#### RESEARCH PAPER

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# **The microbiota-derived bile acid taurodeoxycholic acid improves hepatic cholesterol levels in mice with cancer cachexia**

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<span id="page-0-5"></span><span id="page-0-4"></span><span id="page-0-3"></span><span id="page-0-2"></span><span id="page-0-1"></span><span id="page-0-0"></span><sup>a</sup>Metabolism and Nutrition Research Group, Louvain Drug Research Institute, UCLouvain, Université catholique de Louvain, Brussels, Belgium;<br><sup>b</sup>Bioanalysis and Pharmacology of Bioactive Linids Research Group, Louvain Drug **Bioanalysis and Pharmacology of Bioactive Lipids Research Group, Louvain Drug Research Institute, UCLouvain, Université catholique de** Louvain, Brussels, Belgium; Laboratory of Hepato-Gastroenterology, Institut de Recherche Expérimentale et Clinique, UCLouvain, Université catholique de Louvain, Brussels, Belgium; <sup>d</sup>Computational Biology and Bioinformatics Unit (CBIO), de Duve Institute, UCLouvain, Université catholique de Louvain, Brussels, Belgium; <sup>e</sup>Endocrinology, Diabetology and Nutrition Department, Institut de Recherches Expérimentales et Cliniques, UCLouvain, Université catholique de Louvain, Cliniques Universitaires Saint-Luc, Brussels, Belgium; f Department of Anatomy, Cell Biology and Physiology, Indiana University School of Medicine, Indianapolis, IN, USA; <sup>9</sup>Department of Pathology, University of Colorado Anschutz Medical Campus, Aurora, CO, USA; <sup>h</sup>Welbio Department, WEL Research Institute, Wavre, Belgium

#### <span id="page-0-7"></span><span id="page-0-6"></span>**ABSTRACT**

Alterations in bile acid profile and pathways contribute to hepatic inflammation in cancer cachexia, a syndrome worsening the prognosis of cancer patients. As the gut microbiota impinges on host metabolism through bile acids, the current study aimed to explore the functional contribution of gut microbial dysbiosis to bile acid dysmetabolism and associated disorders in cancer cachexia. Using three mouse models of cancer cachexia (the C26, MC38 and HCT116 models), we evidenced a reduction in the hepatic levels of several secondary bile acids, mainly taurodeoxycholic (TDCA). This reduction in hepatic TDCA occurred before the appearance of cachexia. Longitudinal analysis of the gut microbiota pinpointed an ASV, identified as *Xylanibacter rodentium*, as a bacterium potentially involved in the reduced production of TDCA. Coherently, stable isotope-based experiments highlighted a robust decrease in the microbial 7α-dehydroxylation (7α-DH) activity with no changes in the bile salt hydrolase (BSH) activity in cachectic mice. This approach also highlighted a reduced microbial 7α-hydroxysteroid dehydrogenase (7α-HSDH) and 12α-hydroxysteroid dehydrogenase (12α-HSDH) activities in these mice. The contribution of the lower production of TDCA to cancer cachexia was explored *in vitro* and *in vivo*. *In vitro*, TDCA prevented myotube atrophy, whereas *in vivo* hepatic whole transcriptome analysis revealed that TDCA administration to cachectic mice improved the unfolded protein response and cholesterol homeostasis pathways. Coherently, TDCA administration reversed hepatic cholesterol accumulation in these mice. Altogether, this work highlights the contribution of the gut microbiota to bile acid dysmetabolism and the therapeutic interest of the secondary bile acid TDCA for hepatic cholesterol homeostasis in the context of cancer cachexia. Such discovery may prove instrumental in the understanding of other metabolic diseases characterized by microbial dysbiosis. More broadly, our work demonstrates the interest and relevance of microbial activity measurements using stable isotopes, an approach currently underused in the microbiome field.



#### **ARTICLE HISTORY**

Received 11 June 2024 Revised 20 November 2024 Accepted 30 December 2024

#### **KEYWORDS**

Cancer cachexia; bile acids; gut microbiota; muscle atrophy; liver; *Xylanibacter*; cholesterol; 7-alpha-dehydroxylation activity; 7-alphahydroxysteroid dehydrogenase; 12-alphahydroxysteroid dehydrogenase; colorectal cancer

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Supplemental data for this article can be accessed online at <https://doi.org/10.1080/19490976.2025.2449586>

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### **Introduction**

<span id="page-1-5"></span><span id="page-1-4"></span><span id="page-1-3"></span><span id="page-1-0"></span>The bile acid system is now recognized as a complex physiological system regulated at many levels and whose homeostasis needs to be preserved to avoid the development of pathological conditions.<sup>[1,](#page-20-0)2</sup> Primary bile acids are synthesized in the liver from cholesterol and are conjugated to taurine (mainly in mice) and glycine (mainly in humans). Conjugated primary bile acids are then secreted in the intestine, where they promote emulsification and absorption of dietary lipids and fat-soluble vitamins.<sup>3</sup> In the intestine, there is a complex bi-directional interaction between bile acids and the gut microbiota. Bile acids shape the gut microbial composition due to their antimicrobial properties, and conversely, intestinal bacteria play a major role in the metabolism of bile acids. $4,5$  $4,5$  The first step of the microbial metabolism of bile acids is the hydrolysis of glycineand taurine-conjugated bile acids into free bile acids, catalyzed by the bile salt hydrolases  $(BSHs)$ .<sup>6</sup> BSH activity is widely distributed within the bacterial kingdom. $7,8$  $7,8$  Then, free primary bile acids undergo bacterial metabolization into secondary bile acids, mainly through the 7α-dehydroxylation (7α-DH), occurring in the distal part of the gut. Unlike BSH activity, bacteria that carry out the 7α-DH are present at very low abundance but display a very high metabolic flux toward bile acids. The 7α-DH activity is limited to bacteria that possess the *bai* operon, composed of eight genes, including seven genes encoding enzymes and one gene encoding a transporter, mainly characterized in *Clostridium scindens*. [9–](#page-21-5)[11](#page-21-6) Gut bacteria are also able to perform other bile acid metabolism reactions, including production of secondary allo-bile acids, oxidation to generate oxo-bile acids and subsequent reduction into epi-bile acids, and microbial conjugation with amino acids. $12-17$  $12-17$  Most of these bile acids are reabsorbed in the distal ileum to the portal vein and recycled to the liver to complete the enterohepatic cycle.[3,](#page-20-2)[18,](#page-21-9)[19](#page-21-10) A small proportion of bile acids can also escape the liver uptake and reach the systemic circulation to act on peripheral organs and tissues. Bile acids can play a role as powerful signaling molecules and exert diverse actions on host metabolism and immunity through bile acid-activated receptors, such as the Farnesoid X receptor (FXR) and Takeda G protein-coupled Receptor 5 (TGR5).<sup>2,[20](#page-21-11)</sup>

<span id="page-1-10"></span><span id="page-1-9"></span><span id="page-1-8"></span>One disease in which bile acids are of interest is cancer cachexia. Cancer cachexia is a multifactorial syndrome characterized by body weight loss, weakness, muscle atrophy, fat depletion, systemic inflam-mation, and hepatic metabolic alterations.<sup>21[,22](#page-21-13)</sup> These cachectic features arise from the pro-inflammatory mediators and catabolic factors generated by the tumor and the associated microenvironment.<sup>21,[23](#page-21-14)[,24](#page-21-15)</sup> Additionally, molecular messengers, secreted by peripheral organs in response to the tumor presence, may also contribute to these metabolic and inflammatory alterations. $25$  One example of such a messenger is bile acids. In our previous work, we showed alterations in bile acid composition and pathways in the cachectic colon carcinoma 26  $(C26)$  mouse model.<sup>26[,27](#page-22-0)</sup> These changes were intrinsically associated with cachexia and not only attributed to the tumoral presence. We also demonstrated a process termed as 'inflammation-induced cholestasis' in C26 cachectic mice, characterized by increased hepatic production of proinflammatory cytokines, inducing a strong reduction of transporters involved in bile formation and bile acid secretion, and leading to an accumulation of bile acids in the liver.<sup>28[,29](#page-22-2)</sup> To counteract this bile acid accumulation, the liver reacts by repressing bile acid synthesis and by enhancing alternative routes of basolateral bile acid efflux. $30-33$  Through experiments involving the administration of cholestyramine, a bile acid sequestrant used to reduce hepatic bile acid load, and tauroursodeoxycholic acid, we demonstrated that bile acid modulation impacts hepatic inflamma-tion and muscle atrophy in C26 cachectic mice.<sup>26[,27](#page-22-0)</sup> In parallel, we and others have shown that the composition and function of the gut microbiota is altered in cancer cachexia. $34-39$  $34-39$  We therefore hypothesized that the microbial dysbiosis present in cancer cachexia may contribute to the altered bile acid profile.

<span id="page-1-14"></span><span id="page-1-13"></span><span id="page-1-12"></span><span id="page-1-11"></span><span id="page-1-7"></span><span id="page-1-6"></span><span id="page-1-2"></span><span id="page-1-1"></span>To explore this hypothesis, we analyzed bile acid profile and pathways in several models of cancer cachexia. We characterized the alterations in the composition of the gut microbiota over time in the C26 cachectic mouse model. By performing functional assays, we discovered a reduction in the microbial functional capacity to convert primary bile acids into secondary bile acids in C26 mice. Finally, to establish the contribution of reduced secondary bile acids to the disease, we investigated *in vitro* and *in vivo* the impact of taurodeoxycholic acid (TDCA), the main secondary bile acid reduced

### **Materials and methods**

#### *Cell culture*

Murine colon carcinoma 26 cells (kindly provided by Dr. Mario Colombo, Fondazione IRCCS Istituto Nazionale Tumori, Italy) were maintained in DMEM high glucose medium supplemented with 10% fetal bovine serum (FBS), and 1% penicillin/ streptomycin at 37 $\degree$ C with 5% CO<sub>2</sub>.

in cachectic mice with relevance in humans.

Murine MC38 colorectal cancer cells (kindly provided by Dr. Xiongbin Lu, Indiana University School of Medicine, USA) were maintained in DMEM high glucose medium supplemented with 10% FBS, 1% penicillin/streptomycin, 1 mm sodium pyruvate, and 2 mm L-glutamine at 37°C with 5%  $CO<sub>2</sub>$ .

Human HCT116 colorectal cancer cells (ATCC, Manassas, VA, USA; #CRL‐247) were cultured in McCoy's medium supplemented with 10% fetal bovine serum (FBS), 1% penicillin/streptomycin, 1 mm sodium pyruvate, and 2 mm L-glutamine at  $37^{\circ}$ C with 5% CO<sub>2</sub>.

 $C_2C_{12}$  murine myoblasts were cultured in growth medium containing high glucose Dulbecco's Modified Eagle Medium (DMEM) supplemented with 10% FBS (Biowest, Central America), 1% nonessential amino acids, 100 IU/ ml penicillin, 100 μg/ml streptomycin, and 4 mm L-glutamine (all supplied by Thermo Fisher, Belgium) at 37°C with 5% CO<sub>2</sub>. Once the  $C_2C_{12}$ cells have reached 80–90% confluence, growth medium was replaced with differentiation medium containing DMEM high glucose, 2% horse serum (Thermo Scientific, New Zealand), 1% nonessential amino acids, 100 IU/ml penicillin, 100 µg/ml streptomycin, and 4 mm L-glutamine (all supplied by Thermo Fisher, Belgium). After 4 days of differentiation, the cells were treated for 48 h with TDCA (Sigma-Aldrich, USA) at 50 and 100 µM, and/or dexamethasone (Sigma-Aldrich, USA) at  $1 \mu M$ , or INT-777 at  $1 \mu M$  (Sanbio B. V., Netherlands). For myotube diameter quantification, images were captured using phase contrast microscopy (EVOS XL Core Imaging System, Thermo Fisher Scientific). The myotube diameter was quantified blindly with the image processing software ImageJ (U.S. National Institutes of Health, USA). Four pictures were taken of each culture dish and the experiments were performed in triplicates. For each picture, 10 myotubes were randomly selected and five measurements for each myotube were performed. Myotubes were defined by the presence of a minimum of 5 nuclei. For immunofluorescence visualization of myotubes, cell layers were fixed in ice‐cold paraformaldehyde 4%, permeabilized using Triton-X100 0.2% and incubated with a mouse anti-MyHC monoclonal antibody (MF 20, 1:20, Developmental Studies Hybridoma Bank) and donkey anti-mouse-IgG Alexa Fluor 594‐labeled secondary antibody (1:500, Invitrogen), as previously described. $40$ 

#### <span id="page-2-0"></span>*Mouse experiments*

<span id="page-2-1"></span>Male CD2F1 mice (7 weeks old, Charles River Laboratories, Italy) were kept in specific pathogenfree conditions and housed 2 to 3 mice per cage in individually ventilated cages with a 12 h light/dark cycle and fed an irradiated chow diet (AO4–10, Safe, France). The model used to study cancer cachexia is the well-established C26 model, characterized by body weight and fat mass loss as well as muscle atrophy.<sup>41</sup> After one-week acclimatization, either a saline solution or C26 cells  $(1 \times 10^6$ cells in 0.1 ml saline) were subcutaneously injected intrascapularly. Eight mice were randomly assigned in each group based on their body weight on the day of cell injection. Food intake and body weight were recorded on defined occurrences. When mice showed symptoms of cachexia, they were fasted from 7AM to 1PM, and tissue samples were harvested following anesthesia (isoflurane gas, Abbot, Belgium). Tissues were weighed and frozen in liquid nitrogen. All samples were stored at −80°C until further analyses.

The kinetic experiment has been previously described.<sup>26</sup> It was composed of six groups of mice: sham-injected and euthanized 8 days after injection (CT-D8 group), receiving an injection of C26 cancer cells and euthanized 8 days after

injection (C26-D8 group), sham-injected and euthanized 9 days after injection (CT-D9 group), receiving an injection of C26 cancer cells and euthanized 9 days after injection (C26-D9 group), sham-injected and euthanized 10 days after injection (CT-D10 group), receiving an injection of C26 cancer cells and euthanized 10 days after injection (C26-D10 group).

For the TDCA administration experiment, mice were randomly assigned in three experimental groups based on their body weight; sham-injected mice and daily intraperitoneally injected with the appropriate vehicle (CT group;  $n = 7$ ), mice injected with C26 cancer cells and daily intraperitoneally injected with the appropriate vehicle (C26 group;  $n = 8$ ), and mice injected with C26 cancer cells and daily intraperitoneally injected with 10 mg/kg of TDCA (C26-TDCA group;  $n = 8$ ).<sup>[42](#page-22-9)[,43](#page-22-10)</sup>

<span id="page-3-0"></span>For the MC38 experiment, 8-week-old male C57BL/6 mice (The Jackson Laboratory, Bar Harbor, ME, USA) were housed up to 5 per cage and randomized into one of the following conditions: subcutaneous injection of  $1.0 \times 10^6$  MC38 tumor cells in 200  $\mu$ l sterile saline (MC38,  $n = 5$ ) or an isovolumetric subcutaneous injection of vehicle (Control,  $n = 5$ ) as previously described.<sup>[44](#page-22-11)</sup>

<span id="page-3-1"></span>For the HCT116 experiment, 8-week-old male NOD scid gamma (NSG) (NOD-scid/IL2Rg<sup>null</sup>) immunodeficient mice (In Vivo Therapeutics Core Facility, Indiana University Simon Cancer Center, Indianapolis, IN, USA) were housed up to 5 per cage within a pathogen-free facility at Indiana University School of Medicine's laboratory animal resource center. Animals were randomized into one of the following experimental conditions: subcutaneous injection of  $3.0 \times 10^6$  HCT116 tumor cells in 200  $\mu$ l sterile saline (HCT116,  $n = 5$ ) or an isovolumetric subcutaneous injection of vehicle (Control,  $n = 5$ ), as previously described.<sup>45</sup> Animals were weighed daily and then humanely euthanized under light isoflurane anesthesia and in a fed state 28 (MC38) or 29 (HCT116) days after tumor implantation. Following euthanasia, tumor, skeletal muscles, and liver tissues were harvested and weighed.

<span id="page-3-2"></span>All the experiments performed in Belgium were approved by and performed in accordance with the guidelines of the local ethics committee from the UCLouvain, Belgium. Housing conditions were as specified by the Belgian Law of 29 May 2013, regarding the protection of laboratory animals. The animal experiments performed at IUSM were conducted with approval of the Institutional Animal Care and Use Committee at Indiana University School of Medicine and were in compliance with the National Institutes of Health Guidelines for Use and care of Laboratory Animals.

# *Tissue mRNA analysis*

Total RNA was isolated from tissue by TriPure reagent (Roche, Basel, Switzerland). cDNA was prepared by reverse transcription of 1 μg total RNA using the Goscript RT Mix OligoDT kit (Promega, Leiden, The Netherlands). Real-time polymerase chain reactions (PCR) were performed with a StepOnePlus/QuantStudio Real-Time PCR System and software (Applied Biosystems, Den Ijssel, The Netherlands) or a CFX96 TouchTM instrument and software (Bio-Rad Laboratories, CA, USA) using SYBR Green (Applied Biosystems, Promega, Seraing, Belgium) for detection. All samples were run in duplicate in a single 96-well reaction plate, and data were analyzed according to the  $2^{-\Delta\Delta CT}$  method. The purity of the amplified product was verified by analyzing the melt curve performed at the end of amplification. The ribosomal protein L6 (*Rpl6*) gene was used as housekeeping gene. The primer sequences for the targeted mouse genes are detailed in Supplementary Table 1.

### *Gut microbiota analysis*

# *DNA extraction and total bacteria quantification*

<span id="page-3-3"></span>DNA was extracted from cecal samples following the protocol Q described by Costea et al.<sup>[46](#page-22-13)</sup> This protocol uses the QIAamp DNA Stool Mini Kit (Qiagen, Germany) and includes a bead-beating step. Treatment with RNAse A was performed (10 mg/ml, Thermo Fisher Scientific, USA). DNA concentration was determined, and purity (A260/ A280) was checked using a NanoDrop 2000 (Thermo Fisher Scientific, USA).

Absolute quantification of the total bacterial load was performed by quantitative polymerase chain reaction (qPCR) using the primers Bacteria Universal P338F (ACTCCTAC

<span id="page-4-1"></span>GGGAGGCAGCAG) and P518r (ATTAC CGCGGCTGCTGG).[47](#page-22-14) Real-time PCR was performed with a QuantStudio3 (Applied Biosystems, The Netherlands) using SYBR Green (GoTaq® qPCR mix, Promega, USA) for detection. All samples (0.1ng/µl) were run in duplicate in a single 96-well reaction plate. Final concentrations were as follows: cDNA 2 µl/25 µl, primers 300 nM, and SyberGreen mix 1X (MeteorTaq DNA polymerase, dNTP, RT buffer, MgCl2 4 mm, SYBR® Green I, ROX passive reference, and stabilizers, as provided by the manufacturer). Thermocycling conditions were as follows: initiation step at 95°C 2 min; cycling stage at 95°C 30 s, 60°C 30 s, 72°C 30 s, 40 cycles; melt curve stage at 95°C 1 s, 65°C 20 s, increment of 0.1°C every 1 s until reaching 95°C. Threshold was manually adjusted to reach the linear range of the logfluorescent curves and CT values were determined using the QuantStudio Software (Version 1.4.3, Applied Biosystems, The Netherlands). Absolute quantification was achieved through the inclusion of a standard curve (performed in duplicate) on each plate generated by diluting DNA from pure culture of L. acidophilus NCFM (five-fold serial dilution). Cell counts were determined by plating and expressed as "colony-forming unit" (CFU) before DNA isolation.

### *16S rRNA gene sequencing – data generation*

Amplicon sequencing of the microbiome was done at the University of Minnesota Genomics Centre. Briefly, the V5-V6 region of the 16S rRNA gene was PCR-enriched using the primer pair V5F\_Nextera (TCGTCGGCAGCGTCAGATGT GTATAAGAGACAGRGGATTAGATACCC) and V6R\_Nextera (GTCTCGTGGGCTCGGAGATG TGTATAAGAGACAGCGACRRCCATGCANC-ACCT) in a 25 μl PCR reaction containing 5 μl of template DNA, 5 μl of 2X HotStar PCR master mix, 500 nM of final concentration of primers and 0.025 U/μl of HostStar Taq+ polymerase (QIAGEN). PCR-enrichment reactions were conducted as follows, an initial denaturation step at 95°C for 5 min followed by 25 cycles of denaturation (20 s at 98 $^{\circ}$ C), annealing (15 s at 55 $^{\circ}$ C), and

elongation (1 min at 72°C), and a final elongation step (5 min at 72°C). Next, the PCR-enriched samples were diluted 1:100 in water for input into library tailing PCR. The PCR reaction was analogous to the one conducted for enrichment except with a KAPA HiFi Hot Start Polymerase concentration of  $0.25 \text{ U/}\mu\text{l}$ , while the cycling conditions used were as follows: initial denaturation at 95°C for 5 min followed by 10 cycles of denaturation (20 s at 98°C), annealing (15 s at 55°C), and elongation (1 min at 72°C), and a final elongation step (5 min at 72°C). The primers used for tailing are the following: F-indexing primer AATGATAC GGCGACCACCGAGATCTACAC[i5]TCGTCGG CAGCGTC and R-indexing primer CAAGCA GAAGACGGCATACGAGAT[i7]GTCTCGTGG GCTCGG, where [i5] and [i7] refer to the index sequence codes used by Illumina. The resulting 10 μl indexing PCR reactions were normalized using a SequalPrep normalization plate according to the manufacturer's instructions (Life Technologies). Twenty μl of each normalized sample was pooled into a trough, and a SpeedVac was used to concentrate the sample pool down to 100 μl. The pool was then cleaned using 1X AMPureXP beads and eluted in 25 μl of nucleasefree water. The final pool was quantitated by QUBIT (Life Technologies) and checked on a Bioanalyzer High-Sensitivity DNA Chip (Agilent Technologies) to ensure correct amplicon size. The final pool was then normalized to 2 nM, denatured with NaOH, diluted to 8 pM in Illumina's HT1 buffer, spiked with 20% PhiX, and heat denatured at 96°C for 2 min immediately prior to loading. A MiSeq 600 cycle v3 kit was used to sequence the pool.

### *16S rRNA gene sequencing – bioinformatics*

<span id="page-4-0"></span>Subsequent bioinformatics analyses were per-formed in-house as previously described.<sup>[36](#page-22-15)</sup> Initial quality filtering of the reads was performed with the Illumina Software, yielding an average of 59 171 pass-filter reads per sample. Quality scores were visualized with the FastQC software ([http://www.](http://www.bioinformatics.babraham.ac.uk/publications.html) [bioinformatics.babraham.ac.uk/publications.](http://www.bioinformatics.babraham.ac.uk/publications.html) [html.](http://www.bioinformatics.babraham.ac.uk/publications.html)), and reads were trimmed to 220 bp (R1) and 200 bp (R2) with the FASTX-Toolkit ([http://han](http://hannonlab.cshl.edu/fastx_toolkit/) [nonlab.cshl.edu/fastx\\_toolkit/\)](http://hannonlab.cshl.edu/fastx_toolkit/). Next, reads were merged with the merge-illumina-pairs application

<span id="page-5-3"></span><span id="page-5-2"></span><span id="page-5-1"></span><span id="page-5-0"></span>v1.4.2 (with  $p = 0.03$ , enforced Q30 check, perfect matching to primers which are removed by the software, and otherwise default settings including no ambiguous nucleotides allowed).<sup>48</sup> The UPARSE pipeline implemented in USEARCH  $v11<sup>49</sup>$  was used to further process the sequences. Amplicon sequencing variants (ASVs) were identified using UNOISE3.[50](#page-22-18) Such a method infers the biological sequences in the sample prior to the introduction of amplification and sequencing errors, and distinguishes sequence variants differing by as little as one nucleotide.<sup>51</sup> The analysis allowed the identification of 1261 ASVs. ASVs were identified using the RDP database v18. Taxonomic prediction was performed using the  $nbc\_tax$  function,<sup>[52](#page-23-1)</sup> an implementation of the RDP Naive Bayesian Classifier algorithm.<sup>53</sup> Taxonomic identification of ASV of interest was refined using EZBioCloud (database version  $2023.08.23<sup>54</sup>$  and cross-validated using blastn and the Prokaryota experimental tanoxonomic nt database. Alpha diversity indexes were calculated using QIIME<sup>55</sup> on the rarefied ASV table. Rarefaction was performed using Mothur  $1.32.1^{56}$ by randomly selecting 28 000 sequences for all samples.

### <span id="page-5-8"></span><span id="page-5-7"></span><span id="page-5-6"></span><span id="page-5-5"></span><span id="page-5-4"></span>*16S rRNA gene sequencing – biostatistics*

<span id="page-5-12"></span><span id="page-5-11"></span><span id="page-5-10"></span><span id="page-5-9"></span>Unrarefied data were filtered to select for a minimum abundance of 0.01% and a minimal prevalence of 35% in one group. Principal component analysis (PCA) was performed on CLRtransformed data<sup>57</sup> using the *pca* function in the *mixOmics R* package<sup>58</sup> followed by Permutational Multivariate Analysis of Variance (PERMANOVA) using the *adonis* function in the *vegan* R package[.59](#page-23-8)  The PERMANOVA allowed to evaluate the explanatory power of each factor individually. The CLR transformation consists in a centered log ratio transformation and allows transforming compositional data into an Euclidian space. A pseudocount equal to half the minimal value found in the dataset was applied prior the CLR transformation.<sup>60</sup> Significantly impacted phyla, families, genera, and ASV were identified using a Mann–Whitney U-test in R since normality was not inspected for every phylum/family/genus/ASV. The p-value was adjusted to control for the false discovery rate (FDR) for multiple testing according

<span id="page-5-13"></span>to the Benjamini and Hochberg (BH) procedure. $61$ A q-value of <0.05 was considered significant. Venn diagrams were generated using a web-based tool [\(http://bioinformatics.psb.ugent.be/webtools/](http://bioinformatics.psb.ugent.be/webtools/Venn/) [Venn/](http://bioinformatics.psb.ugent.be/webtools/Venn/)).

### *Bile acid metabolizing activities*

<span id="page-5-14"></span>Bile salt hydrolase activity was measured as described by Thomas et al. $62$  Briefly, frozen feces samples were weighed, homogenized in sterile phosphate buffer saline (PBS) and centrifuged. Proteins in the supernatant were precipitated by the addition of saturated ammonium sulfate, centrifuged, and the protein-containing pellet resuspended in sodium acetate buffer (50 mm, pH 4.7). Next, proteins (50 μg/reaction, in duplicate) were incubated with taurocholic acid-2,2,4,4-deuterium  $(d_4$ -TCA, 400 µM final concentration, Sigma Aldrich) for 15 min at 37°C under agitation. The reaction was stopped by the addition of cold acetone.

<span id="page-5-15"></span>The measurement of the 7α-dehydroxylation of bile acids by bacteria was performed on cecal contents from CT and C26 mice and on a specific cultured bacterial strain (*Clostridium scindens*, DSM 5676, DSMZ GmbH) as previously described.[63](#page-23-12) *C. scindens* was cultured in brainheart infusion broth (BHI, 37.0 g/L) supplemented with yeast extract (5.0 g/L) and L-cysteine HCl (0.5 g/L) at pH 7.0, in an anaerobic chamber (Coy Laboratory Product) with a gas mix of 5% hydrogen and 95% nitrogen. To induce the *bai* operon and the 7α-dehydroxylating activity, *C. scindens*  was grown in sterile BHI medium with 100  $\mu$ M CA for 48 h. When the culture reached its stationary phase, the culture was centrifuged and then resuspended in 1 ml of fresh BHI. For bacteria from cecal contents, ceca were collected and transferred directly to an anaerobic chamber (Coy Laboratory Product) with a gas mix of 5% hydrogen and 95% nitrogen. From there, all steps were carried out under strict anaerobic conditions. Cecal contents were then collected, weighed, resuspended in sterile oxygen-free PBS, filtered  $(100 \,\mu m)$  and centrifuged. The bacterial pellet was suspended in 250 µl of fresh BHI. The fresh bacterial suspension and bacterial culture  $(60 \mu l, \text{in tripli-}$ cate) were then incubated with cholic acid-2,2,4,4 $d_4$  ( $d_4$ -CA, 100  $\mu$ M final concentration, Toronto Research Chemicals) for 15 min (as well as 2 min, 2 h, and 23 h for bacterial culture) at 37°C under agitation to assess bile acid 7αdehydroxylation. Incubation of BHI without bacteria in which  $d_4$ -CA was added was used as control. The reaction was stopped by freezing in liquid nitrogen.

#### *Bile acid quantification*

<span id="page-6-0"></span>Bile acid quantification was performed by LC-HRMS as previously described. $64$  Briefly, liver samples homogenized in ice-cold distilled water, or cecal contents from bile acid metabolizing activities experiments were placed in reaction tubes and proteins were allowed to precipitate using acetone containing deuterated internal standards. The samples were next centrifuged, the supernatant recovered and evaporated to dryness. The resulting residue was analyzed by LC-HRMS using an LTQ-Orbitrap XL coupled to an Accela HPLC system (ThermoFisher Scientific). Analyte separation was performed on an Ascentis Express C18 column  $(2.7 \,\mu m, 4.6 \times 150 \,\text{mm}$  from Sigma-Aldrich) and a gradient of water and acetonitrile in the presence of formic acid (0.1%). Analytes were ionized using an electrospray ionization probe operated in negative mode. The instrument was calibrated before each analysis. Calibration curves were prepared using the same conditions. Data are expressed as pmol normalized by the amount of tissue. Bile acids detected using this method are listed in Supplementary Table 2.

#### *Identification of additional bile acids*

Epimerization intermediates  $d_{4}$ -7-oxodeoxycholic acid  $(d_4$ -7-oxoDCA) and  $d_4$ -12-oxochenodeoxycholic acid  $(d_4-12-oxoCDCA)$  were identified through analysis by LC-MS/MS. Briefly, processed matrix isolated from CT mice used for 7αdehydroxylation activity measurements (see above) were spiked with 20 pmol of unlabeled 7-oxoDCA or 12-oxoCDCA and subsequently analyzed using a Xevo TQ-S tandem quadrupole mass spectrometer coupled to an Acquity H-Class UPLC system (Waters). Analytes were separated using an Ascentis Express C18 column  $(2.7 \,\mu m,$   $4.6 \times 150 \text{ mm}$  from Sigma-Aldrich) and a gradient of water and acetonitrile in the presence of formic acid (0.1%). The mass spectrometer was equipped with an electrospray ionization probe used in positive mode. MRM transitions for 7-oxoDCA were  $353.1 > 235.1$  (Q) and  $353.1 >$ 271.1 (q), for 12-oxoCDCA they were  $407.2 >$ 353.2 (Q) and 407.2 > 371.2 (q), whereas they were  $357.1 > 235.1$  (Q) and  $357.1 > 271.1$  (q) for  $d_{4}$ -7-oxoDCA, and 411.2 > 357.2 (Q) and 411.2 > 375.2 (q) for  $d_4$ -12-oxoCDCA. Detection for  $d_4$ -7-oxoDCA and d<sub>4</sub>-12-oxoCDCA were normalized to the signal of the internal standard  $d_4$ -TCA.

#### *Hepatic RNA sequencing*

<span id="page-6-2"></span><span id="page-6-1"></span>The quality and quantity of the RNA samples were evaluated using a 2100 Bioanalyzer System (Agilent Technologies, USA). All RIN values were greater than 7, supporting RNA integrity. RNA samples were sequenced after polyA selection using a  $2 \times$ 150 paired-end configuration on a NovaSeq 6000 instrument (Macrogen, the Netherlands). Raw sequence data were generated from Illumina TruSeq Stranded Total RNA library. Fastq files were processed using a standard RNAseq pipeline including Trimmomatic  $(v0.39)$ <sup>65</sup> to remove low quality reads and HISAT2  $(v2.2.1)$ <sup>66</sup> to align reads to the mouse genome (GRCm38). Gene expression levels were evaluated using featureCounts from Subread  $(v2.0.3)^{67}$  $(v2.0.3)^{67}$  $(v2.0.3)^{67}$  and Mus\_musculus. GRCm38.94.gtf. Differential expression analyses were performed with DESeq2 Bioconductor package v1.36.0.[68](#page-23-17) Gene set enrichment analysis (GSEA) was performed with clusterProfiler (v.3.14.3) Bioconductor package<sup>69</sup> and Hallmark gene sets from Molecular Signature Database (msigdbr v.7.1.1).

#### <span id="page-6-5"></span><span id="page-6-4"></span><span id="page-6-3"></span>*Hepatic cholestol quantification*

<span id="page-6-6"></span>Cholesterol content was measured in the liver tissue after extraction with chloroform – methanol according to the Folch method.<sup>70</sup> Briefly, 100 mg of liver was homogenized in 2 ml of chloroform: methanol (2:1). Lipids were extracted by addition of 40 µl NaCl 0.9%. The chloroform phase was evaporated under nitrogen flux and the dried residue was solubilized in isopropanol. Cholesterol

concentration was measured using a kit coupling an enzymatic reaction and spectrophotometric detection of the final product (Diasys Diagnostic and System, Holzheim, Germany).

#### *Statistical analyses*

All data were checked for normality using the Shapiro-Wilk normality test. Outliers were identified in normally distributed data using the Grubbs' test and removed. Normally distributed data were analyzed using a Student's t-test when comparing two groups, and one-way ANOVA followed by Dunnett's pairwise comparison posttests with the C26 group as reference when comparing three groups. Data determined to be non-normal even after log-transformation were analyzed using a Mann-Whitney U test or Kruskal–Wallis test with Dunnett's posttests. Body weight and food intake evolution in the TDCA administration experiment were analyzed using a two-way ANOVA with Tukey's posttests. Correlation analyses were performed using Spearman correlations. Statistical analyses were carried out using GraphPad Prism 8.0 (GraphPad Software, San Diego, CA) and R. *p* < .05 was considered statistically significant.

### **Results**

# *Alterations in bile acid profile and pathways in three mouse models of cancer cachexia*

We previously showed alterations in hepatic bile acid profile and hepatic metabolism in the C26 cachectic mouse model. $26,27$  We therefore sought to assess the relevance of these findings in 2 other mouse models of cancer cachexia, the MC38 and HCT116 models.<sup>[44,](#page-22-11)[45](#page-22-12)</sup> Both models are characterized by reduced body and muscle weights (Supplementary Figure S1). We found significant alterations in the hepatic bile acid profile marked by increased levels of primary bile acids, mainly driven by taurocholic acid (TCA) in C26 and MC38 mice, while these levels decreased in HCT116 mice as compared to their respective CT mice ([Figure 1](#page-8-0); Supplementary Figure S2). Interestingly, most secondary bile acids were significantly altered, including a significant decrease in TDCA in C26 and HCT116 mice, as well as a decrease in ω-muricholic acid (ω-MCA) in MC38 mice. While levels of tauro-ω-muricholic acid (Tω-MCA) decreased in C26 and MC38 mice, these levels were increased in HCT116 mice [\(Figure 1\)](#page-8-0).

A clear and consistent downregulation of genes involved in bile acid synthesis (Cytochrome P450 family 7 sub‐family A member 1 (*Cyp7a1)*, Cytochrome P450 family 8 sub‐family B member 1 (*Cyp8b1)*, Cytochrome P450 family 27 sub‐family A member 1 (*Cyp27a1)* and Cytochrome P450 family 7 sub‐family B member 1 (*Cyp7b1)*) was found in the 3 cachexia models, with the exception of *Cyp7a1*, which did not reach significance in MC38 mice ([Figure 2a](#page-9-0)). Several genes involved in the hepatobiliary transport system were also affected ([Figure 2b\)](#page-9-0). The Na<sup>+</sup>/taurocholate transport protein (*Ntcp*), involved in hepatic bile acid uptake, was downregulated only in C26 mice. The Bile salt export pump (*Bsep*), implicated in bile acid hepatobiliary efflux, was downregulated in all cachectic models, while the Multidrug resistance‐associated protein 2 (*Mrp2*), also involved in bile acid hepatobiliary efflux, was significantly downregulated in C26 and MC38 mice. Coherently, the Organic solute transporter subunit beta (*Ostb*), a key player in the alternative bile acid efflux to the systemic circulation activated upon cholestasis, was significantly upregulated in C26 and MC38 mice, whereas this gene was downregulated in HCT116 mice.

Together, these data pointed out marked changes in bile acid pathways, mainly characterized by a global downregulation of the bile acid synthesis and the hepatobiliary transport, as well as a decrease in secondary bile acids, such as TDCA and muricholic acid derivatives (C6-hydroxylated bile acids). As our research question was the contribution of microbial dysbiosis to bile acid homeostasis and muricholic acid derivatives are predominant in mice but only marginally detected in humans, $71-73$  $71-73$  we selected TDCA as the focus of our downstream work.

# <span id="page-7-0"></span>*Association between altered composition of the gut microbiota and reduced TDCA levels during the progression of cachexia in C26 mice*

We then focused on which changes in the composition of the gut microbiota could be responsible

<span id="page-8-0"></span>

**Figure 1.** Hepatic bile acid profiling revealed alterations in bile acid composition in C26, MC38 and HCT116 cachectic mice as compared to their respective CT mice.  $n = 4-8$  mice per group, data are presented as mean  $\pm$  SEM,  $*p < 0.5$ ,  $*p < 0.01$  and  $**p < 0.01$ vs CT groups. NQ, not quantified. Panel a has been previously published in Thibaut et al, J Cachexia Sarcopenia Muscle 2021,<sup>[26](#page-21-17)</sup> these data points are therefore indicated with empty symbols.

for the decrease in secondary bile acids. In a previous experiment performed with the C26 model,<sup>[26](#page-21-17)</sup> we evaluated the time course of appearance of bile acid alterations and associated it with the onset of cachectic symptoms. In this experiment, we euthanized control and C26 mice  $(n = 8)$ mice per group) at 3 time points corresponding to different stages in the progression of cachexia: day 8 with no weight loss and no reduced food intake, day 9 with minor weight loss and first signs of anorexia (pre-cachexia) and day 10 with marked reduced body weight and food intake (cachexia) ([Figure 3a,b\)](#page-10-0). Interestingly, the hepatic levels of TDCA were decreased starting from day 8, highlighting the early nature of this alteration in the C26 cachectic mice [\(Figure 3b\)](#page-10-0).

Next, we analyzed the time course of appearance of microbial alterations in these mice. Caecal

<span id="page-9-0"></span>

**Figure 2.** Hepatic gene expression levels in C26, MC38 and HCT116 cachectic mice as compared to their respective CT mice. Genes involved in bile acid synthesis (a) and hepatobiliary transport system (b). Cytochrome P450 family 7 sub‐family a member 1 (*Cyp7a1*), cytochrome P450 family 8 sub‐family B member 1 (*Cyp8b1*), cytochrome P450 family 27 sub‐family a member 1 (*Cyp27a1*) and cytochrome P450 family 7 sub‐family B member 1 (*Cyp7b1*), Na+/taurocholate transport protein (*Ntcp*), bile salt export pump (*Bsep*), multidrug resistance‐associated protein 2 (*Mrp2*), organic solute transporter subunit beta (*Ostb*). *n* = 4–8 mice per group, data are presented as mean ± SEM, \**p* < 0.05, \*\**p* < 0.01 and \*\*\**p* < 0.001 vs CT groups.

content weight was reduced before the onset of cachexia while total bacteria levels were increased at days 9 and 10 (Supplementary Figure S3A). Analysis of the alpha-diversity, reflecting the diversity within individuals, revealed a significant drop of indexes of richness (Chao1 and observed ASVs), evenness (Heip evenness and Simpson evenness) and richness and evenness (Shannon and Simpson) only at day 10 (Supplementary Figure S3B).

<span id="page-9-1"></span>Our analyses focused mainly on the ASV level as many microbial bile acid metabolic activities are not shared at the family (and higher taxonomic) level.[6](#page-21-2)[,74](#page-23-22) At the ASV level, a principal component analysis showed a progressive separation of the C26 groups over time, compared to the CT groups (PERMANOVA,  $R^2 = 36\%$ ,  $p = 0.001$ ) [\(Figure 3c](#page-10-0)). To identify ASVs potentially involved in the early decrease in the secondary bile acid TDCA, we selected all the ASVs that were significantly changed in the C26 groups on days  $8$ ,  $9$  and  $10$  (q-value <0.05), compared with their respective CT groups, namely 6 ASVs ([Figure 3d,](#page-10-0) Supplementary Table 3). Among these ASVs, we identified ASV 211, ASV 183, and ASV 181 whose relative abundances increased progressively during the development of cachexia symptoms in C26 mice, respectively assigned to *Streptococcus* spp., unclassified <span id="page-9-2"></span>*Mogibacterium* and *Parabacteroides* spp. ([Figure 3e](#page-10-0)). Conversely, ASV 9, ASV 144 and ASV 565 displayed an early decrease in their relative abundance. These ASV correspond respectively to *Prevotella rodentium* (recently reclassified as *Xylanibacter rodentium*<sup>[75](#page-23-23)</sup>), unclassified *Borkfalkiaceae*, and *Sporobacter* spp. ASV 9 (and ASV 144 to a lower extent) were positively correlated with TDCA levels, suggesting a potential involvement of these ASVs in the reduced TDCA levels ([Figure 3f\)](#page-10-0).

At the family level, a principal component analysis revealed a progressive separation of the C26 groups over time, compared to the CT groups (PERMANOVA,  $R^2 = 65\%$ ,  $p = 0.001$ ) ([Figure 4a](#page-12-0)). The *Clostridiales incertae sedis XIII*, *Streptococcaceae* and *Deferribacteraceae* families were significantly increased in the C26 groups on days 8, 9, and 10, compared with their respective CT groups ([Figure 4b,c,](#page-12-0) Supplementary Table 4). Interestingly, the family *Prevotellaceae*  was reduced, in line with the reduction of ASV 9. Analyses at the phylum and genus levels were consistent with the observations made at the family level: the phylum *Deferribacteres* and the genera *Streptococcus*, *Parabacteroides*, and *Mucispirillum* were early and consistently increased in C26 mice while the genus

<span id="page-10-0"></span>

**Figure 3.** Gut microbiota composition (at the ASV level) according to the different stages in the progression of cachexia in cachectic C26 mice. (a) Experimental design. (b) Body weight, food intake evolution and hepatic TDCA levels at 8, 9 and 10 days after C26 cell injection (C26) or sham injection (CT). Data are presented as mean ± SEM, \**p* < 0.05, \*\**p* < 0.01, \*\*\**p* < 0.001 vs CT groups. (c) Principal component analysis at the ASV level (PERMANOVA, R2 = 36%, *p* = 0.001). (d) Venn diagram generated from ASV significantly changed

*Prevotella* was decreased at days 8, 9 and 10 in C26 mice compared to their respective CT groups (Supplementary Table 4).

Overall, these data highlight that several taxa of the gut microbiota, including the ASV 9, ASV 144, and *Prevotellaceae*, are reduced early during the progression of cachexia in C26 mice and could potentially be responsible for the early reduction in hepatic TDCA levels.

# *Reduced microbial 7α-dehydroxylation activity in C26 mice*

Next, we aimed to determine whether the alterations in the gut microbiota composition induce functional changes in microbial bile acid metabolism. We thus evaluated the bile acid metabolizing activities of gut bacteria in C26 mice. As deconjugation is considered an essential initial step in the metabolization of bile acids, we first analyzed the microbial functional capacity to deconjugate bile acids through the BSH activity. Proteins extracted from feces of C26 and CT mice were incubated with  $d_4$ -TCA and the production of d4-CA was quantified. The BSH activity did not differ between CT and C26 mice ([Figure 5a](#page-13-0)). As bacteria can also carry out amino acid conjugation through the BSH, $^{16,17'}$  we looked for microbially conjugated bile acids (MCBA) in samples arising from the incubation of fecal proteins with labeled TCA for up to 1 h, a timing previously shown to be adequate to detect such compounds.<sup>16</sup> However, we found no trace of MCBA in these samples (data not shown). One explanation may be the fact that no exogenous amino acids were provided during the reaction.

<span id="page-11-1"></span><span id="page-11-0"></span>To evaluate the 7α-DH activity, we prepared fresh cecal bacterial suspensions, incubated them in the presence of  $d_4$ -CA in anaerobic conditions and quantified the production of  $d_3$ -DCA. Of note, the loss of a deuterium on carbon 4 is due to the formation of 3-oxo- $\Delta^4$ -CA as an intermediate in the 7 $\alpha$ -dehydroxylation pathway of  $d_4$  $d_4$ -CA.<sup>4</sup> This experiment revealed a significant reduction in the

7α-DH activity in C26 mice ([Figure 5a\)](#page-13-0), demonstrating the reduced microbial functional capacity in C26 cachectic mice to metabolize the primary bile acid CA into the secondary bile acid DCA. These results were also confirmed in an independent *in vivo* experiment performed 6 months later (Supplementary Figure S4), further demonstrating the robustness of our findings.

Interestingly, while measuring the 7α-DH activity by LC-HRMS, we also detected several unidentified peaks that were present following  $d_4$ -CA incubation with cecal bacterial suspensions. One peak was characterized by an m/z ratio of 411.3039 (hereafter named peak 411.3039), consistent with an isomer of  $d_4$ -CA, whereas two peaks had a m/z ratio of 409.2883, corresponding to the m/z of dehydrogenated derivatives of  $d_4$ -CA. To identify these peaks, we selected several standards, based on the m/z and the biochemical pathways potentially involved, and compared their relative retention times with the unidentified peaks in the same chromatographic system. When relative retention times and m/z ratio were similar, we aimed to confirm the identity of these peaks by spiking matrices from CT mice containing deuterated unidentified compounds with pure unlabeled standards. Subsequently, these spiked matrices were analyzed by LC-MS/MS. Using this technique, we successfully identified both peaks with an m/z ratio of 409.2883 in LC-HRMS as  $d_4$ -7-oxoDCA and  $d_{4}$ -12-oxoCDCA, two epimerization intermediates of  $d_4$ -CA (Supplementary Figure S5). However, we could not identify peak 411.3039. The levels of  $d_4$ -7-oxoDCA and  $d_4$ -12-oxoCDCA were significantly decreased in C26 mice ([Figure 5b\)](#page-13-0), whereas  $d_4$ -3-oxoCA was not detected. Interestingly, while the levels of peak 411.3039 were also significantly decreased in C26 mice (Supplementary Figure S6A), and though associated intermediates were detected, peak 411.3039 does not seem to be a 7- or 12-epimer of  $d_4$ -CA, as its relative retention time (RRT = 0.805, compared to  $d_4$ -CA) could not be matched with any of the

in the C26 groups on days 8, 9 and 10 (q-value <0.05), compared with their respective CT groups. (e) Relative abundance of the 6 ASVs that were significantly changed in the C26 groups on days 8, 9 and 10. Data are presented as mean  $\pm$  SEM,  $*$  q < 0.05,  $*$ \*q < 0.01 vs CT groups. (f) Spearman correlations between the relative abundance of ASVs that were significantly changed in the C26 groups on days 8, 9 and 10, and their hepatic levels of TDCA (C26 groups). *n* = 7–8 mice per group. Panel B has been previously published in Thibaut et al, J Cachexia Sarcopenia Muscle 2021,<sup>26</sup> these data points are therefore indicated with empty symbols.

<span id="page-12-0"></span>

**Figure 4.** Gut microbiota composition (at the family level) according to the different stages in the progression of cachexia in cachectic C26 mice. (a) Principal component analysis at the family level (PERMANOVA,  $R^2 = 65\%$ ,  $p = 0.001$ ). (b) Barplots representing the relative abundance of families in sham-injected mice (CT groups) and mice receiving an injection of C26 cancer cells (C26 groups) on days 8, 9 and 10. (c) Relative abundance of families that were significantly changed in the C26 groups on days 8, 9 and 10. *n* = 7–8 mice per group, data are presented as mean  $\pm$  SEM,  $*q$  < 0.05 and  $**q$  < 0.01 vs CT groups.

<span id="page-12-1"></span>tested standards (Supplementary Table 5). Moreover,  $d_4$ -7-oxoDCA,  $d_4$ -12-oxoCDCA and peak 411.3039, but not  $d_4$ -3-oxoCA, were detected when the *C. scindens* culture was incubated with  $d_4$ -CA (Supplementary Figures S6B and 7), in accordance with previous works reporting 7αhydroxysteroid dehydrogenase (7α-HSDH) and 12α-hydroxysteroid dehydrogenase (12α-HSDH) activities in *C. scindens* strains.[74](#page-23-22)[,76](#page-24-0) Intriguingly, only  $d_4$ -7-oxoDCA and  $d_4$ -12-oxoCDCA levels were affected over time, with levels increased after 2 and 15 min of incubation and then decreased after 2 and 23 h, while substrate levels were still sufficient, suggesting that peak 411.3039 is not an intermediate nor a product of  $d_4$ -CA epimerization (Supplementary Figure S7). Of note, using LC-MS /MS, 3-oxoCA, 7-oxoDCA, and 12-oxoCDCA were not detected in the liver of C26 mice, nor were 3-ECA, 7-ECA, and 12-ECA.

#### *TDCA protected mouse myotubes from atrophy*

Next, we aimed to determine the potential contribution of this reduced microbial production of DCA to cancer cachexia. As we evidenced in the past that bile acid modulation was asso-ciated to changes in muscle atrophic state<sup>[26,](#page-21-17)27</sup> and TDCA levels were reduced early, before the occurrence of muscle weight loss, we speculated that reduced TDCA levels may contribute to

<span id="page-13-0"></span>

**Figure 5.** Reduced microbial 7α-dehydroxylation activity in cachectic C26 mice. (a) Deconjugation of d4-taurocholic acid (d4-TCA) by the fecal bile salt hydrolases into  $d_4$ -cholic acid ( $d_4$ -CA) (left), followed by the caecal 7a-dehydroxylation activity into deoxycholic acid (d3-DCA) (right) in sham-injected mice (CT) or mice injected with C26 cells (C26). (b) Detection of deuterated epimerization intermediates in caecal content of CT and C26 mice after incubation of  $d_4$ -CA in anaerobic conditions at 37°C during 15 min.  $n =$ 6–12 mice per group, data are presented as mean ± SEM, \*\**p* < 0.01 and \*\*\**p* < 0.001 vs CT group. HSDH, hydroxysteroid dehydrogenase. ECA, epicholic acid. ND, not detected.

muscle atrophy in the C26 model. To test this hypothesis, we incubated murine  $C_2C_{12}$  myotubes with 50 µM of TDCA. TDCA increased myotube diameter after 48 h of treatment

<span id="page-14-1"></span>([Figure 6a](#page-14-0)). As TDCA is a potent agonist of TGR5, we wondered whether the TGR5 agonist INT-777[20,](#page-21-11)[77–](#page-24-1)[79](#page-24-2) could exert a similar effect. However, no change in myotube diameter was

<span id="page-14-0"></span>

Figure 6. TDCA protected C<sub>2</sub>C<sub>12</sub> myotubes against atrophy caused by dexamethasone. (a) Comparison of myotube diameter (µm) between the control myotubes (CT) and myotubes incubated with 50 µm of taurodeoxycholic acid (TDCA). (b) Comparison of myotube diameter between the CT myotubes and myotubes incubated with 1 µm of INT-777 (specific TGR5 agonist). (c) Comparison of myotube diameter between the 1 µm dexamethasone (DEXA) and vehicle-treated myotubes, myotubes incubated with 1 µM of DEXA and 50 µm of TDCA, and myotubes incubated with 1 µM of DEXA and 100 µm of TDCA. (d) Phase contrast microscopy pictures of myotubes treated with the vehicle (CT), treated with 1 µm DEXA, incubated with 1 µM of DEXA and 50 µm of TDCA, or incubated with 1 µM of DEXA and 100 µm of TDCA. Scale bar = 200 µm. Data are presented as mean ± SEM, representative of 3 independent experiments performed in triplicates (*N* = 3, *n* = 3). \*\**p* < 0.01, \*\*\**p* < 0.001 vs CT or vs DEXA.

observed after 48 h of treatment with INT-777, suggesting that the pro-atrophic effect of TDCA is not mediated by TGR5 ([Figure 6b\)](#page-14-0). Then, we co-incubated  $C_2C_{12}$  myotubes with 1  $\mu$ M of dexamethasone, a pro-atrophying agent, and 50 or 100 µM of TDCA. As expected, dexamethasone reduced myotube diameter, an effect that was totally prevented by both doses of TDCA ([Figure 6c,d](#page-14-0), Supplementary Figure S8). Altogether, these results indicate that TDCA exerts a hypertrophic action, likely independent of TGR5, and prevents dexamethasone-induced atrophy in murine myotube cultures.

# *TDCA administration did not prevent muscle atrophy but reduced liver weight in C26 mice*

Next, we investigated the effects of TDCA administration on cachectic features *in vivo* using the C26 mouse model. We compared sham-injected mice (CT), mice injected with C26 cells (C26) and mice injected with C26 cells and daily treated with TDCA (10 mg/kg i.p., C26-TDCA). TDCA administration did not affect body weight evolution and food intake evolution compared to C26 mice ([Figure 7a](#page-15-0)). Treatment with TDCA had no effect on tumor weight, and no impact on muscle weight (gastrocnemius and tibialis anterior, [Figure 7b\)](#page-15-0). Interestingly, treatment with TDCA counteracted the increase in liver weight observed in C26 mice ([Figure 7b](#page-15-0)), without inducing liver toxicity, as evidenced by the lack of increase in serum alanine aminotransferase (ALAT) levels (C26:  $6.1 \pm 1.0$ IU/L; C26-TDCA: 4.3 ± 0.2 IU/L, *p* = 0.13). Taken together, the administration of TDCA had no impact on muscle atrophy but prevented liver weight increase in C26 mice.

# *TDCA administration improved hepatic cholesterol homeostasis in C26 mice*

To understand the cause of the liver weight reduction induced by TDCA, a whole transcriptome analysis was performed on the liver of these

<span id="page-15-0"></span>

**Figure 7.** TDCA reduced liver weight in cachectic C26 mice. (a) Body weight and food intake evolution in sham-injected mice (CT), mice injected with C26 cells (C26), and mice injected with C26 cells and treated with 10 mg/kg/day of TDCA (C26-TDCA), expressed in % of initial body weight (% iBW) or % of initial food intake (% iFI). Two-way anova with Tukey's posttests. (b) Tumor, gastrocnemius (GAS), tibialis anterior (TIB) and liver weights in CT, C26 and C26-TDCA mice. One-way Anova with Dunnett's posttests, C26 group as the reference group. *n* = 7–8 mice per group, data are presented as mean ± SEM, \**p* < 0.05, \*\**p* < 0.01 and \*\*\**p* < 0.001 vs C26 group.

mice. Univariate analyses highlighted 1696 upregulated genes and 1207 downregulated genes in C26 mice compared to CT mice (padj  $< 0.05$ , absolute  $log_2(fold-change) > 1$ ). A gene set enrichment analysis revealed a down‐regulation of genes involved in oxidative phosphorylation, fatty acid metabolism, bile acid metabolism, and xenobiotic metabolism ([Figure 8Ai](#page-17-0)). Conversely, the main up-regulated pathways were IL-6/JAK/ STAT‐3 signaling, epithelial mesenchymal transition, coagulation, complement, TNFα signaling via NFκB, inflammatory response, and unfolded protein response (UPR) ([Figure 8Aiii](#page-17-0)). The same pathways were found to be similarly affected in a previous transcriptomics analysis.<sup>[26](#page-21-17)</sup> Treatment with TDCA significantly affected 533 genes (padj <0.05), with 48 genes induced (including *Osbpl6*) and 2 genes repressed with an absolute  $log<sub>2</sub>(fold$ change) > 1 [\(Figure 8b](#page-17-0), Supplementary Table 6). Compared to the impact of C26 inoculation, TDCA reinforced the downregulation of oxidative phosphorylation, fatty acid metabolism and xenobiotic metabolism ([Figure 8Ai\)](#page-17-0) while counteracting the changes in the UPR and cholesterol homeostasis pathways ([Figure 8Aiii](#page-17-0)). TDCAspecific responses were also noted, such as a downregulation of the DNA repair and Myc targets pathways [\(Figure 8Aii\)](#page-17-0). To confirm that TDCA impacts cholesterol homeostasis, we quantified hepatic cholesterol levels. Hepatic cholesterol levels tended to be increased in C26 mice and were reduced by the treatment with TDCA ([Figure 8c\)](#page-17-0).

### **Discussion**

This work highlights the functional role of the gut microbiota in metabolizing bile acids, which may act as signaling molecules impinging on hallmarks of cancer-associated cachexia. We first showed that alterations in the bile acid pathways, that we initi-ally evidenced in the C[26](#page-21-17) model, $26,27$  were also found in two other mouse models of cancer cachexia, namely the MC38 and HCT116 models. Furthermore, in C26 mice, the reduction in TDCA levels was associated with changes in the gut microbiota, both features occurring before the appearance of cachectic symptoms. Coherently, we found a reduction in microbial 7α-DH activity in cachectic C26 mice. Finally, we established that daily administration of TDCA lowered cholesterol levels in the liver of C26 mice.

By comparing several cachectic models, we observed an increase in total hepatic bile acid levels, mainly due to an increase in TCA levels in C26 and MC38 mice, but not in HCT116 mice. The expression of genes involved in bile acid synthesis was consistently reduced in all models, excluding the hypothesis that the increase in total bile acids arises from an increased synthesis. Several signs of cholestasis, namely the accumulation of hepatic bile acids, the decreased expression of *Ntcp* and *Mrp2*, and the increased expression of *Ostb*, were observed in the C26 and MC38 models but not in the HCT116 model. In addition, we observed a reduction in secondary bile acids, namely TDCA in C26 and HCT116 mice, and ω-MCA and Tω-MCA in MC38 mice. The fact that the nature of these secondary bile acids is different could be due to differences in microbial alterations between cachectic models, which may arise from the different mouse genetic backgrounds used for these models. Together, these results put forward common and model-specific alterations in the bile acid profile and pathways upon cancer cachexia.

<span id="page-16-1"></span><span id="page-16-0"></span>DCA is a secondary bile acid which arises from the microbial metabolism of CA and can be hydroxylated again at the C7 position into CA in murine hepatocytes through Cyp2a12.<sup>[80](#page-24-3)</sup> This reaction might also be catalyzed by  $Cyp2a22.^{80}$  As *Cyp2a12* and *Cyp2a22* are reduced in C[26](#page-21-17) mice,<sup>26</sup> we excluded hepatic rehydroxylation as an explanation for the reduced hepatic TDCA levels and focused on microbial metabolism. By analyzing in parallel the alterations in the composition of the gut microbiota and TDCA levels in C26 mice overtime, we identified ASV 9 and ASV 144 as ASV potentially involved in the lowering of the TDCA levels. These ASVs correspond to *Xylanibacter rodentium* and unclassified *Borkfalkiaceae* respectively. Whether these bacterial species/family display a 7α-DH activity is unclear. This metabolic activity has been primarily observed in *Clostridia*  species<sup>[4](#page-21-0),[10](#page-21-19)[,11,](#page-21-6)81</sup> but may be more widespread.<sup>74</sup> ASV 144 represents ~0.3% of the sequences in healthy mice. The *Borkfalkiaceae* family belongs to the *Clostridia* order and currently includes only uncultured genera which have not been

<span id="page-17-0"></span>

**Figure 8.** TDCA improved cholesterol homeostasis in cachectic C26 mice. (a) Significantly modified gene pathways between C26 and CT mice and between C26-TDCA and C26 mice using gene set enrichment analysis. (b) Heatmap of the 50 differentially regulated genes in C26-TDCA mice versus C26 mice (abs(L2FC) > 1, padj < 0.05). Among the 48 induced genes, 1 gene was induced (dark red cluster), 18 were not affected (light red cluster) and 29 were repressed (green cluster) in C26 mice compared to CT mice. 1 gene downregulated by TDCA was not affected in C26 mice (light blue cluster) while 1 gene downregulated by TDCA was also downregulated in C26 mice (dark blue cluster). (c) Hepatic cholesterol levels in CT, C26 and C26-TDCA mice. One-way anova with Dunnett's posttests, C26 group as the reference group. *n* = 6–8 mice per group, data are presented as mean ± SEM, \**p* < 0.05, \*\**p* < 0.01 and \*\*\**p* < 0.001 vs C26 group.

<span id="page-18-4"></span><span id="page-18-3"></span><span id="page-18-2"></span><span id="page-18-1"></span>functionally characterized. $82,83$  $82,83$  ASV 9 represents  $\sim$ 3% of the sequences in healthy mice, accounting for most of the *Prevotellaceae* members present in this ecosystem. *X. rodentium* is very close to *Prevotella copri* in terms of metabolic features (Pfam and CAZyme repertoires), $75$  but contrarily to *P. copri*, its impact on host has not been investigated so far. *P. copri* was reduced in lung cancer patients with cachexia compared to non-cachectic lung cancer patients and such reduction was correlated to lower plasma levels of a secondary bile acid, 3-oxoCA.[37](#page-22-19) Furthermore, *Prevotella copri* was reduced in patients with primary sclerosing cholangitis (PSC) and the administration of *Prevotella copri* to a mouse model of PSC improved cholestasis and liver fibrosis by enhancing the FXRrelated signaling pathway. $84$  To explore the potential bile acid metabolizing activity of *X. rodentium*, we ran a functional characterization of the genome of this bacterium using JGI<sup>85</sup> and BlastKOALA.<sup>86</sup> Such approaches consistently predicted the presence of a BSH gene and the absence of *bai*encoded genes. However, this result does not allow to fully exclude that *X. rodentium* carries out a 7α-DH activity. A false negative result may ensue from the heterogeneity in the orthologs being able to carry out this activity or the existence of divergent genes encoding the 7α-DH activity. Indeed, *Extibacter muris*, the first mouse isolate for which such 7α-DH activity was experimentally demonstrated, $^{87}$  displays only two out of the seven *bai*-encoded genes using these *in silico* approaches. Similarly, *Roseburia intestinalis*, *Bacteroides vulgatus*, and *Bifidobacterium adolescentis* strains predicted to possess only four or five genes of the *bai*  operon demonstrated a  $7\alpha$ -DH activity.<sup>74</sup> Determining whether *X. rodentium* is involved in the reduction of TDCA levels in C26 cachectic mice will therefore deserve further experimental work. Metagenomics analyses would be a first step in this direction and would allow to increase the taxonomic resolution.

<span id="page-18-6"></span><span id="page-18-5"></span>Because of (i) the lack of knowledge on the nature of bacteria carrying out the 7α-DH activity and (ii) the inducible nature of the *bai* operon,<sup>88</sup> making the 7α-DH activity environmentally dependent and not predicable based solely on genetic content analyses, we next focused on implementing microbial activity measurements using

stable isotopes, an emerging technique in the field of the microbiome. This approach revealed a decreased 7α-DH activity in the cecal content of C26 mice, with no change in BSH activity, and provides an explanation for the reduced levels of DCA, and consequently TDCA.

Interestingly, we also detected several unidentified compounds that appeared during the incubation of cecal samples with  $d_4$ -CA and that were significantly reduced in C26 mice, two of which were identified as  $d_4$ -7-oxoDCA and  $d_4$ -12oxoCDCA. The gut microbiota can carry out reactions other than 7α-dehydroxylation, such as epimerization, which further diversify the chemistry of secondary bile acids. CA can be dehydrogenated to form 3-oxoCA, 7-oxoDCA, and 12-oxoCDCA, and then rehydrogenated to form the epimers  $3-ECA$ ,  $7-ECA$ , and  $12-ECA$ ,<sup>[4](#page-21-0)</sup> respectively ([Figure 5b\)](#page-13-0).<sup>13</sup> However, one bacterial product of d4-CA remains unidentified. This molecule, named peak 411.3039, likely an isomer of  $d_4$ -CA based on its m/z ratio, was decreased in C26 mice (Supplementary Figure S6A). Surprisingly, despite the detection of epimerization intermediates  $d_4$  $-7$ -oxoDCA and  $d_4$ -12-oxoCDCA, peak 411.3039 was not identified as either  $d_4$ -7-ECA nor  $d_4$ -12-ECA. Moreover, it was also not identified as  $d_4$ -3-ECA nor  $d_4$ -allocholic acid, a flat isomer and microbial metabolite of  $d_4$ -CA. Finally, measurements from the *C. scindens* culture suggested that peak 411.3039 is not an intermediate nor a product of  $d_4$ -CA epimerization.

<span id="page-18-8"></span><span id="page-18-7"></span><span id="page-18-0"></span>7α-HSDH and 12α-HSDH, whose activities are decreased in C26 mice, can also produce 7-oxoLCA and 12-oxoLCA. Bacteria that possess HSDHs capable of metabolizing oxo- and epi- bile acids are progressively being identified, with the 7α-HSDH appearing to be more widespread than the 12α-HSDH.[13](#page-21-20)[,74,](#page-23-22)[76](#page-24-0) These reactions do not specifically need to be carried out in a single bacterium and epimerization can be performed by co-cultured organisms.[12](#page-21-7) The ability of microbial HSDHderived bile acids to activate host receptors has been partially uncovered while their role in host physiology begins to be explored. 7-oxoLCA is a FXR antagonist<sup>[89](#page-24-12)</sup> while 12-oxoLCA does not activate either FXR or VDR.<sup>[90](#page-24-13)</sup> 12-oxoLCA has been shown to reduce body weight loss, intestinal damage and associated colonic IL17A+ group 3

<span id="page-19-1"></span><span id="page-19-0"></span>innate immune cells in a mouse model of colitis. $91$ 7-oxoLCA can also promote intestinal homeostasis by improving the gut barrier function and intestinal stemness.[89](#page-24-12) This last point is of particular interest in our context as C26 mice display altered gut barrier function and intestinal stemness.<sup>92</sup> Future work will therefore aim to determine whether a reduced production of 7-oxoLCA and 12-oxoLCA by the gut microbiota, ensuing from a reduced microbial 7α-HSDH and 12α-HSDH activities, may contribute to the altered gut barrier function observed in this model.

<span id="page-19-2"></span>The physiological role of the canonical secondary bile acids DCA and LCA has been more extensively explored. In patients with inflammatory bowel disease (IBD), the secondary bile acids LCA and DCA are often reduced and associations between decreased levels of secondary bile acids and gut dysbiosis have been reported.<sup>2</sup> Furthermore, DCA downregulates inflammation and acts on glucose and energy homeostasis in several pathological contexts, including liver diseases, nonalcoholic steatohepatitis, type 2 diabetes and atherosclerosis.<sup>[20,](#page-21-11)[93](#page-24-16)</sup> As TDCA levels were reduced in cachectic mice, we hypothesized that supplementation with TDCA may dampen host metabolism alterations and inflammation. In accordance with this hypothesis, incubation of murine myotubes with TDCA evidenced hypertrophic and anti-atrophic effects. We therefore wondered whether TDCA increases myotube diameter through TGR5 activation. Some studies suggested that the hypertrophic activity exerted on  $C_2$  $C_{12}$  myotube diameter by bile acids such as LCA or TUDCA occurred through TGR5 activation.<sup>94-96</sup> In contrast, Abrigo and colleagues demonstrated that TGR5 activation by 25 or 50 µM of INT-777 induced atrophy in  $C_2C_{12}$  myotubes.<sup>[97](#page-25-1)</sup> In our hands, treatment of  $C_2C_{12}$  myotubes with 1  $\mu$ M of INT-777 did not impact myotube diameter. This result suggests the implication of a TGR5 independent mechanism in the hypertrophic activity of TDCA on  $C_2C_{12}$  myotubes.

<span id="page-19-10"></span><span id="page-19-9"></span><span id="page-19-4"></span><span id="page-19-3"></span>Despite the hypertrophic and antiatrophic effects of TDCA *in vitro*, TDCA did not prevent muscle atrophy in C26 cachectic mice. One hypothesis explaining the difference between the *in vitro* and *in vivo* results is that the administration of TDCA exerts indirect systemic effects which <span id="page-19-7"></span><span id="page-19-6"></span><span id="page-19-5"></span>counteract the local hypertrophic impact of TDCA on muscle metabolism. One such indirect systemic effect may be the regulation of the hypothalamic-pituitary-adrenal (HPA) axis by bile acids.<sup>[98,](#page-25-2)[99](#page-25-3)</sup> Indeed, FXR and TGR5 are expressed in adrenal glands where they participate in the regulation of the production of glucocorticoids,<sup>98</sup> which are known inducers of skeletal muscle atrophy.<sup>[100](#page-25-4)</sup> These elements lead us to speculate that TDCA administration may promote the activation of the HPA axis resulting in increased glucocorticoid production *in vivo*, an indirect proatrophic effect that would go against the direct antiatrophic effect of TDCA evidenced *in vitro*.

<span id="page-19-8"></span>Bile acid and cholesterol metabolisms are closely linked. Biliary cholesterol secretion and catabolism of cholesterol to synthesize bile acids, under the control of FXR, are the two main pathways for cholesterol elimination from the organism.[3,](#page-20-2)[101](#page-25-5) In C26 mice, both the hepatobiliary transport system and bile acid synthesis are reduced and may therefore explain the increased levels of hepatic cholesterol. TDCA administration to C26 mice improved cholesterol homeostasis and decreased hepatic cholesterol levels, but these improvements occurred independently of a change in the expression of the genes involved in the hepatobiliary transport system and bile acid synthesis. One of the key genes upregulated by TDCA and that may mediate this reduction in hepatic cholesterol is *Osbpl6*. *Osbpl6*, for Oxysterol Binding Protein Like 6, encodes the ORP6 protein whose overexpression enhances cholesterol trafficking and efflux in macrophages and hepatocytes.[102](#page-25-6) Intriguingly, *Osbpl6* is a target of miR-33, an miR able to inhibit cholesterol export and induced upon ER stress. $102-104$ One may therefore speculate that by reducing the UPR and the associated ER stress, TDCA reduced miR-33 expression and thereby increased *Osbpl6*  and cholesterol export. Coherently, *Abcb1a*, another cholesterol efflux transporter whose expression is reduced by ER stress and miR-33,<sup>[105](#page-25-8)</sup> tended to be increased in C26 mice treated with TDCA  $(log_2(fold-change) + 0.41, p = 0.012,$ padj = 0.15). Clinically, increased hepatic cholesterol may participate to the higher rate of insulin resistance and increased likelihood of new-onset diabetes among patients with a cancer

<span id="page-20-4"></span><span id="page-20-3"></span>diagnosis.[106](#page-25-9)[,107](#page-25-10) As metabolic dysfunction in patients with cancer associates with increased recurrence and reduced overall survival,<sup>[106](#page-25-9)</sup> controlling hepatic cholesterol through secondary bile acids may yield therapeutic benefits.

In conclusion, our work highlights the functional role of the gut microbiota in the modulation of bile acid profile in cachectic mice (graphical abstract) and demonstrates the interest of the secondary bile acid TDCA, as a microbial cometabolite, in the hepatic disorders associated to cancer cachexia. Such results prompt the need for future preclinical and clinical trials investigating the breadth and translational value of our findings. We believe that this study uncovers a mechanistic link between the gut microbiota and host metabolism in cancer cachexia, and therefore constitutes a key step forward in the understanding of the inter-organ communication in this deadly disease. More broadly, our work may contribute to the better understanding of the impact of the gut microbiota on cholesterol metabolism in health and disease.

### **Acknowledgments**

We thank Stéphanie Delieux and Bouazza Es Saadi for their skilled technical assistance and Dr Adeline Dolly, Dr Sarah Pötgens, and Dr Camille Lefevre their help during mouse experiments. We are grateful to Dr Isabelle Leclercq for granting us access to an anaerobic chamber. The MASSMET platform is acknowledged for the access to LC-MS/MS and LC-HRMS instruments. We also thank Dr Caroline Bouzin, Marine Olivier, Amélie Flandin and the IREC Imaging Platform (2IP) for assistance with histological analyses.

### **Disclosure statement**

No potential conflict of interest was reported by the author(s).

### **Funding**

This work was supported by the Fonds de la Recherche Scientifique – FNRS (F.R.S.-FNRS) and the Funds Suzanne Duchesne, Serge Rousseau and Docteur Jean Gérard, managed by the King Baudouin Foundation, as well as by the Walloon Region in the context of the funding of the strategic axis FRFS-WELBIO [40009849]. LBB is a Collen-Francqui

Research Professor and grateful for the support of the Francqui Fondation. LBB is also the recipient of subsidies from the FSR [Action de Recherche Concertée (ARC) LIPOCAN, 19-24.096] and the Fonds Wetenschappelijk Onderzoek - Vlaanderen (FWO) and the Fonds de la Recherche Scientifique FNRS under EOS Project [No. 40007505]. MMT and JG are Postdoctoral Research Fellows and EP is a PhD Research Fellow from the F.R.S.- FNRS. AB is supported by the V Foundation for Cancer Research [V2017-021] and the American Cancer Society [Research Scholar Grant 132013-RSG-18-010-01-CCG]. The funders had no role in study design, data collection and analysis, interpretation of the results, decision to publish or

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preparation of the manuscript.

Conception and design of the work: LBB and MMT. Data collection: MMT, MR, EP, JH, FP, AB and LBB. Data analysis and interpretation: MMT, MR, NMD, GGM, LBB. Acquisition of funding: NMD, GGM, LBB. Drafting the article: MMT, MR, and LBB. Setup of the 7α-DH activity: JG. Transcriptomics analyses: AL. Critical revision of the article: all. Final approval of the version to be published: all.

#### **Data availability statement**

Raw RNAseq sequencing data can be found on GEO (GEO ID GSE265876). Raw 16S rRNA gene sequences can be found in the SRA database (project ID: PRJNA1077894). The remaining data supporting the findings of this study are available within the article and its supplementary materials.

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