Targeting UBC9-mediated Protein Hyper-SUMOylation in Cystic Cholangiocytes Halts Polycystic Liver Disease in Experimental Models

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Materials and Methods

RNA isolation and gene expression

RNA isolation was performed in human and rat liver samples and cell culture using TRI Reagent (Sigma). Subsequently, 1 µg of RNA isolated from human liver samples were reverse transcribed using the SuperScript VILO cDNA Synthesis Kit (Invitrogen) in a Veriti Thermal Cycler (Applied Biosystems). On the other hand, cells and rat liver samples were reverse transcribed using a mixture of DNAse I, Amplification Grade (Invitrogen), M-MLV Reverse Transcriptase (Invitrogen), RNaseOUT Recombinant Ribonuclease Inhibitor (Invitrogen), Random Primers (Invitrogen) and illustra Solution dNTPs (GE Life Sciences). The gene expression (mRNA) of specific primers sequences (Supplementary CTAT Table and Supplementary Table 2) was determined by real-time quantitative polymerase chain reaction (qPCR) using iQ SYBR Green Supermix (Bio-Rad) in a CFX96 Touch Real-Time PCR Detection System as previously described.[1]

Animals and treatment

The well-defined PCK rat (commercially available by Charles River Laboratory) carries a spontaneous splicing mutation (IVS35-2AT) in the *polycystic kidney and hepatic disease 1* (*PKHD1*) orthologous gene, responsible for an ARPKD/congenital hepatic fibrosis phenotype.[2] The PCK rat represents an accurate and useful animal model of slowly progressive PLD phenotype.[3] The liver phenotype in PCK rats is characterized by extensive cyst formation, as the majority disconnect from the bile ducts throughout time, and hepatomegaly with unaltered liver parenchyma.[4] Hepato-renal cystogenesis and fibrosis gradually develop after 8 weeks of age in both male and female PCK rats, and concurrently elevated serum levels of blood urea nitrogen, creatinine, bilirubin, cholesterol,

triglycerides and alkaline phosphatase are observed.[3] Although the pathologies become evident after 25 weeks of age, there is considerable variability.

In this study, PCK rats (8 weeks of age) were grouped in: 1) non-treated (n=14) and 2) treated (n=12) with S-adenosyl-l-methionine disulfate ptoluenesulfonate (SAMe, kindly provided by Gnosis S.p.A., Derio, Italy). Every group had 50% male and 50% female PCK rats, as published studies demonstrated no significant differences between both sexes (Supplementary Figure 1).[5–8] SAMe dosage was set at 20 mg/kg/day, as published clinical trials in liver diseases showed no severe adverse events.[9,10] SAMe dissolved easily in drinking water of the animals, thus based on daily weight monitoring, SAMe was administered by oral gavage with an orogastric canula for 5 months (on a 5 day-on/2-day-off schedule). As negative control of the disease, eight-weeks old wild-type (Sprague-Dawley, Charles River Laboratory) rats (n=8) were maintained in parallel. During the entire study, all animals were weighed weekly, and had *ad libitum* access to food (standard diet) and water.

At the beginning, and after 6 weeks, 12 weeks and at the sacrifice, blood samples were collected from every animal. Levels of serum biochemical markers such as alkaline phosphatase (ALP), aspartate aminotransferase (AST), alanine aminotransferase (ALT), albumin, blood urea and total protein were measured. For every blood collection, the animals were anesthetized with isoflurane (2.5% in inhaling oxygen, at a flow of 0.3 L/min). Non-treated and treated rats were sacrificed after 5 months, and blood, bile, liver, kidneys and spleen were collected. The harvested tissues were stained with hematoxylin/eosin or picrosirius red, for measuring hepatorenal cysts and liver fibrosis, respectively.

Hepatorenal cystogenesis and liver fibrosis were quantitated using ImageJ software (National Institutes of Health, USA).[11]

All animal experimental procedures were approved by the *Animal Experimentation Ethics Committee* of Biodonostia Health Research Institute (CEEA17/007).

Immunoblotting

Whole cells lysates of cultured human cholangiocytes were extracted with radioimmunoprecipitation (RIPA) lysis buffer and freshly prepared 20 mM Nethylmaleimide (NEM, isopeptidase inhibitor preventing protein deSUMOylation).[12] Changes in small ubiquitin like modifier 1 (SUMO1) and SUMO1-conjugated proteins, UBC9, acetylated α-tubulin, p62 and ubiquitinconjugated proteins were analyzed by western blotting (WB) using protein from cell extracts, which were separated in a 12.5% sodium dodecyl sulfate polyacrylamide gel electrophoresis (SDS-PAGE), and electro-transferred to a nitrocellulose membrane (Bio-Rad). After blocking with 5% skim milk powder/TBS-0.1%Tween, membranes were incubated with the relevant primary antibody at 1:1000 dilution (Supplementary CTAT table and Supplementary Table 3) overnight at 4ºC. Then, membranes were probed with an appropriate horseradish peroxidase-conjugated secondary antibody at 1:5000 dilution for 1 hour at room temperature. Using Novex ECL Chemiluminescent Substrate Reagent Kit (Invitrogen) and iBright CL1500 Imaging System (Invitrogen), bands were visualized and quantification was carried out with ImageJ software (National Institutes of Health, USA).[11] β-actin or α-tubulin protein levels were used to normalize protein loading and expression.

Cell viability, proliferation and apoptosis

Cell viability was assessed by using the colorimetric WST-1 (Roche) assay, as per manufacturer's instructions. Briefly, $3x10³$ cells were seeded in each well of a collagen-coated 96-well plate in fully-supplemented Dulbecco's modified Eagle's medium (DMEM)/F-12 medium.[13] The day after, cells were treated with different dosages of SAMe for 48 hours.

Cell proliferation was measured by flow-cytometry using CellTrace CFSE Cell Proliferation Kit (Invitrogen), following manufacturer's instructions. In short, cells were harvested, resuspended with PBS 0.1% BSA and labeled with 10 µM CFSE. Then, cold fully-supplemented DMEM/F-12 medium was added and the cells were placed on ice for 5 min. After three washes with fully-supplemented DMEM/F-12 medium, 3x10⁴ cells were seeded per well in a 12-well plate. The next day, cells received different dosages of SAMe for 48 hours. Fluorescence of cells was measured by flow-cytometry in Guava easyCyte 8HT Benchtop Flow Cytometer (Merck Millipore) after harvesting, centrifuging and resuspending the cells in PBS.

Apoptotic rate of cells was evaluated by flow-cytometry Shortly, 2.5x104 cells per well were seeded in a 24-well plate in fully-supplemented DMEM/F-12 medium. Twenty-four hours later, cells were treated with different dosages of SAMe and/or MG132 for 48 hours. Next, cells were harvested and stained with FITC Annexin V (BioLegend) and TO-PRO-3 Iodide (Invitrogen). Fluorescence was measured by flow-cytometry in Guava easyCyte 8HT Benchtop Flow Cytometer (Merck Millipore).

Primary cilia

Polycystic human cholangiocytes (PHC) were seeded at a density of 5x10⁴ and cultured on collagen-coated glass coverslips in a 24-well plate until they reached confluence. Afterwards, SAMe (1.0 mM) was administered and replaced every 48 hours for a total period of 7 days. For the analysis of the number of ciliated cholangiocytes, cells were washed with PBS 1X and fixed with ice-cold methanol for 10 min at -20°. Samples were washed 3 times with PBS 1X and incubated with 0.5% Triton-100X/PBS 1X for 20 min at room temperature for cell membrane permeabilization. Next, cells were blocked with 1%BSA/5%FBS/0.5% Triton-100X/PBS 1X for 30 min at room temperature and incubated overnight at 4°C with acetylated α-tubulin antibody (1:1000; Sigma). Afterwards, cells were incubated for 2 hours at room temperature with Alexa Fluor 488 secondary antibody (Life Technologies). Coverslips were mounted on slides using VECTASHIELD® mounting medium with DAPI (Vector laboratories). Images were obtained at 40X with a confocal laser scanning microscope (LSM 900, ZEISS). Finally, images were analyzed and the number of ciliated cells was calculated.

Cell transfection with short hairpin RNA

PHC were seeded in a 6-well plate at a density of $2x10⁵$ and left for overnight attachment before transfection. Then, DNA plasmids of control short hairpin RNAs (shRNA, Sigma) or shRNA against *ubiquitin conjugating enzyme E2 I (UBE2I)* (TRCN0000329448, Sigma) in Opti-MEM (Gibco) were combined with FuGENE HD (Promega) at a ratio of 1:4 in order to form complexes. After 15 min of incubation, the mixture was added dropwise to the wells. Medium was changed after 24 hours to fully-supplemented DMEM/F-12 medium. In order to obtain stable transfected cell lines, 1.5 µg/ml puromycin (Sigma) was added to the cells

for 7 days. *UBE2I* knockdown was verified by protein expression using immunoblotting.

Immunoprecipitation

First, 1 mg of whole cell lysate from normal human cholangiocytes (NHC) and PHC was precleared by incubating the samples with Dynabeads Protein G (Invitrogen), concentration according to manufacturer's instructions. In parallel, another amount of Dynabeads Protein G was incubated with SUMO1 antibody (Abcam) or, as negative control, with immunoglobulin G (IgG) antibody (Abcam) and crosslinked with freshly prepared bis(sulfosuccinimidyl)suberate (BS^3) , Thermo Scientific). Then, the precleared cell lysates were incubated with the SUMO1- or IgG- crosslinked Dynabeads. Finally, the proteins were eluted from the Dynabeads with 2% SDS.

Mass spectrometry and proteomic analysis

Samples of control shRNA and shRNA against *UBE2I*, as well as SUMO1 immunoprecipitation (IP) lysates, were extracted or eluted using 7 M urea, 2 M thiourea, 4% CHAPS. Samples were incubated for 30 min at room temperature under agitation and digested following the Filter-Aided Sample Preparation protocol [14] with minor modifications. Trypsin was added to a trypsin:protein ratio of 1:10, and the mixture was incubated overnight at 37° C, dried out in a RVC2 25 speedvac concentrator (Christ), and resuspended in 0.1% formic acid (FA).

Samples were analyzed in a novel hybrid trapped ion mobility spectrometry – quadrupole time of flight mass spectrometer parallel accumulation serial fragmentation (tims TOF Pro with PASEF, Bruker Daltonics) coupled online to a nanoElute liquid chromatograph (Bruker). This mass spectrometer takes advantage of a novel scan mode termed parallel accumulation – serial

fragmentation (PASEF), which multiplies the sequencing speed without any loss in sensitivity [15] and has been proven to provide outstanding analytical speed and sensibility for proteomics analyses.[16] Sample (200 ng) was directly loaded in a 15 cm nanoElute FIFTEEN C18 analytical column (Bruker) and resolved at 400 nl/min with a 30 min gradient. Column was heated to 50ºC using an oven.

Protein identification and quantification for control shRNA and shRNA against *UBE2I* samples were carried out using PEAKS software (Bioinformatics Solutions Inc). Searches were carried out against a database consisting of human entries (Uniprot/Swissprot), with precursor and fragment tolerances of 20 ppm and 0.05 Da. Only proteins identified with at least two peptides at false discovery rate (FDR) <1% were considered for further analysis. Data was loaded onto Perseus platform [17] and further processed (log2 transformation, imputation).

Protein identification and quantification for SUMO-1 IP lysates were carried out using Mascot search engine (Matrix Science Ltd.) through Proteome Discoverer software 1.4 (Thermo). 50ppm and 0.05Da were used for precursor and fragment searches, and a database consisting of human entries (Uniprot/Swissprot) was used for the searches. Only proteins identified with at least two peptides at FDR<1% in at least two sample replicas and not present in the negative control were considered for further analysis.

Spectral counts for each protein (the number of identified spectra matching to peptides from that protein, also named SpC or PSMs) were used for the differential analysis. Data was loaded onto Perseus platform and further processed (log2 transformation, imputation). A *t*-test was applied in order to determine the statistical significance of the differences detected. Functional

analyses of proteins were performed in the STRING database,[18] and by gene ontology (GO) enrichment using DAVID Bioinformatics Resources. Details are outlined in the Supplementary data.[19] In addition, heatmaps were generated using Heatmapper for data visualization.[20] The mass spectrometry proteomics data have been deposited to the ProteomeXchange Consortium via the PRIDE [21] partner repository with the dataset identifiers PXD021139 and PXD021140.

Supplementary Figures

Supplementary Fig. 1. Each group of this study consisted 50% female and 50%

male rats.

Supplementary Fig. 2. mRNA levels of SUMOylation, pro-inflammatory and profibrotic genes in whole liver tissue samples from wild-type, non-treated PCK and SAMe-treated PCK rats. Five months of SAMe treatment (20 mg/kg/day). Data shown as mean \pm SEM. *p<0.05; **p<0.01; ***p<0.001 (one-way ANOVA, Kruskal-Wallis tests)

Abbreviations: α*-Sma*, alpha smooth muscle actin; *Col1a1*, collagen type 1 alpha 1 chain; *Ctgf*, connective tissue growth factor; *Cxcl1*, chemokine (C-X-C motif) ligand 1; *Il6*, interleukin 6; *Sae1*, SUMO1 activating enzyme subunit 1; *Sumo1*, small ubiquitin like modifier 1; *Tgf*β*1*, transforming growth factor beta 1; *Uba2*, SUMO1 activating enzyme subunit 2; *Ube2i*, ubiquitin conjugating enzyme E2 I.

A

Supplementary Figure 3. Cell (A) viability (n=6), (B) apoptosis (n=4), and (C) proliferation (n=3) in untreated or SAMe-treated NRC and PCKC. Data shown as mean + SEM. *p<0.05; **p<0.01; ***p<0.001 (one-way ANOVA, Kruskal-Wallis, Mann-Whitney or 2-tailed t-tests).

A Whole cell lysates

Proteins identified: 3,758

Supplementary Figure 4. (A) Venn diagram of all identified proteins (3,758). (B) Proteomic analyses of the significant dysregulated proteins (n=120) by heatmap representation, and (C) PPI network associated to *UBE2I* silencing.

Supplementary Fig. 5. Heatmap including the significantly enriched SUMO1-IP

proteins in PHC compared to NHC.

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Supplementary Fig. 6. A) Representative IHC images of ubiquitin and B) p62 in human and rat liver tissue. C) Representative immunoblot and quantification of ubiquitin-conjugated proteins and D) p62 expression in NHC and PHC under baseline conditions, as well as in PHC under SAMe or MG132 incubation (n=3). E) Representative immunoblot and quantification of ubiquitin-conjugated proteins and F) p62 expression in non-treated (n=14) or SAMe-treated (n=12) PCK livers. Data shown as mean + SEM. *p<0.05; ***p<0.001 (one-way ANOVA, Kruskal-Wallis, 2-tailed t-tests).

Supplementary Fig. 7. Liver weight, liver/body weight ratio, liver volume and albumin in non-treated PCK and SAMe-treated PCK rats at sacrifice. Two months of SAMe treatment with either (A) 50 mg/kg/day or (B) 100 mg/kg/day. Data shown as mean ± SEM. (one-way ANOVA, Kruskal-Wallis tests)

Supplementary Tables

Supplementary Table 1. Demographic and clinical features of the study cohort.

Abbreviations: PRKCSH, protein kinase C substrate 80K-H; SEC63, translocation protein SEC63 homolog.

Supplementary Table. 2. Human and rat primers used in qPCR**.**

Abbreviations: α-Sma, alpha smooth muscle actin; ATF6, activating transcription factor 6; ATG5, autophagy related 5; BAX, Bcl-2 associated X apoptosis regulator; BECN1, Beclin-1; BIM, Bcl-2 like protein 11; CHOP, DNA damage-inducible transcript 3; Col1a1, collagen type 1 alpha 1 chain; Ctgf, connective tissue growth factor; Cxcl1, chemokine (C-X-C motif) ligand 1; DR5, death receptor 5; FW, forward; GAPDH, glyceraldehyde 3-phosphate dehydrogenase; GRP78, heat shock 70kD protein 5; Il6, interleukin 6; IRE1α, serine/threonine-protein kinase/endoribonuclease inositol-requiring enzyme 1α; LC3B, microtubule-associated protein 1 light chain 3 beta; MAT1A, methionine adenosyltransferase 1A; MAT2A; methionine adenosyltransferase 2A; MAT2B; methionine adenosyltransferase 2B; PERK, PKR-like ER kinase; RV, reverse; SAE1, SUMO1 activating enzyme subunit 1; SOX9, SRY-box 9; SOX17, SRY-box 17; SQSTM1, Sequestosome 1; SUMO1, small ubiquitin like modifier 1; s-XBP1, spliced X-box binding protein 1; Tgfβ1, transforming growth factor beta 1; UBA2, SUMO1 activating enzyme subunit 2; UBE2I, ubiquitin conjugating enzyme E2 I; ZO-1, zonula occludens-1.

Supplementary Table. 3. Antibodies used in this study for different applications.

Abbreviations: HRP, horseradish peroxidase; IgG, immunoglobulin G; IP, immunoprecipitation; IHC, immunohistochemistry; SUMO1, small ubiquitin-related modifier 1; UBC9, SUMOconjugating enzyme UBC9; WB, Western Blot.

Supplementary Table. 4. Physical and serum biochemical parameters of the animals at sacrifice.

 $=$ significant

Values as Mean + SEM. *p<0.05. (t-tests) *Abbreviations*: SAMe, S-adenosylmethionine

Supplementary Table 5. Differential proteomic profile of shRNA-*UBE2I* PHC

compared to control and shRNA-control PHC.

Abbreviations: PHC, polycystic human cholangiocytes; shRNA, short hairpin RNA; UBE2I, Ubiquitin conjugating enzyme E2 I.

Supplementary Table 6. Differential SUMOylated proteins identified after

SUMO1-IP in PHC compared to NHC.

Abbreviations: IP, immunoprecipitation; NHC, normal human cholangiocytes; PHC, polycystic human cholangiocytes.

Supplementary Table 7. Physical and serum biochemical parameters of the animals at sacrifice. Two months of SAMe treatment with either (B) 50 mg/kg/day or (C) 100 mg/kg/day.

* = significant; ⁺ = one-tailed *t*-test.

Values as Mean + SEM. *Abbreviations*: SAMe, S-adenosylmethionine

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