA: 3-ketoacid CoA transferase. Tohoku J. Exp. Med 215, 227–236. [PubMed: 18648183]
- Pawlak M, Baugé E, Lalloyer F, Lefebvre P, and Staels B (2015). Ketone Body Therapy Protects From Lipotoxicity and Acute Liver Failure Upon Ppara. Deficiency. Molecular Endocrinology 29, 1134– 1143. [PubMed: 26087172]
- Pellicoro A, Ramachandran P, Iredale JP, and Fallowfield JA (2014). Liver fibrosis and repair: immune regulation of wound healing in a solid organ. Nat. Rev. Immunol 14, 181–194. [PubMed: 24566915]

- Pirhaji L, Milani P, Leidl M, Curran T, Avila-Pacheco J, Clish CB, White FM, Saghatelian A, and Fraenkel E (2016). Revealing disease-associated pathways by network integration of untargeted metabolomics. Nat. Methods 13, 770–776. [PubMed: 27479327]
- Puchalska P, Huang X, Martin S, Han X, Patti G, and Crawford P (2018). Isotope tracing untargeted metabolomics reveals macrophage polarization state-specific metabolic coordination across intracellular compartments Submitted
- Puchalska P, and Crawford PA (2017). Multi-dimensional Roles of Ketone Bodies in Fuel Metabolism, Signaling, and Therapeutics. Cell Metabolism 25, 262–284. [PubMed: 28178565]
- Puleston DJ, Villa M, and Pearce EL (2017). Ancillary Activity: Beyond Core Metabolism in Immune Cells. Cell Metabolism 26, 131–141. [PubMed: 28683280]
- Rahman M, Muhammad S, Khan MA, Chen H, Ridder DA, Muller-Fielitz H, Pokorna B, Vollbrandt T, Stolting I, Nadrowitz R, et al. (2014). The B-hydroxybutyrate receptor HCA2 activates a neuroprotective subset of macrophages. Nat Commun 5, 3944. [PubMed: 24845831]
- Robinson AM, and Williamson DH (1980). Physiological roles of ketone bodies as substrates and signals in mammalian tissues. Physiol. Rev 60, 143–187. [PubMed: 6986618]
- Saha S, Shalova IN, and Biswas SK (2017). Metabolic regulation of macrophage phenotype and function. Immunol. Rev 280, 102–111. [PubMed: 29027220]
- Schoors S, Bruning U, Missiaen R, Queiroz KC, Borgers G, Elia I, Zecchin A, Cantelmo AR, Christen S, Goveia J, et al. (2015). Fatty acid carbon is essential for dNTP synthesis in endothelial cells. Nature 520, 192–197. [PubMed: 25830893]
- Schugar RC, Huang X, Moll AR, Brunt EM, and Crawford PA (2013). Role of choline deficiency in the Fatty liver phenotype of mice fed a low protein, very low carbohydrate ketogenic diet. PLoS One 8, e74806. [PubMed: 24009777]
- Schugar RC, Moll AR, André d'Avignon D, Weinheimer CJ, Kovacs A, and Crawford PA (2014). Cardiomyocyte-specific deficiency of ketone body metabolism promotes accelerated pathological remodeling. Molecular Metabolism 3, 754–769. [PubMed: 25353003]
- Scott CL, Zheng F, De Baetselier P, Martens L, Saeys Y, De Prijck S, Lippens S, Abels C, Schoonooghe S, Raes G, et al. (2016). Bone marrow-derived monocytes give rise to self-renewing and fully differentiated Kupffer cells. Nat. Commun 7, 10321. [PubMed: 26813785]
- Shi X, Li X, Li D, Li Y, Song Y, Deng Q, Wang J, Zhang Y, Ding H, Yin L, et al. (2014). beta-Hydroxybutyrate activates the NF-kappaB signaling pathway to promote the expression of proinflammatory factors in calf hepatocytes. Cell. Physiol. Biochem 33, 920–932. [PubMed: 24713665]
- Soufi N, Hall AM, Chen Z, Yoshino J, Collier SL, Mathews JC, Brunt EM, Albert CJ, Graham MJ, Ford DA, and Finck BN (2014). Inhibiting monoacylglycerol acyltransferase 1 ameliorates hepatic metabolic abnormalities but not inflammation and injury in mice. J. Biol. Chem 289, 30177– 30188. [PubMed: 25213859]
- Trapnell C, Roberts A, Goff L, Pertea G, Kim D, Kelley DR, Pimentel H, Salzberg SL, Rinn JL, and Pachter L (2012). Differential gene and transcript expression analysis of RNA-seq experiments with TopHat and Cufflinks. Nat. Protoc 7, 562–578. [PubMed: 22383036]
- Vats D, Mukundan L, Odegaard JI, Zhang L, Smith KL, Morel CR, Greaves DR, Murray PJ, and Chawla A (2006). Oxidative metabolism and PGC-1β attenuate macrophage-mediated inflammation. Cell Metabolism 4, 13–24. [PubMed: 16814729]
- Verdeguer F, and Aouadi M (2017). Macrophage heterogeneity and energy metabolism. Experimental Cell Research 360, 35–40. [PubMed: 28341447]
- Vogel KG, Paulsson M, and Heinegard D (1984). Specific inhibition of type I and type II collagen fibrillogenesis by the small proteoglycan of tendon. Biochem. J 223, 587–597. [PubMed: 6439184]
- Wang C, Wang M, Zhou Y, Dupree JL, and Han X (2014). Alterations in mouse brain lipidome after disruption of CST gene: a lipidomics study. Mol. Neurobiol 50, 88–96. [PubMed: 24395133]
- Wentz AE, d'Avignon DA, Weber ML, Cotter DG, Doherty JM, Kerns R, Nagarajan R, Reddy N, Sambandam N, and Crawford PA (2010). Adaptation of myocardial substrate metabolism to a ketogenic nutrient environment. J. Biol. Chem 285, 24447–24456. [PubMed: 20529848]

- Wildenhoff KE, Johansen JP, Karstoft H, Yde H, and Sorensen NS (1974). Diurnal variations in the concentrations of blood acetoacetate and 3-hydroxybutyrate. The ketone body peak around midnight and its relationship to free fatty acids, glycerol, insulin, growth hormone and glucose in serum and plasma. Acta Med. Scand 195, 25–28. [PubMed: 4817087]
- Williamson DH, Lund P, and Krebs HA (1967). The redox state of free nicotinamide-adenine dinucleotide in the cytoplasm and mitochondria of rat liver. Biochem. J 103, 514–527. [PubMed: 4291787]
- Winberg J, Kolset SO, Berg E, and Uhlin-Hansen L (2000). Macrophages Secrete Matrix Metalloproteinase 9 Covalently Linked to the Core Protein of Chondroitin Sulphate Proteoglycans. Journal of Molecular Biology 304, 669–680. [PubMed: 11099388]
- Wishart DS, Jewison T, Guo AC, Wilson M, Knox C, Liu Y, Djoumbou Y, Mandal R, Aziat F, Dong E, et al. (2013). HMDB 3.0--The Human Metabolome Database in 2013. Nucleic Acids Res 41, D801–7. [PubMed: 23161693]
- Wong BW, Wang X, Zecchin A, Thienpont B, Cornelissen I, Kalucka J, Garcia-Caballero M, Missiaen R, Huang H, Bruning U, et al. (2017). The role of fatty acid beta-oxidation in lymphangiogenesis. Nature 542, 49–54. [PubMed: 28024299]
- Xu J, Chi F, Guo T, Punj V, Lee WN, French SW, and Tsukamoto H (2015). NOTCH reprograms mitochondrial metabolism for proinflammatory macrophage activation. J. Clin. Invest 125, 1579– 1590. [PubMed: 25798621]
- Xu J, and Kisseleva T (2015). Bone marrow-derived fibrocytes contribute to liver fibrosis. Exp. Biol. Med. (Maywood) 240, 691–700. [PubMed: 25966982]
- Yamasaki M, Hasegawa S, Imai M, Takahashi N, and Fukui T (2016). High-fat diet-induced obesity stimulates ketone body utilization in osteoclasts of the mouse bone. Biochem. Biophys. Res. Commun 473, 654–661. [PubMed: 27021680]
- Yang K, Cheng H, Gross RW, and Han X (2009). Automated lipid identification and quantification by multidimensional mass spectrometry-based shotgun lipidomics. Anal. Chem 81, 4356–4368. [PubMed: 19408941]
- Youm Y, Nguyen KY, Grant RW, Goldberg EL, Bodogai M, Kim D, D'Agostino D, Planavsky N, Lupfer C, Kanneganti TD, et al. (2015). The ketone metabolite beta]-hydroxybutyrate blocks NLRP3 inflammasome-mediated inflammatory disease. Nat. Med 21, 263–269. [PubMed: 25686106]

# Highlights

• Macrophages oxidize acetoacetate (AcAc) but not β-hydroxybutyrate.

- Metabolism of AcAc in macrophages extends into pathways beyond the TCA cycle.
- Effective AcAc competition with glucose requires its mitochondrial metabolism.
- Mitochondrial AcAc metabolism in macrophages protects against liver fibrosis.



Figure 1. Oxidation of AcAc but not D- $\beta OHB$  by primary bone marrow derived macrophages (BMDM).

(A) Labeling of TCA cycle intermediates with 1 mM [ ${}^{13}C_4$ ]acetoacetate ([ ${}^{13}C_4$ ]AcAc) or (**B**) D- $\beta$ -[ ${}^{13}C_4$ ]hydroxybutyrate (D-[ ${}^{13}C_4$ ] $\beta$ OHB) in unstimulated (Control), LPS (25 ng/mL) or IL-4 (25 ng/mL) stimulated WT BMDM after 24 h of exposure (n>3/group). (**C**) Schematic of conversion of AcAc and D- $\beta$ OHB by D- $\beta$ OHB dehydrogenase 1 (BDH1). (**D**) Fraction of total ketone body pool obtained from 1 mM [ ${}^{13}C_4$ ]AcAc treated macrophages (n=12/group). (**E**) Immunoblot for BDH1 protein migrating at 31 kDa and actin in protein BMDMs lysate after 24 h of exposure (positive control: WT mouse liver). The center panel is a high exposure of upper panel blot. NS, non-specific signals. (**F**) Labeling of TCA cycle intermediates in LPS stimulated macrophages in the presence or absence of FCCP uncoupler (n=2/group). Data expressed as the mean  $\pm$  standard error of the mean (SEM). Significant differences determined by Multiple Student's *t* test with Holm-Sidak correction when compared to Control. \*\*\*, *p* < 0.001; \*\*\*\*, *p* < 0.0001; as indicated.



Figure 2. Incorporation of <sup>13</sup>C-labeled ketone bodies into non-oxidative macrophage pathways. (A) Schematic of stable isotope-based workflow applied in this study. <sup>13</sup>C-labeled and <sup>12</sup>Cunlabeled substrates are added into the cells and extracted. Both extracts were analyzed on LC system linked to high-resolution MS [feature- pair of retention time (RT) and m/z]. Based on the ion counts of aligned features, the relative abundances (RA) of each isotopologues in the group (signals within RT limits and the difference equal to 1.0035\*n; n =number of <sup>13</sup>C) are calculated using X<sup>13</sup>CMS. From the getIsoLabelReport the isotopologue groups are filtered based on the difference in mass of isotopologues, *p* values of enriched isotopologues (<sup>12</sup>C versus <sup>13</sup>C-conditions) and relative enrichment (ReIIntUvL). List of isotopologues is subjected to PIUMET Network analysis and putative identifications are utilized for the pathway enrichment analysis against the *Mus musculus* KEGG and BioCyc databases. (**B**) Numbers of labeled isotopologue groups from X<sup>13</sup>CMS analysis indicating incorporation of <sup>13</sup>C label derived from either 1mM [<sup>13</sup>C<sub>4</sub>]AcAc or D-

 $[^{13}C_4]$ βOHB in unstimulated (Control), LPS (25 ng/mL) or IL-4 (25 ng/mL) stimulated WT BMDMs after 6 or 24 h of exposure (n=3/group). (C) Molecular structure-based classification of  $[^{13}C_4]$ AcAc-derived putative metabolite classes WT BMDM, after 24 h of labeling (n=3/group). (D) Pathway enrichment analysis of 1 mM  $[^{13}C_4]$ AcAc-labeled putative metabolites based on BioCyc database in WT BMDMs. (E) Heat map of features differentially labeled by 1 mM  $[^{13}C_4]$ AcAc after 24 h of treatment (*p* values from n=3/ group). Putative identifications assigned based on either PIUMET analysis or MS/MS (unassigned are depicted as *m/z*). The order on the heatmap is based on increasing *m/z* value.



# Figure 3. Mitochondrial pathway contributions of AcAc ketone body in alternatively polarized macrophages.

(A) Competition between 10 mM [ $^{13}C_6$ ]glucose and 1 mM unlabeled AcAc carbons for TCA cycle intermediates in LPS (25 ng/mL) or IL-4 (25 ng/mL) stimulated WT BMDMs after 24 h of exposure (n>7/group) [data utilized also in (Puchalska et al., 2018)]. (B-C) RNA-Seq and Chip-Seq analysis of *Oxct1* (encodes SCOT) in WT and STAT6 knockout (S6KO) BMDMs exposed to IL-4 (20 ng/mL) for the indicated period of time. Gene expression values are in fragments per kb of exon per million fragments mapped format. Fold change over vehicle treated cells is presented for each time point. (D) Number of features contested between 10 mM [ $^{13}C_6$ ]glucose and 1 mM unlabeled AcAc in IL-4 stimulated WT and SCOT-KO BMDMs after 24 h of treatment (n=4/group). (E) 10 mM [ $^{13}C_6$ ]glucose labeling of N-acetylneuraminic acid (NeuAc) from intact glucose (red dots) and an acetyl group (blue dots) in IL-4 (25 ng/mL) stimulated WT and SCOT-KO BMDM after 24 h of exposure (n=4/group). Labeling of the acetyl group derive from mitochondrial

acetyl-CoA production from  $[U^{-13}C_6]$ glucose-derived pyruvate (M+8 isotopologue, labeled glucose and acetyl-group) or from 1mM  $[^{12}C]$ AcAc, which decreases the M+8 isotopologue, and increases the M+6 isotopologue. Pattern was abrogated in SCOT-KO BMDMs. (**F**) Distribution of glucose-ketone competing putative metabolites into KEGG pathways in IL-4 stimulated BMDMs. Data expressed as mean ± SEM. Significant differences determined by multiple Student's *t* test with Holm-Sidak correction when compared to unstimulated control or by two-way ANOVA. \*, p < 0.05; \*\*, p < 0.01; \*\*\*, p < 0.001; \*\*\*\*, p < 0.0001; \*\*\*\*\*, p < 0.0001; as indicated.

Puchalska et al.



Figure 4. SCOT-Macrophage-Knockout mice exhibit normal physiological responses to high fat diet.

(A) Representative  $20 \times$  magnification of immunohistochemical stains for SCOT and F4/80<sup>+</sup> [DAPI labeling of cellular nuclei], and (B) relative number of SCOT positive macrophages in cryosections of livers from *Oxct1*<sup>flox/flox</sup> controls (Flox/Flox) and SCOT-Macrophage-KO mice fed HFD for 8 weeks (n>7/group). (C) *Oxct1* gene expression in livers (n>4/group). (D) Serum total ketone bodies (TKB) concentration (mM) (n>10/group), (E) blood glucose concentration (mg/dL) (n>10/group; p = 0.0471), (F) intraperitoneal glucose tolerance test (n=4/group), and (G) body weight (g) (n>10/group) of *Oxct1*<sup>flox/flox</sup> (Flox/Flox) control and SCOT-Macrophage-KO mice. (H) Representative Oil Red O staining of liver sections together with (I) quantification of hepatic triacylglycerol (TAG) concentration (nmol/mg protein) (n>5/group; p = 0.093), and (J) Hematoxylin-eosin staining of liver sections from *Oxct1*<sup>flox/flox</sup> control (Flox/Flox) and SCOT-Macrophage-KO (scale bar, 50 µm). CV, central vein. PV, portal vein. Data expressed as the mean ± SEM. Significant differences determined by Student's *t* test. \* p < 0.05; \*\*, p < 0.01; \*\*\*, p < 0.001; \*\*\*\*, p < 0.0001; as indicated.



Figure 5. Loss of SCOT in hepatic tissue macrophages is associated with an accelerated fibrotic response to high fat diet.

(A) Total ion counts of putative iduronate (m/z=193.0354) obtained from untargeted LC/MS analysis of  $Oxct1^{flox/flox}$  control (Flox/Flox) and SCOT-Macrophage-KO livers in (n=4–5/ group). (B) Transcript abundances of profibrotic, monocyte recruitment, (C) hepatic stellate cell activation biomarker and (D) M2 macrophage markers genes in  $Oxct1^{flox/flox}$  control (Flox/Flox) and SCOT-Macrophage-KO mice fed HFD for 8 weeks (n>4/group). *Vegfc*, vascular endothelial growth factor C; *Pdgfa*, platelet-derived growth factor A; *II13*, interleukin 13; *Cd11b*, integrin subunit alpha M; *Shh*, Sonic Hedgehog; *Igfbp5*, insulin like growth factor binding protein 3; *Acta2*, smooth muscle actin; *Ccl3*, C-C motif chemokine ligand 5; *Lox11*, lysyl oxidase like 1; *Fizz1*, resistin like beta; *Ym1*, chitinase-like 3. (E) Representative 20× magnification of picrosirius red-stained liver sections together with (F) quantification (%area/20× field) from  $Oxct1^{flox/flox}$  control (Flox/Flox) and SCOT-Macrophage-KO mice (n>7/group). (G) Correlation between

hepatic fibrosis level and relative number of SCOT positive macrophages (20 correlation points) or (**H**) total TAG pools (nmoles/protein) in livers of *Oxct1<sup>flox/flox</sup>* control (Flox/Flox) and SCOT-Macrophage-KO mice maintained on HFD for 8 weeks. CV, central vein. PV, portal vein. Data expressed as the mean  $\pm$  SEM. Significant differences determined by Student's *t* test. Correlation determined by fitting within polynomial (second order) or linear regression. \* p < 0.05; \*\*, p < 0.01; \*\*\*, p < 0.001; as indicated.

Puchalska et al.



Figure 6. Hepatocyte ketogenesis and tissue macrophage mitochondrial ketone metabolism independently and additively coordinate the hepatic fibrotic response in mice. (A) XCMS online cloud plot of 1306 dysregulated chemical features when comparing antisense oligonucleotide (ASO)-treated control and *Hmgcs2* ASO (ketogenesis insufficient) livers (n = 4/group) of mice maintained on HFD for 8 weeks. (B) Representative hematoxylin-eosin (scale bar, 50 µm) and (C) picrosirius red staining of liver sections from *Hmgcs2* ASO-treated mice on the *Oxct1flox/flox* control (Flox/Flox) and SCOT-Macrophage-KO backgrounds maintained on HFD for 8 weeks. CV, central vein; PV, portal vein. (D) Quantification of picrosirius red-positive area (% area/20× field) in ASO treated mice on *Oxct1flox/flox* control (Flox/Flox) and SCOT-Macrophage-KO backgrounds (n>6/group). Quantification of picrosirius red-positive stain area (% area/20× field) in WT mice maintained on high fat fibrogenic diet and injected with (E) AcAc (n=7/group) or (F) D- $\beta$ OHB (n=4/group) and their representative vehicles (ethanol for AcAc and NaCl for D- $\beta$ OHB) twice a day with 10 µmol/g body weight each for 4 weeks. (G) Representative

picosirius red stains of liver sections obtained from the AcAc and its vehicle groups. CV, central vein. PV, portal vein. Data expressed as mean  $\pm$  SEM. Significant differences determined by Student's *t* test, or ANOVA with multiple comparisons with Tukey post-hoc tests, as appropriate. \* p < 0.05; \*\*, p < 0.01; as indicated.

# **KEY RESOURCES TABLE**

REAGENT or RESOURCE	SOURCE	IDENTIFIER	
Antibodies			
Alexa Flour 488 conjugated goat anti-rabbit IgG	Invitrogen	#A11008; RRID:AB 143165	
Alexa Fluor 647 conjugated donkey anti-goat IgG	Invitrogen	#A21447; RRID:AB 2535864	
Polyclonal rabbit anti-BDH1	Proteintech Group	#15417-1-AP; RRID:AB 2274683	
Rabbit anti-mHMGCS2	Santa Cruz Biotechnology Inc.	#SC-33828; RRID:AB 2118322	
Rabbit polyclonal anti-SCOT	Proteintech Group	#12175-1-AP; RRID:AB_2157444	
Goat anti-rabbit IgG conjugated to horseradish peroxidase	Southern Biotech	#4030-05; RRID:AB 2687483	
Rabbit anti-actin	Sigma	#A2066; R RI D:AB_476693	
Chemicals, Peptides, and Recombinant Proteins			
2-Mercaptoethanol	Sigma	#M6250; #CAS 6024-2	
L-Citrulline	Sigma	#C7629; #CAS 37275-8	
L-Alanine	Sigma	#A7627; #CAS 5641-7	
Ethyl-acetoacetate	Sigma	#W241512; #CAS 141-97-9	
Sodium D-βOHB	Sigma and Santa Cruz	#298360 and # sc-229050; #CAS 13613-65-5	
[1,2,3,4- <sup>13</sup> C <sub>4</sub> ] ethylacetoacetate	Cambridge Isotope Laboratories	#CLM-3297; Unlabeled CAS 14197-9	
Sodium D-[U- <sup>13</sup> C]βOHB	Cambridge Isotope Laboratories	#CLM-3853; Unlabeled CAS 13613-65-5	
[U- <sup>13</sup> C]glucose	Cambridge Isotope Laboratories	#CLM-1396; Unlabeled CAS 5099-7	
T17:1 Triheptadecanoylglycerol (TAG)	Nu-Chekprep	#T-404	
Luna NH <sub>2</sub> column (100 mm $\times$ 1 mm, 3 µm particle size)	Phenomenex	#00D-4377-A0	
Ammonium acetate	Sigma	#73594-F; #CAS 631-61-8	
Ammonium hydroxide	Honeywell	#44273-10×1mL; #CAS 1336-21-6	
Methanol for LCMS	Fisher Scientific	#A456-4; #CAS 6756-1	
Acetonitrile for LCMS	Fisher Scientific	#A955-4; #CAS 7505-8	
Water for LCMS	Fisher Scientific	#W6-4; #CAS 773218-5	
Lipopolysaccharide (LPS) from Escherichia coli O111:B4	Millipore	#L4391	
Mouse recombinant interleukin-4 (IL-4)	PeproTech	#214-14	
Carbonylcyanide-4-(trifluoromethoxy)phenylhydrazone (FCCP)	Enzo Life Sciences	#BML-CM120-0010; #CAS 370-86-5	
HBSS	Invitrogen	#14175-095	
RPMI 1640 Medium	Invitrogen	#11875-093	
DMEM, high glucose	Invitrogen	#11965-092	
Fetal bovine serum (FBS) HyClone	Fisher Scientific	#SH30087.03	
Gibco L-Glutamine (200mM)	Fisher Scientific	#25030-081	
Gibco Penicillin/streptomycin (10,000 U/mL)	Fisher Scientific	#15140122	
Glucose- and serum-free DMEM	Invitrogen	#A14430-01	
Protease inhibitor cocktail (cOmplete, mini, EDTA-free)	Sigma	#11836170001	
Phosphatase inhibitor cocktail	Sigma	#524629	
SuperScript II Reverse Transcriptase	Invitrogen	#100004925	
SsoAdvanced <sup>™</sup> Universal SYBR <sup>®</sup> Green Supermix	Bio-Rad	#172-5274	
Optimal Cutting Temperature (OCT) compound	Tissue-Tek	#4583	
4, 6-diamidino-2-phenylindole (DAPI)	Sigma	# D9542-5MG	

REAGENT or RESOURCE	SOURCE	IDENTIFIER		
Vectashield mounting medium with DAPI	Vector Laboratories	# H1200		
E-Gel EX 2% agarose gel	Invitrogen	#G401002		
Tamoxifen	Cayman Chemical	#13258; #CAS 10540-29-1		
High fat diet	Research Diets	#D12492		
Hepatic fibrogenic diet	Research Diets	#D09100301		
Critical Commercial Assays				
BCA protein Assay kit	Thermo Fisher	#23225		
RNeasy Mini Kit	Qiagen	#74016		
RNeasy Lipid Tissue Mini Kit	Qiagen	#74804		
RNase-Free DNase Set	Qiagen	#79256		
Total ketone body (TKB) assay	Wako	#415-73301 and #411-73401		
Autokit 3-HB (for βOHB)	Wako	#417-73501 and #413-73601		
Glucose readers with glucose meter test strips	CVSHealth	N/A		
QIAquick Gel Extraction Kit	Qiagen	#28506		
TruSeq ChIP library systems	Illumina	#IP-202-1012		
TruSeq RNA Library Preparation Kit	Illumina	#RS-122-2001		
Deposited Data				
ChIP-seq data	GEO or (Czimmerer et al., 2018)	GSE106706		
RNA-seq data	GEO or (Czimmerer et al., 2018)	GSE106706		
Experimental Models: Cell Lines				
Primary macrophages isolated from C57BL/6NJ sub-strain hybrid mice carrying the Oxct1 <sup>flox/flox</sup> allele or Oxct1 <sup>flox/flox</sup> animals crossed with the ubiquitously expressed Cre/ESR1 fusion [B6.Cg-Tg(CAG-cre/Esr1*)5Amc/J, stock number 004682, Jackson Laboratory]	(Cotter et al., 2013)	N/A		
Experimental Models: Organisms/Strains				
Mouse: C57BL/6NJ sub-strain hybrid mice carrying the Oxct1 <sup>flox/flox</sup> allele	(Cotter et al., 2013)	N/A		
Mouse: Oxc11 <sup>flox/flox</sup> animals crossed with the ubiquitously expressed Cre/ESR1 fusion [B6.Cg- Tg(CAG-cre/ Esr1*)5Amc/J, stock number 004682, Jackson Laboratory]	(Schugar et al., 2014)	N/A		
Mouse: Oxct1 <sup>tlox/tlox</sup> crossed with LysM-Cre strain from Jackson Laboratories (B6.129P2-Lyz2tm1(cre)ifo/J, stock number 004781, Jackson Laboratory)	N/A	N/A		
Mouse: HMGCS2 knockdown	(Cotter et al., 2014)	N/A		
Mouse: Stat6 KO	Jackson Laboratory	N/A		
Mouse C57BL/6J	Jackson Laboratory	#000664		
Software and Algorithms				
MSConvert free open source	http://proteowizard.sourceforge.net/tools.shtml	N/A		
XCMSOnline requires registration, free open source	https://xcmsonline.scripps.edu/landing_page.php?pgcontent=institute	RRID:SCR_015538		
Metlin database requires registration, free open source	https://metlin.scripps.edu/landing_page.php?pgcontent=mainPage	RRID:SCR_010500		
R package free open source	http://r-pkgs.had.co.nz/	N/A		
R studio (Ver 1.0.153) free open source license	https://www.rstudio.com/products/rstudio/download/	N/A		
X13CMS (v.1.4) package free open source license	http://pattilab.wustl.edu/software/x13cms/x13cms.php	N/A		
Compound Discoverer (ver. 2.1)	Thermo	N/A		
Xcalibur	Thermo	RRID:SCR_014593		
PIUMet	http://fraenkel-nsf.csbi.mit.edu/PIUMet/	N/A		
MBRole 2.0	http://csbg.cnb.csic.es/mbrole2/	RRID:SCR_014684		

REAGENT or RESOURCE	SOURCE	IDENTIFIER	
GraphPad (ver 7.03)	GraphPad software	RRID:SCR_002798	
ImageJ free open source license	NIH	RRID:SCR_003070	
KEGG database	https://www.genome.jp/kegg/	RRID:SCR_012773	
BioCyc database	https://biocyc.org/	RRID:SCR_002298	
Quantity One software	BioRad	RRID:SCR_014280	
TopHat	http://cole-trapnell-lab.github.io/projects/tophat/	RRID:SCR_013035	
Cufflinks	http://cole-trapnell-lab.github.io/projects/cufflinks/	RRID:SCR_014597	
Oligonucleotides			
Hmgcs2-targeted ASO (5'-CTGTTTGTCACTGCTGGATG)	Ionis	#191229	
Scrambled sequence control ASO (5 <sup>'</sup> - CCTTCCCTGAAGGTTCCTCC)	Ionis	#141923	