

RESEARCH ARTICLE

Microbiomic profiles of bile in patients with benign and malignant pancreaticobiliary disease

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Abstract

Background

The prognostic and pathophysiologic significance of the biliary microbiota in pancreaticobiliary malignancies is little understood. Our goal was to find malignancy-related microbiomic fingerprints in bile samples taken from patients with benign and malignant pancreaticobiliary diseases.

Methods

Bile specimens were collected from consenting patients during routine endoscopic retrograde cholangiopancreatography. We used PowerViral RNA/DNA Isolation kit to extract DNA from bile specimens. The Illumina 16S Metagenomic Sequencing Library Preparation guide was used to amplify the bacterial 16S rRNA gene and create libraries. QIIME (Quantitative Insights Into Microbial Ecology), Bioconductor phyloseq, microbiomeSeq, and mixMC packages were used for post-sequencing analysis.

Results

Of 46 enrolled patients, 32 patients had pancreatic cancers, 6 had cholangiocarcinoma and 1 had gallbladder cancer. Rest of the patients had benign diseases including gallstones, and acute and chronic pancreatitis. We used multivariate approach in mixMC to classify Operational Taxonomic Units (OTUs). Doing this, we found a predominance of genera *Dickeya* ($p = 0.00008$), *[Eubacterium] hallii* group ($p = 0.0004$), *Bacteroides* ($p = 0.0006$), *Faecalibacterium* ($p = 0.006$), *Escherichia-Shigella* ($p = 0.008$), and *Ruminococcus 1* ($p = 0.008$) in bile samples from pancreaticobiliary cancers as compared to benign diseases. Additionally, bile

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samples from patients with pancreatic cancer exhibited a predominance of genus *Rothia* ($p = 0.008$) as compared to those with cholangiocarcinoma, whereas bile samples from patients with cholangiocarcinoma exhibited a predominance of genera *Akkermansia* ($p = 0.031$) and *Achromobacter* ($p = 0.031$) as compared to those with pancreatic cancers.

Conclusions

Both benign and malignant pancreaticobiliary diseases have distinct microbiomic fingerprints. The relative abundance of OTUs in bile samples varies between patients with benign and malignant pancreaticobiliary diseases, as well as between cholangiocarcinoma and pancreatic cancer. Our data suggest that either these OTUs play a role in carcinogenesis or that benign disease-specific microenvironmental changes differ from cancer-specific microenvironmental changes, resulting to a clear separation of OTU clusters. We need more research to confirm and expand on our findings.

Introduction

Our understanding of the human microbiome in the context of cancer is evolving rapidly. Studies in the past have suggested that close to 16% of global cancer burden could be attributed to infections [1, 2]. Emerging studies reveal the role of the microbiome as a causative, prognostic, and predictive factor in cancer and its treatment [3–5]. For example, *Bacteroides fragilis* and *Escherichia coli* are implicated in colon carcinogenesis in patients with familial adenomatous polypos [6], and the gut microbiome may influence how cancer cells respond to immunotherapy, both for melanoma and epithelial malignancies [7, 8]. However, little is known about the carcinogenic role of bacteria in body sites that are generally considered sterile [9]. Specifically, in pancreaticobiliary cancers, which arise from organs typically not harboring microbes, there is some evidence that the microbiome may play a role in cancer initiation and progression, as well as recovery from surgery and response to therapy [10, 11]. Indeed, recent surveys of human tumor samples suggest both the presence of tumor-residing bacteria in non-mucosal sites including pancreas, breast, ovary, lung and skin; and correlation of microbiome's metabolic functions to their specific tumor types [12–14]. However, there is limited clinical data on microbiota in pancreaticobiliary malignancies and their most intimate environment—bile.

In patients with benign pancreaticobiliary diseases, a recent study evaluated the microbial communities in bile of patients with primary sclerosing cholangitis (PSC) to suggest the prevalence of *Prevotella*, *Streptococcus*, *Veillonella*, *Fusobacterium*, and *Haemophilus* in the biliary tract and the pathogenic role of *Streptococcus* in disease progression [15]. Both culture-dependent and independent techniques in the past have demonstrated the presence of a microbial community in the human gallbladder and the bile duct in some benign hepatobiliary diseases including acute cholecystitis and gallstones [16–20]. There remains a knowledge gap in our understanding of a “normal” biliary microbiome due to obvious ethical difficulties of obtaining bile from healthy individuals who do not have any hepatobiliary pathologies. A recent study that tried to address this by evaluating bile obtained from liver donors without any record of biliary or hepatic disorders showed abundance of sequences belonging to the family *Propionibacteriaceae* in healthy controls compared to patients with cholelithiasis who had abundance of sequences belong to the families *Bacteroides*, *Prevotellaceae*, and *Veillonellaceae* [21].

Studies from animal models and human beings in the past have suggested that the biliary tract might harbor an indigenous microbiome that might be well adapted to face the local environmental challenges of the biliary microecosystem [21, 22]. However, the question on how this microbiome responds to or contributes to the local inflammatory and neoplastic processes in the pancreaticobiliary tract is not quite fully understood. We conducted an extensive analysis of the bile collected from a series of patients with benign and malignant pancreaticobiliary diseases to identify and correlate the unique signatures of such microbiome to the underlying disease process.

Materials and methods

We enrolled 46 patients in this study approved by the Cleveland Clinic Institutional Review Board. All patients provided written informed consent. Bile samples were collected from the common bile duct during routine endoscopic retrograde cholangiopancreatography (ERCP).

DNA extraction

Total DNA was extracted from bile specimens using PowerViral RNA/DNA Isolation kit according to the manufacturer's protocol (Mo Bio Laboratories, Carlsbad, CA) with minor modifications. Bile specimens were centrifuged at 1500rpm for 10 minutes, and pellets were resuspended in 650 ul MoBio PV1 solution. Samples were then transferred to PowerViral glass bead tubes and warmed at 55° C for 10 minutes. Samples were homogenized using the Tissue-Lyser LT (Qiagen, Valencia, CA) at 25 Hz for 10 minutes and centrifuged at 13,000 x g for 1 minute, after which supernatants were transferred to a clean 2 ml collection tube with 150 uL of PV2 solution and incubated at 4° for 5 minutes. Lysates were centrifuged at 13,000 x g for 1 minute, and supernatants transferred to a clean 2.2 ml tube with 600 ul of PV3 and PV4 solutions and vortexed, after which 625 ul of supernatant was repeatedly loaded onto a spin filter and centrifuged at 13,000 x g for 1 minute until all supernatant was loaded onto the filter. 600 ul each of solutions PV5 and PV6 were added, with 1 minute of centrifugation after each, discarding flow-through; tubes were then centrifuged for 2 minutes before each spin filter basket was placed into a clean tube and DNA eluted in 100 ul of RNase-free water.

16S rRNA gene sequencing

Bacterial 16S rRNA gene amplification and library construction were performed according to the 16S Metagenomic Sequencing Library Preparation guide from Illumina (Forest City, CA) with minor modifications. All beads, tubes, and non-enzymatic reagents were treated with UV light for 60 minutes prior to use [23]. Briefly, total DNA was PCR-amplified using primers targeting the 16S V3 and V4 region (Illumina) under the following conditions: 95° C for 5 minutes, followed by 35 cycles of 95° C for 30 seconds, 56° C for 30 seconds, 72° C for 30 seconds, and a final extension of 72° C for 10 minutes [24]. The resulting 16S rDNA amplicons were run on a 1% agarose gel, size selected at 450–500 bp, and gel-purified using QIAquick Gel Purification kit (Qiagen, Valencia, CA). A second round of PCR was performed to add Nextera XT indices (Illumina) to purified amplicons. Indexed PCR products were purified with Ampure XP beads (Beckman Coulter, Inc., Brea, CA), and quantified with Qubit dsDNA system (ThermoFisher Scientific, Waltham, MA). Samples were then normalized and pooled into sequencing libraries at 20 nM then validated on a Bioanalyzer DNA 1000 chip (Agilent, Santa Clara, CA), and sequenced on the Illumina MiSeq with a V3 reagent kit at the Case Western Reserve University Genomics Core Facility.

Bioinformatics

After the sequencing, the paired-end sequences were processed with QIIME2 package (version 2019.7) [25]. For the subsequent downstream data analysis, we used the Bioconductor phyloseq [26], microbiomeSeq and mixMC [27] packages in R (version 3.6). Initial quality control was checked using fastqc followed by multiqc. The Diverse Amplification Denoise Algorithm (DADA2) pipeline within QIIME2 was used to trim the sequences, dereplicate, filter chimeric sequences and finally merge the paired end reads. DADA2 models corrects for amplification errors, which is more reliable than OTU construction methods. After the quality control visualization, 20bps were trimmed from the beginning of the reads and the reads were truncated to 240bps.

The feature table of amplicon sequence variants (ASV, which is the QIIME2 equivalent of operational taxonomic units [OTUs]), the phylogenetic tree and taxonomy files were constructed within QIIME2. Reads were classified against the SILVA database (silva-132-99-515-806-nb-classifier).

The output of the QIIME2 pipeline was converted to phyloseq object with Qiime2R package (). Phyloseq object was then further filtered and used for creating diversity plots using ggplot2 and with microbiomeSeq R package.

The main statistical approach we used in this study was mixMC, a multivariate analysis framework implemented in mixOmics R package for microbiome data analysis. mixMC helps in identifying OTU features discriminating between multiple groups of samples. mixMC handles compositional and sparse data, repeated-measures experiments and multiclass problems; it highlights important discriminative features, and it provides interpretable graphical outputs to better understand the microbial communities' contribution to each habitat.

mixMC framework includes unsupervised analyses to visualize diversity patterns with Principal Component Analysis (PCA) and supervised analyses to identify indicator species or determinant microbiota members characterizing differences between habitats or body sites using sparse Partial Least Square Discriminant Analysis, sPLS-DA algorithm.

To apply mixMC we processed data with following steps: a) to the whole data matrix an offset of 1 was added to deal with zeroes after centered log ratio transformation, (b) to remove features with low counts across all samples we prefiltered the raw count data, and (c) we applied a centered log-ratio transformation was to the data.

Results

Patient characteristics

A total of 46 patients were enrolled in the study. Of these 46 patients, 32 had cancer of the pancreaticobiliary system including pancreatic carcinoma (n = 25), cholangiocarcinoma (CCA, n = 6), and gallbladder carcinoma (n = 1). Remaining 14 patients were tumor-free volunteers who underwent routine ERCP for benign pancreaticobiliary diseases including acute and chronic pancreatitis, and gallstone disease. Clinical details are shown in [Table 1](#).

Microbiome profiling of benign versus malignant pancreaticobiliary disease

We explored the microbial signature of bile in patients with benign (controls) and malignant (cases) pancreaticobiliary conditions and compared the relative abundance of microbiota between these two groups. Microbial composition at the phylum level showed five dominant phyla in both cases and controls, namely, Firmicutes, Bacteroidetes, Proteobacteria,

Table 1. Overall characteristics of all patients.

Patients with malignant pancreaticobiliary diseases			Patients with benign pancreaticobiliary diseases		
	Description	Overall		Description	Overall
n		32	n		14
Patient age, median (range)		66 (37–82)	Patient age, median (range)		56.5 (34–82)
Patient sex, n (%)	Female	11 (34.4)	Patient sex, n (%)	Female	7 (50.0)
	Male	21 (65.6)		Male	7 (50.0)
Patient race, n (%)	Caucasian	28 (87.5)	Patient race, n (%)	Caucasian	13 (92.9)
	African American	3 (9.4)		African American	1 (7.1)
	American Indian/Native Alaskan	1 (3.1)		American Indian/Native Alaskan	0
Tumor type, n (%)	Pancreatic cancer	25 (78.1)	Disease type, n (%)	Acute pancreatitis	3 (21.4)
	Cholangiocarcinoma	6 (18.8)		Biliary stricture	1 (7.1)
	Gallbladder cancer	1 (3.1)		Cholelithiasis	2 (14.3)
Antineoplastic therapy, n (%)	No	19 (59.4)		Cholelithiasis	1 (7.1)
	Yes	13 (40.6)		Chronic pancreatitis	3 (21.4)
				Jaundice (dilated bile ducts)	2 (14.3)
				Primary sclerosing cholangitis	2 (14.3)
Exposed to antibiotics within the preceding 2 weeks of ERCP, n (%)	Yes	3 (9.4%)	Exposed to antibiotics within the preceding 2 weeks, n (%)	Yes	3 (21.4%)
Deranged Liver Function Tests within the preceding 2 weeks of ERCP, n (%)	Yes	28 (87.5%)	Deranged Liver Function Tests within the preceding 2 weeks, n (%)	Yes	8 (57.1%)

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Actinobacteria, and Fusobacteria. Relative abundance of these dominant phyla was similar in bile samples from patients with and without cancer of the pancreaticobiliary tract (Fig 1).

We then compared the richness and diversity of the microbial community in bile samples from both the cases and controls. Overall, there was no significant difference in alpha diversity by Richness, Fisher alpha, and Shannon indices, but significant difference in alpha diversity by Simpson and Pielou’s evenness indices (Fig 2). Furthermore, we used the multivariate

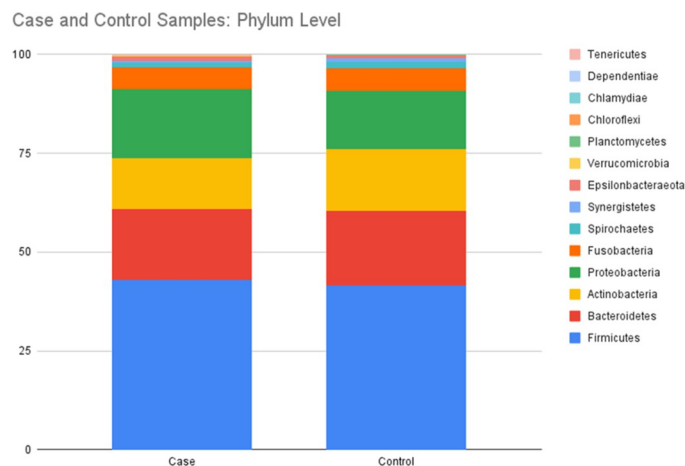


Fig 1. Relative abundance of dominant phyla in bile from patients with benign (control) and malignant (case) pancreaticobiliary diseases.

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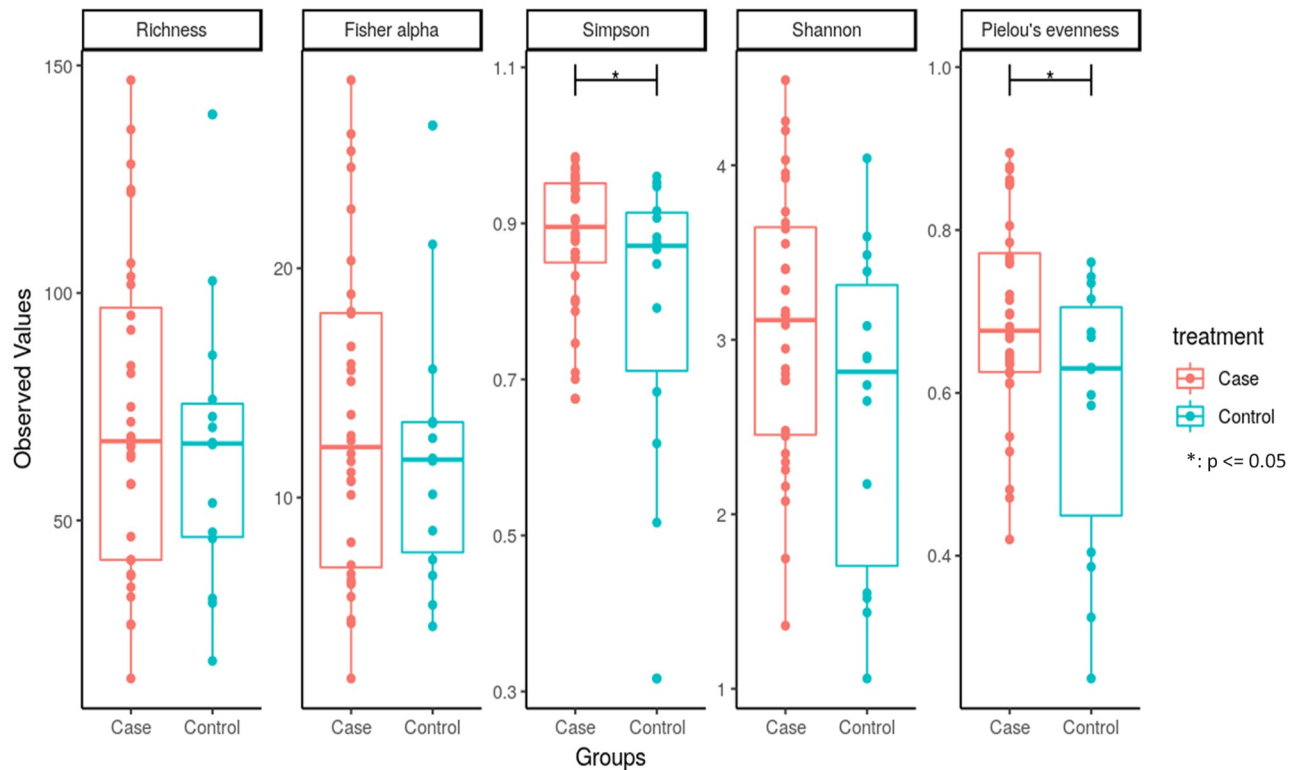


Fig 2. Alpha diversity of biliary microbiota in patients with benign vs malignant pancreaticobiliary diseases.

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approach sparse Partial Least Squares Discriminant Analysis (sPLS-DA) in mixMC to classify OTUs between the cases and controls by agglomerating the data to the Genus level (Figs 3 and 4). mixMC was able to distinctly cluster the data differentiating cases and controls. sPLS-DA showed the effect size of OTUs contributing to the differences between cases and controls (Fig 3). This showed a predominance of the genera *Dickeya* ($p = 0.00008$), *[Eubacterium] hallii* group ($p = 0.0004$), *Bacteroides* ($p = 0.0006$), *Faecalibacterium* ($p = 0.006$), *Escherichia-Shigella* ($p = 0.008$), and *Ruminococcus 1* ($p = 0.008$) in bile samples from pancreaticobiliary cancers compared to the group of benign pancreaticobiliary diseases (Fig 4).

Microbiome profiling in pancreatic adenocarcinoma versus cholangiocarcinoma

We explored the microbial signature of bile in patients with malignant pancreaticobiliary conditions with a focus to compare the relative abundance of microbiota between patients with pancreatic cancer (PC, $n = 25$) and cholangiocarcinoma (CCA, $n = 6$). Microbial composition at the phylum level showed five dominant phyla in both subgroups: Firmicutes, Bacteroidetes, Proteobacteria, Actinobacteria, and Fusobacteria. Relative abundance of Firmicutes (43.03% in PC vs 42.86% in CCA), Bacteroidetes (17.85% in PC vs 18.08% in CCA), Proteobacteria (17.5% in PC vs 14.87% in CCA), Actinobacteria (13.11% in PC vs 13.41% in CCA), and Fusobacteria (5.65% in PC vs 8.16% in CCA) was similar in bile samples from patients with pancreatic cancer and those with cholangiocarcinoma (Fig 5).

We compared the richness and diversity of the microbial community in bile samples from patients with pancreatic cancer, cholangiocarcinoma, and gallbladder cancer by examining

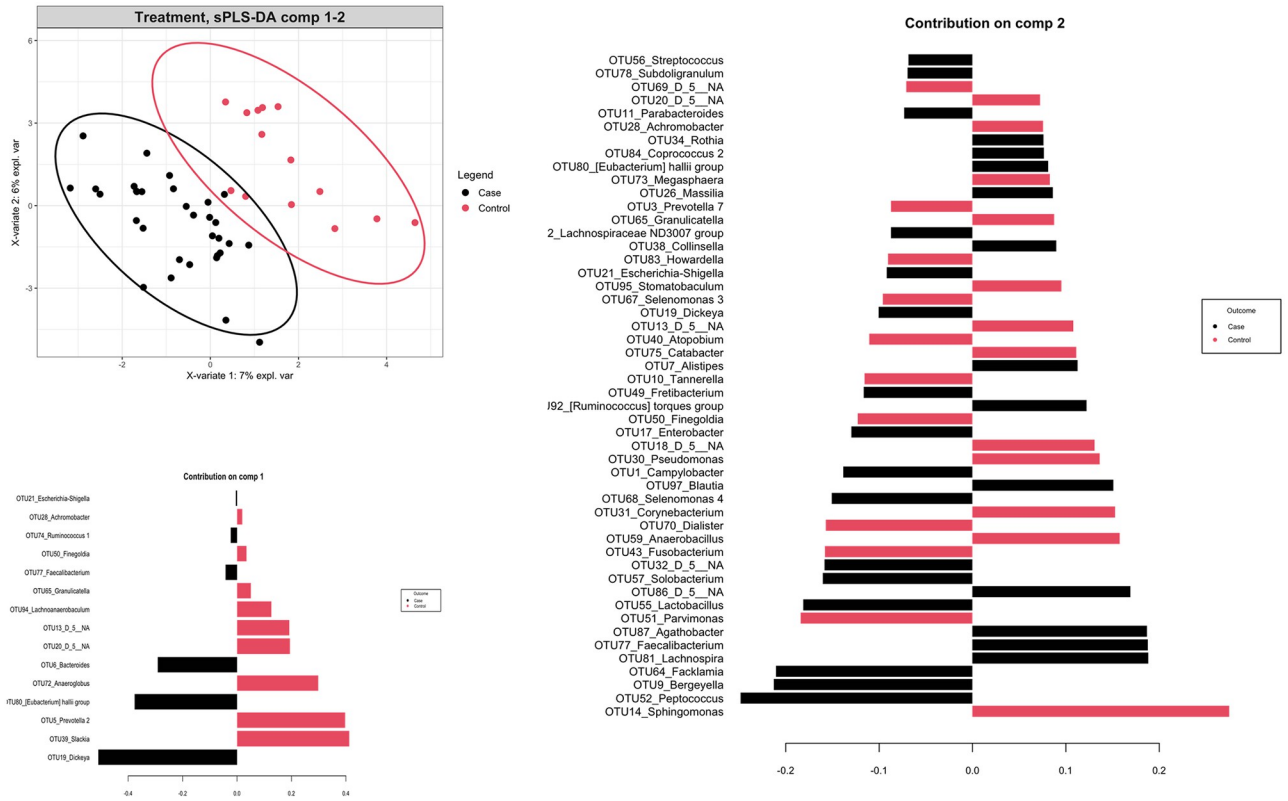


Fig 3. Multivariate analysis and diversity of biliary microbiota in patients with malignant (case) vs benign (control) pancreaticobiliary diseases using mixMC.

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alpha diversities. Overall, there was no significant difference in alpha diversity by Richness, Fisher alpha, Simpson, Shannon, and Pielou’s evenness indices (Fig 6). Furthermore, we used the multivariate approach sparse Partial Least Squares Discriminant Analysis (sPLS-DA) in mixMC to classify OTUs in bile samples between patients with pancreatic cancer and with cholangiocarcinoma by agglomerating the data to the Genus level. mixMC was able to identify the differentially abundant microbes between these two subgroups and sPLS-DA clearly separated the two subgroups (Fig 7). Using this analysis, bile samples from patients with pancreatic cancer compared to those with cholangiocarcinoma showed a predominance of genus *Rothia* ($p = 0.008$). Similarly, bile samples from patients with cholangiocarcinoma showed a predominance of genera *Akkermansia* ($p = 0.031$) and *Achromobacter* ($p = 0.031$) (Fig 8).

Discussion

Over the past decades, with the increase in next generation sequencing and bioinformatics-based studies investigating the relationship between microbiota and human diseases, we have arrived at an intersection of microbial mechanisms and previously established host-centric cancer hallmarks in our understanding of human cancer [28]. Indeed, an array of metabolites, genotoxins, and antigens derived from microbes influence host immunity, inflammation, energetics, cellular signaling, and metastasis [28]. The ease of obtaining non-invasive biological samples has expanded our understanding of fecal microbiome and its relation to cancer and response to antineoplastic therapies- particularly in gastrointestinal, skin, and lung cancers. Recently, organ-specific commensal microbiomes were revealed in the surveys of samples

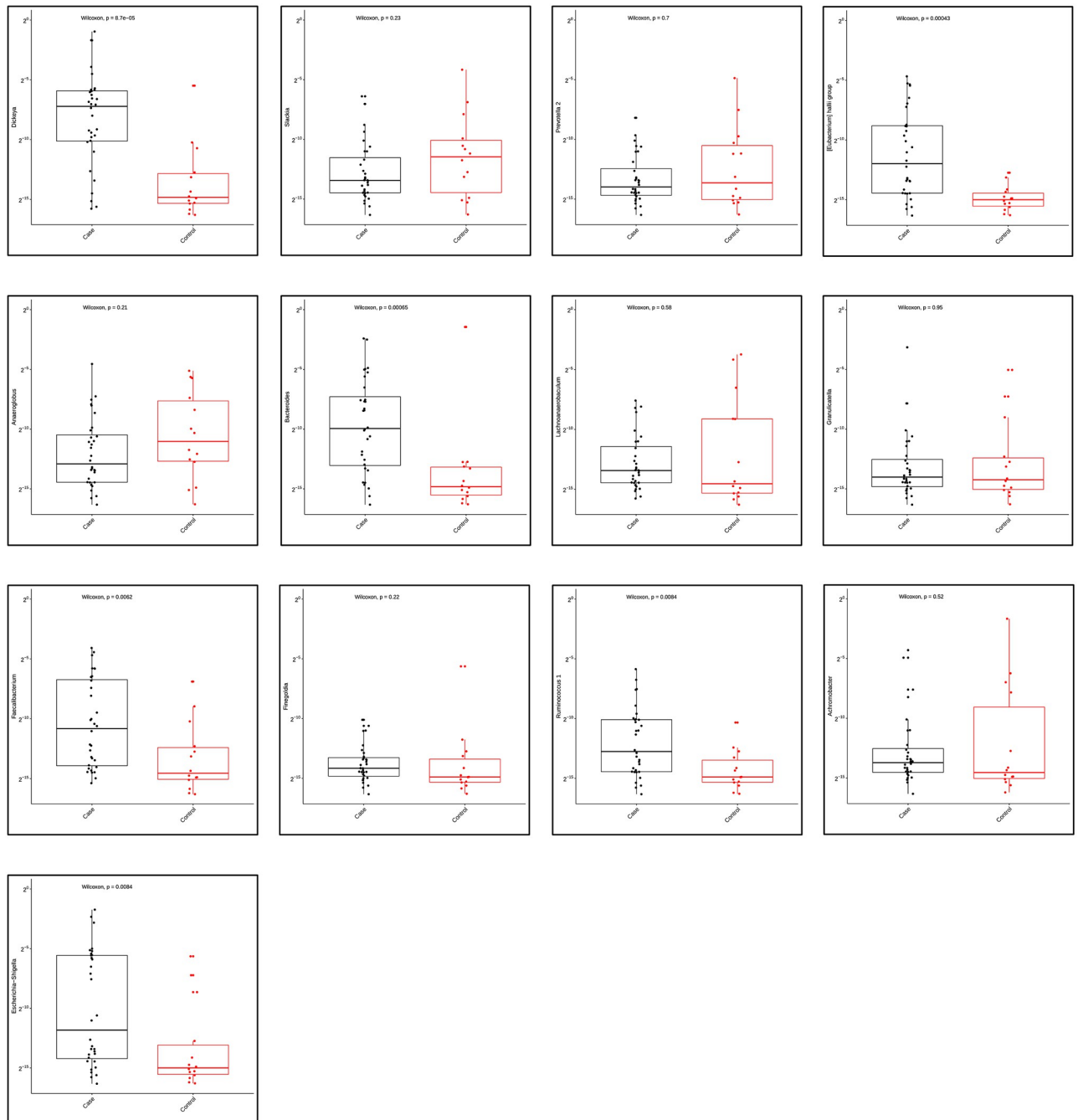


Fig 4. Mann Whitney-U test showing differential abundance of bacterial genera in bile from patients with malignant (case) and benign (control) pancreaticobiliary diseases.

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from non-mucosal sites like pancreas, breast, ovary, lung and skin [14]. Also, evolving literature in microbiomics includes recent evaluations of microbiomes in other liquid niches like bile- both in the benign and malignant cohorts. This has also added to the fundamental knowledge on the composition and activity of the biliary microbiome and its relationship with bile-related disorders [21]. Our pilot study suggests that distinct microbiome signatures in bile are

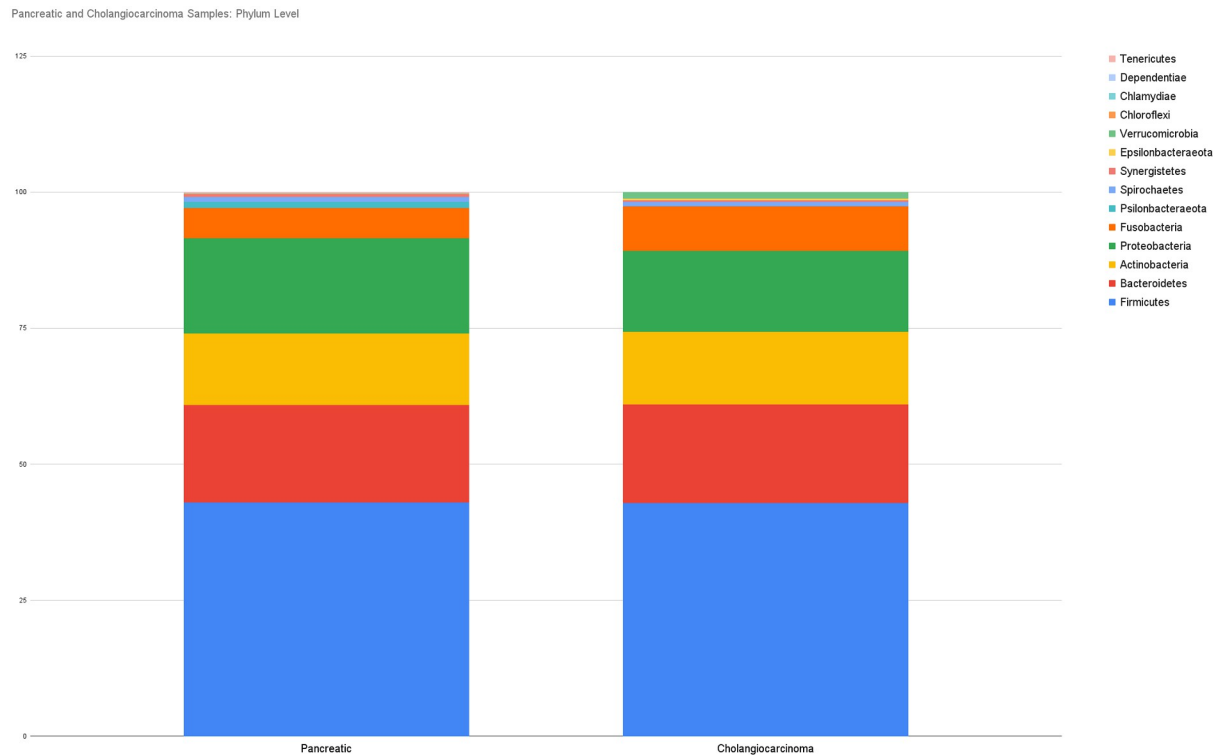


Fig 5. Relative abundance of dominant phyla in bile from patients with pancreatic cancer and cholangiocarcinoma.

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associated with benign and malignant pancreaticobiliary diseases. By using a targeted amplicon sequencing strategy for the 16S rRNA gene, this study demonstrates an underlying dysbiosis of the biliary microbiota among patients with different pancreaticobiliary diseases. Specifically, we found a difference in the relative abundance of OTUs in bile samples between patients with benign pancreaticobiliary diseases and pancreaticobiliary cancers, and between pancreatic cancers and cholangiocarcinomas.

The findings from this study fill an important knowledge gap and are timely for several reasons. First, this study confirms the growing body of evidence that high microbial diversity is present within the biliary milieu of patients with benign and malignant pancreaticobiliary conditions [29–31]. Second, this study shows a high dominance of phyla Firmicutes, Bacteroidetes, Proteobacteria, Actinobacteria and Fusobacteria in the biliary microenvironment and which are also parts of the intestinal microbiota. This is consistent with a recent analysis by del Castillo et. al. that showed the occurrence of these five major phyla in pancreatic tissue samples collected from both the cancer and non-cancer cohorts [13]. This finding correlates with a possibility that biliary microbiota could have their origin from the duodenum despite the sphincter of Oddi. Third, despite the lack of uniform difference in the alpha diversity of the microbial community in bile samples between patients with benign pancreaticobiliary diseases and pancreaticobiliary cancers, a multivariate analysis using mixMC showed a clear separation between these two subgroups. This leads to two hypotheses: that these OTUs may have a role in carcinogenesis, and/or that changes in the microenvironment of benign pancreaticobiliary diseases might differ from the changes in the microenvironment of pancreaticobiliary cancers leading to distinct separation of the OTU clusters. Also, it is not quite clear whether these microbes are cancer-causing oncomicrobes, complicit microbes or so-called innocent

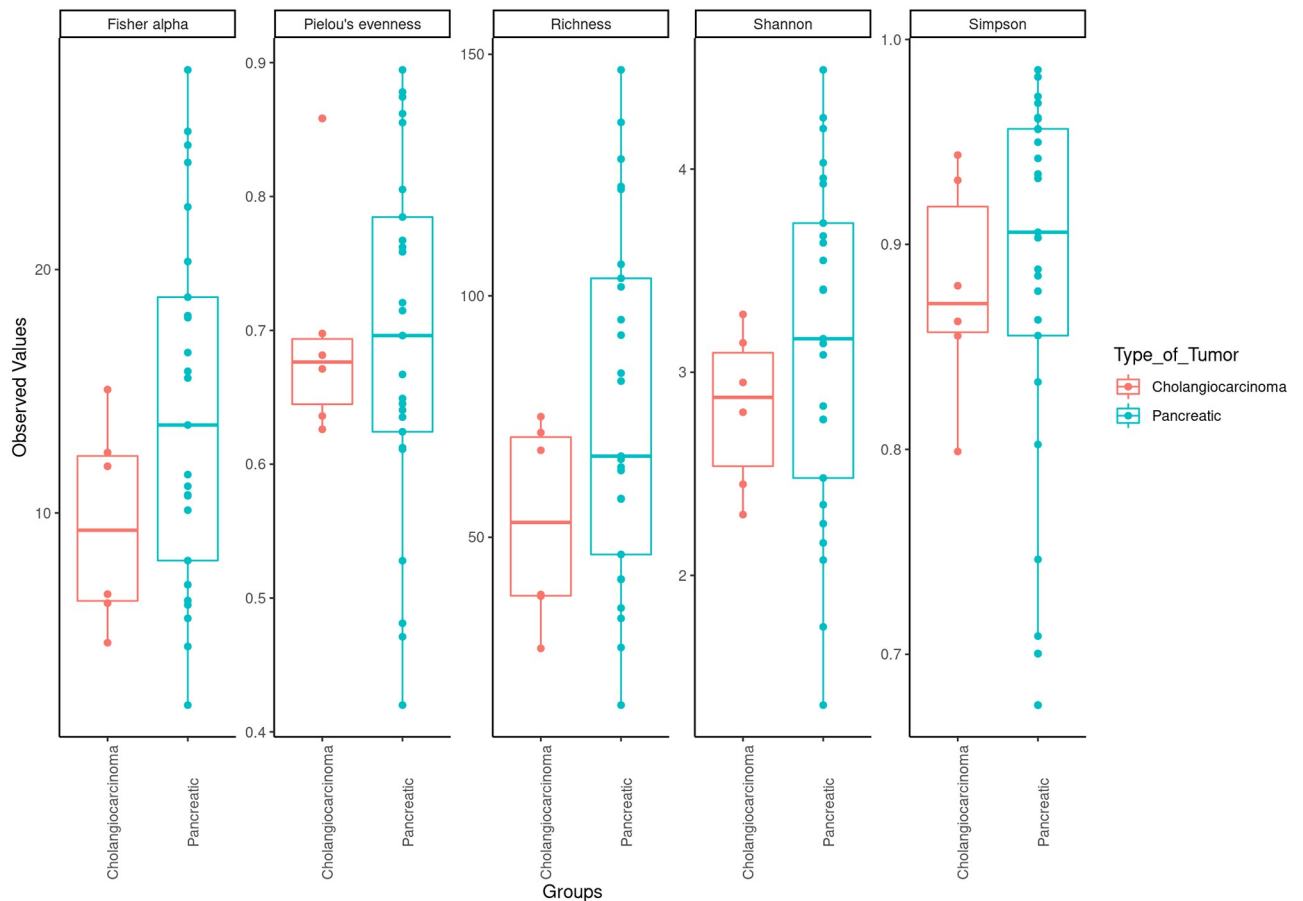


Fig 6. Alpha diversity of biliary microbiota in bile from patients with pancreatic cancer vs cholangiocarcinoma.

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bystanders. This observed differential abundance in microbiome raises a possibility that the difference could be due to the nature of the tumor itself by its influence on the gut-liver axis and further alteration of the bidirectional communication between the gastrointestinal tract and the liver via the biliary tract, portal vein and systemic circulation subsequently exposing biliary tract to the gastrointestinal microbiome [32]. Furthermore, this influence on the gut-liver axis might be different for pancreatic cancer which may cause local stasis of the bile through extramural compression of the common bile duct versus cholangiocarcinoma which may cause the stasis in bile flow through intramural obstruction of the common bile duct. A recent study based on mouse models demonstrated that the microbiome is more abundant in the malignant pancreas, as compared with normal controls, and may lead to immune tolerance and lack of response to immunotherapy [33]. In our study, at the genus level, *Dickeya*, [*Eubacterium*] *hallii* group, *Bacteroides*, *Faecalibacterium*, *Escherichia-Shigella*, and *Rumicoccus1* were significantly predominant in bile samples from patients with pancreaticobiliary cancers as compared to their benign counterparts. Fourth, in this study, multivariate analysis using mixMC clearly separated the microbial taxa at the genus level between patients with pancreatic cancer (increased abundance of *Rothia*) and those with cholangiocarcinoma (increased abundance of *Akkermansia* and *Achromobacter*). This is important because it adds to the growing literature on the microbiomic profile of bile with a focus on cancer. One recent study comparing bile specimens from 10 cholangiocarcinoma patients with 10 patients without malignancy,

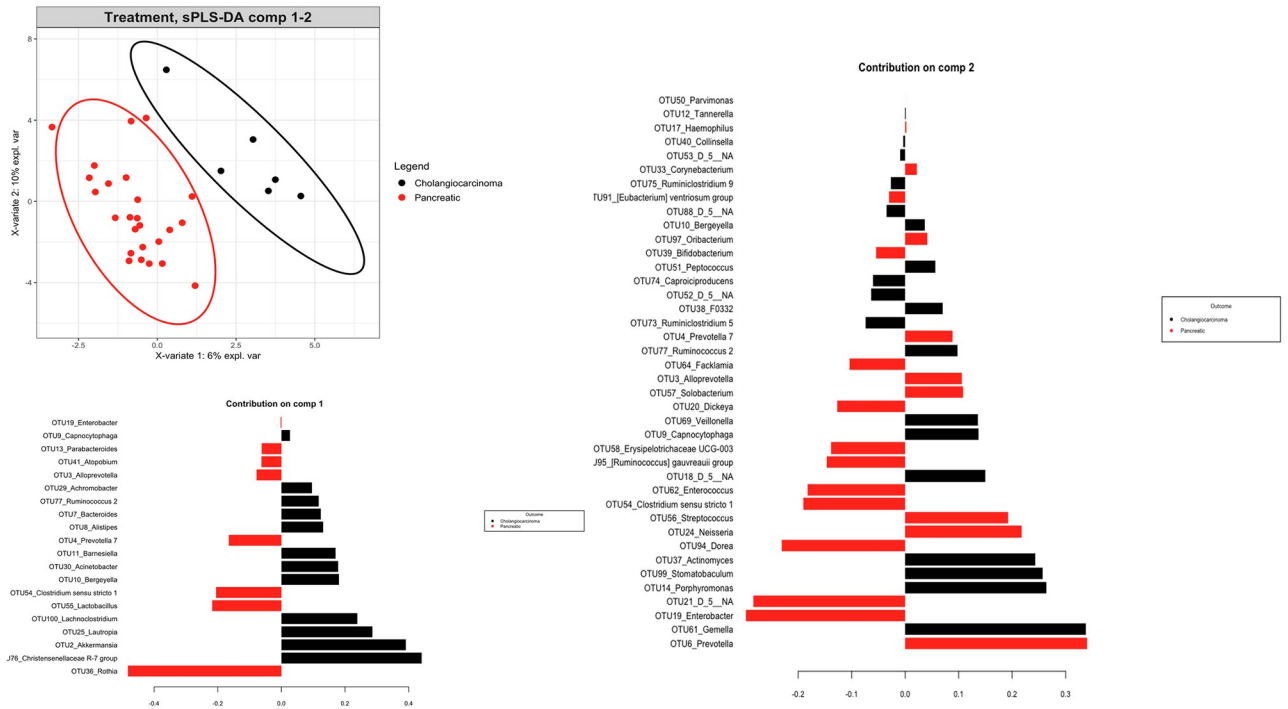


Fig 7. Multivariate analysis and diversity of biliary microbiota in patients with pancreatic cancer versus cholangiocarcinoma using mixMC.

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showed an abundance of *H. pylori* in cholangiocarcinoma samples [29]. In our study, *Helicobacter* species were not found to be abundant in cholangiocarcinoma samples. In another study, biliary duct tissue microbiome from liver fluke (*Opisthorchis viverrine*) associated cholangiocarcinoma patients showed significant increase in *Stenotrophomonas* species compared to non-cancer controls, however, this study looked into the microbiome of biliary duct tissue and not the bile *per se* [34].

Not only do our observations here add to the growing literature on microbiome associated with pancreaticobiliary neoplasia, but also importantly, this is one of the first clinical studies to evaluate bile microbiome in pancreaticobiliary diseases, with a focus on cancer. Prior studies have mostly evaluated salivary and gut microbiota in relationship to pancreaticobiliary cancers [10]. In one recent study that investigated bile microbiome in patients with pancreatic cancer, bacteria were detected in only 4 out of 7 bile samples, specifically *Enterobacter* and *Enterococcus* species [35]. *Neisseria* and *Porphyromonas* in oral microbiome have been associated with pancreatic cancer [36, 37] whereas in biliary cancer, there have been multiple reports of *Helicobacter* species with somewhat disparate findings [30]. The role of microbiome in response to immunotherapy for cancer is also being elucidated [7, 8, 38]. *Faecalibacterium*, *Collinsella* and *Enterococcus* species have been reported to be associated with improved response to immunotherapy when present in fecal microbiomes [7, 38]. In our study, *Faecalibacterium* was significantly present in pancreaticobiliary cancer patients when compared to patients with benign pancreaticobiliary diseases.

A strength of this study lies in the collection of specimens solely for the purpose of microbiome analysis and analyzing them to add to the growing body of literature on microbial profile of bile, with a focus on cancer. Moreover, this is the first study to investigate the differential presence and abundance of microbiome in bile in benign compared to malignant pancreaticobiliary diseases, and between pancreatic and biliary cancers.

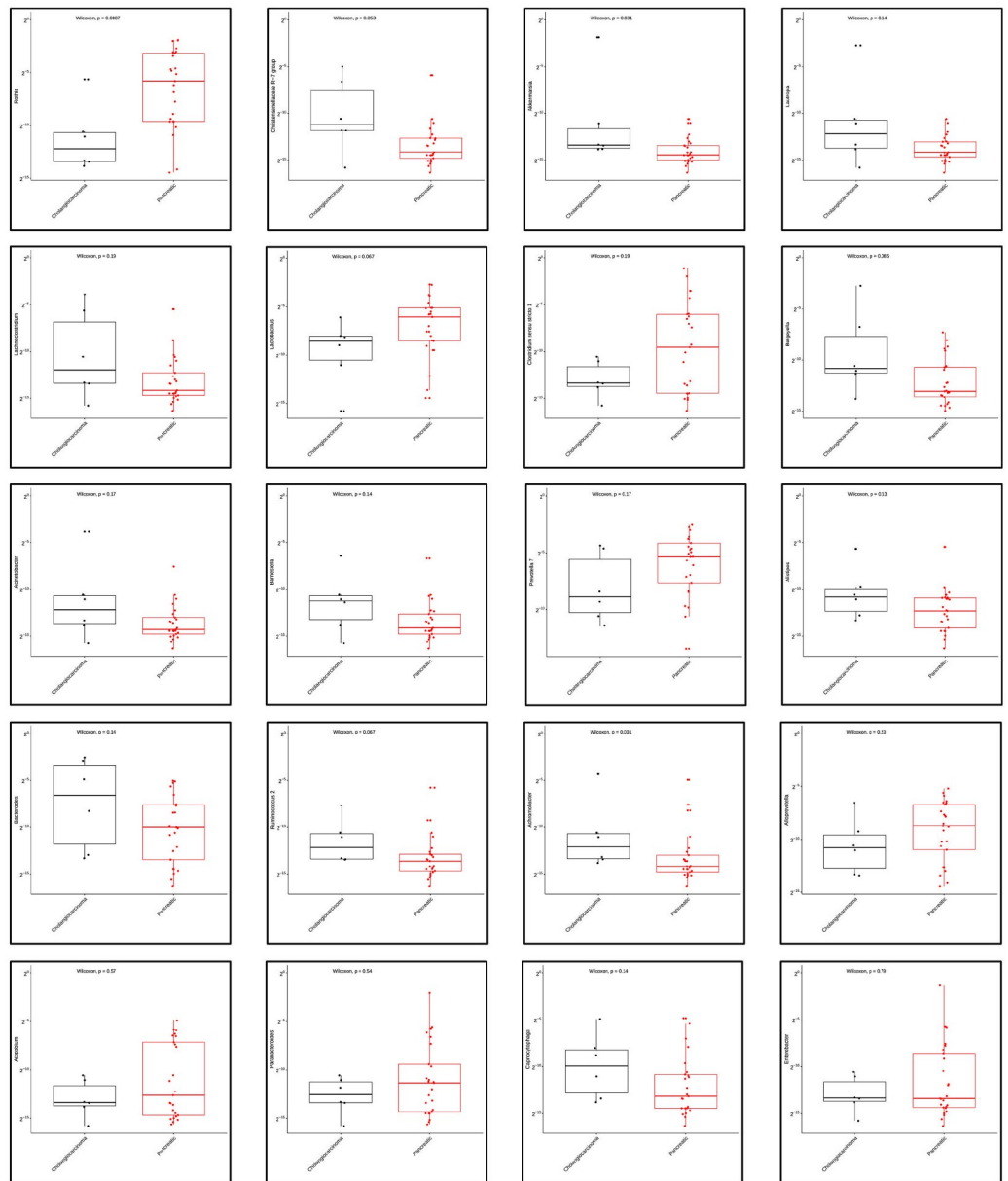


Fig 8. Mann Whitney-U test showing differential abundance of bacterial genera in bile from patients with pancreatic cancer vs cholangiocarcinoma.

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Our study has several limitations. First, because of the non-randomized nature of the study, our study provides room for the traditional confounders of selection bias. These include but are not limited to the differences in host factors like dietary habits, alcohol consumption, tumor markers and tumor stage, presence of viral hepatitis and liver cirrhosis. We acknowledge the influence that prebiotics, probiotics and antibiotics might have in the biliary microbiome, but although we do not have information on the use of pre- and pro-biotics, only 3 patients each in the benign and malignant pancreaticobiliary disease groups were exposed to antibiotics within the preceding two weeks of bile collection. Second, given the observational design of the study with one-time bile draw and no plan for subsequent bile

draws, we do not clearly understand the longitudinal effects of systemic antineoplastic therapies in the biliary microbiome. In a culture-dependent study from patients who had undergone pancreatoduodenectomy for pancreatic cancer, operative bile cultures showed an alteration of biliary microbiome in patients who had received neoadjuvant therapy with an increased likelihood of harboring enterococci and gram-negative bacteria [39]. We do not clearly understand the effect of antineoplastic therapy on the biliary microbiome from our study. Third, the relatively small sample sizes in both benign and malignant pancreaticobiliary subgroups precludes any firm conclusion in this study but do provide good preliminary foundational data. Fourth, this study suggests the presence of a biliary dysbiosis in patients with benign versus malignant pancreaticobiliary diseases and within pancreaticobiliary cancers but does not look into the possibility of dysbiosis in the bile of healthy people without any pancreaticobiliary disorders. This is due to the obvious ethical difficulty of obtaining bile through an invasive procedure like ERCP in healthy volunteers who do not have any pancreaticobiliary disorder, but it would still have added to our understanding on the evolution of pancreaticobiliary cancers if we could have profiled the biliary microbiome among healthy, those with benign diseases and those with cancers. Fifth, despite efforts to reduce contamination during collection of bile, the intervention itself could have introduced bacteria from patients' oral, gastric, and duodenal flora in the collected sample. And finally, given the cross-sectional nature of the study, this study only profiles the bacterial taxa in bile from cancer patients and non-cancer volunteers and does not establish causality by identifying carcinogenic and non-carcinogenic bacteria.

Conclusions

This clinical study demonstrates that microbiome analyses of bile may differentiate malignant from benign samples in pancreaticobiliary diseases. Furthermore, distinct microbiome signatures may be associated with pancreatic versus biliary cancers. Taken together, this study adds novel insights to the growing literature on the microbial composition of the biliary microbiota and could help provide a pilot bases for future large-scale studies by utilizing the bile microbiome and its role in human metabolism and health in the diagnosis and treatment of pancreaticobiliary diseases, with a focus on cancer.

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References

1. de Martel C, Ferlay J, Franceschi S, Vignat J, Bray F, Forman D, et al. Global burden of cancers attributable to infections in 2008: a review and synthetic analysis. *Lancet Oncol*. 2012 Jun; 13(6):607–15. [https://doi.org/10.1016/S1470-2045\(12\)70137-7](https://doi.org/10.1016/S1470-2045(12)70137-7) PMID: 22575588
2. Plummer M, de Martel C, Vignat J, Ferlay J, Bray F, Franceschi S. Global burden of cancers attributable to infections in 2012: a synthetic analysis. *Lancet Glob Heal*. 2016 Sep; 4(9):e609–16. [https://doi.org/10.1016/S2214-109X\(16\)30143-7](https://doi.org/10.1016/S2214-109X(16)30143-7) PMID: 27470177
3. Routy B, Gopalakrishnan V, Daillere R, Zitvogel L, Wargo JA, Kroemer G. The gut microbiota influences anticancer immunosurveillance and general health. *Nat Rev Clin Oncol*. 2018 Jun; 15(6):382–96. <https://doi.org/10.1038/s41571-018-0006-2> PMID: 29636538
4. Wong SH, Kwong TNY, Wu C-Y, Yu J. Clinical applications of gut microbiota in cancer biology. *Semin Cancer Biol*. 2019 Apr; 55:28–36. <https://doi.org/10.1016/j.semcancer.2018.05.003> PMID: 29782923
5. Gopalakrishnan V, Helmink BA, Spencer CN, Reuben A, Wargo JA. The Influence of the Gut Microbiome on Cancer, Immunity, and Cancer Immunotherapy. *Cancer Cell*. 2018 Apr; 33(4):570–80. <https://doi.org/10.1016/j.ccell.2018.03.015> PMID: 29634945
6. Dejea CM, Fathi P, Craig JM, Boleij A, Taddese R, Geis AL, et al. Patients with familial adenomatous polyposis harbor colonic biofilms containing tumorigenic bacteria. *Science*. 2018 Feb; 359(6375):592–7. <https://doi.org/10.1126/science.aah3648> PMID: 29420293
7. Gopalakrishnan V, Spencer CN, Nezi L, Reuben A, Andrews MC, Karpinets T V, et al. Gut microbiome modulates response to anti-PD-1 immunotherapy in melanoma patients. *Science*. 2018 Jan; 359(6371):97–103. <https://doi.org/10.1126/science.aan4236> PMID: 29097493
8. Routy B, Le Chatelier E, Derosa L, Duong CPM, Alou MT, Daillere R, et al. Gut microbiome influences efficacy of PD-1-based immunotherapy against epithelial tumors. *Science*. 2018 Jan; 359(6371):91–7. <https://doi.org/10.1126/science.aan3706> PMID: 29097494
9. Atreya CE, Turnbaugh PJ. Probing the tumor micro(b)environment. *Science* (80-) [Internet]. 2020 May 29; 368(6494):938 LP–939. Available from: <http://science.sciencemag.org/content/368/6494/938.abstract> PMID: 32467376
10. Mima K, Nakagawa S, Sawayama H, Ishimoto T, Imai K, Iwatsuki M, et al. The microbiome and hepatobiliary-pancreatic cancers. *Cancer Lett*. 2017 Aug; 402:9–15. <https://doi.org/10.1016/j.canlet.2017.05.001> PMID: 28527946
11. Thomas RM, Gharaibeh RZ, Gauthier J, Beveridge M, Pope JL, Guijarro M V, et al. Intestinal microbiota enhances pancreatic carcinogenesis in preclinical models. *Carcinogenesis*. 2018 Jul; 39(8):1068–78. <https://doi.org/10.1093/carcin/bgy073> PMID: 29846515
12. Rogers MB, Aveson V, Firek B, Yeh A, Brooks B, Brower-Sinning R, et al. Disturbances of the Perioperative Microbiome Across Multiple Body Sites in Patients Undergoing Pancreaticoduodenectomy. *Pancreas*. 2017 Feb; 46(2):260–7. <https://doi.org/10.1097/MPA.0000000000000726> PMID: 27846140
13. del Castillo E, Meier R, Chung M, Koestler DC, Chen T, Paster BJ, et al. The Microbiomes of Pancreatic and Duodenum Tissue Overlap and Are Highly Subject Specific but Differ between Pancreatic Cancer and Noncancer Subjects. *Cancer Epidemiol Biomarkers & Prev* [Internet]. 2019 Feb 1; 28(2):370 LP–383. Available from: <http://cebp.aacrjournals.org/content/28/2/370.abstract> PMID: 30373903

14. Nejman D, Liviyatan I, Fuks G, Gavert N, Zwang Y, Geller LT, et al. The human tumor microbiome is composed of tumor type-specific intracellular bacteria. *Science*. 2020 May; 368(6494):973–80. <https://doi.org/10.1126/science.aay9189> PMID: 32467386
15. Pereira P, Aho V, Arola J, Boyd S, Jokelainen K, Paulin L, et al. Bile microbiota in primary sclerosing cholangitis: Impact on disease progression and development of biliary dysplasia. *PLoS One* [Internet]. 2017 Aug 10; 12(8):e0182924–e0182924. Available from: <https://pubmed.ncbi.nlm.nih.gov/28796833> <https://doi.org/10.1371/journal.pone.0182924>
16. Vitetta L, Sali A, Moritz V, Shaw A, Carson P, Little P, et al. BACTERIA AND GALLSTONE NUCLEATION. *Aust N Z J Surg* [Internet]. 1989 Jul 1; 59(7):571–7. Available from: <https://doi.org/10.1111/j.1445-2197.1989.tb01633.x> PMID: 2546527
17. Stewart L, Griffiss JM, Jarvis GA, Way LW. Biliary bacterial factors determine the path of gallstone formation. *Am J Surg* [Internet]. 2006 Nov 1; 192(5):598–603. Available from: <https://doi.org/10.1016/j.amjsurg.2006.08.001> PMID: 17071191
18. Abeyasuriya V, Deen KI, Wijesuriya T, Salgado SS. Microbiology of gallbladder bile in uncomplicated symptomatic cholelithiasis. *Hepatobiliary Pancreat Dis Int*. 2008 Dec; 7(6):633–7. PMID: 19073410
19. Liu J, Yan Q, Luo F, Shang D, Wu D, Zhang H, et al. Acute cholecystitis associated with infection of Enterobacteriaceae from gut microbiota. *Clin Microbiol Infect Off Publ Eur Soc Clin Microbiol Infect Dis*. 2015 Sep; 21(9):851.e1–9. <https://doi.org/10.1016/j.cmi.2015.05.017> PMID: 26025761
20. Ye F, Shen H, Li Z, Meng F, Li L, Yang J, et al. Influence of the Biliary System on Biliary Bacteria Revealed by Bacterial Communities of the Human Biliary and Upper Digestive Tracts. *PLoS One* [Internet]. 2016 Mar 1; 11(3):e0150519. Available from: <https://doi.org/10.1371/journal.pone.0150519> PMID: 26930491
21. Molinero N, Ruiz L, Milani C, Gutiérrez-Díaz I, Sánchez B, Mangifesta M, et al. The human gallbladder microbiome is related to the physiological state and the biliary metabolic profile. *Microbiome* [Internet]. 2019; 7(1):100. Available from: <https://doi.org/10.1186/s40168-019-0712-8> PMID: 31272480
22. Jiménez E, Sánchez B, Farina A, Margolles A, Rodríguez JM. Characterization of the bile and gall bladder microbiota of healthy pigs. *Microbiologyopen* [Internet]. 2014 Dec 1; 3(6):937–49. Available from: <https://doi.org/10.1002/mbo3.218> PMID: 25336405
23. Albanese D, Fontana P, De Filippo C, Cavalieri D, Donati C. MICCA: a complete and accurate software for taxonomic profiling of metagenomic data. *Sci Rep* [Internet]. 2015; 5(1):9743. Available from: <https://doi.org/10.1038/srep09743> PMID: 25988396
24. Magoc T, Salzberg SL. FLASH: fast length adjustment of short reads to improve genome assemblies. *Bioinformatics*. 2011 Nov; 27(21):2957–63. <https://doi.org/10.1093/bioinformatics/btr507> PMID: 21903629
25. Bolyen E, Rideout JR, Dillon MR, Bokulich NA, Abnet CC, Al-Ghalith GA, et al. Reproducible, interactive, scalable and extensible microbiome data science using QIIME 2. Vol. 37, *Nature biotechnology*. United States; 2019. p. 852–7.
26. McMurdie PJ, Holmes S. phyloseq: an R package for reproducible interactive analysis and graphics of microbiome census data. *PLoS One*. 2013; 8(4):e61217. <https://doi.org/10.1371/journal.pone.0061217> PMID: 23630581
27. Le Cao K-A, Costello M-E, Lakis VA, Bartolo F, Chua X-Y, Brazeilles R, et al. MixMC: A Multivariate Statistical Framework to Gain Insight into Microbial Communities. *PLoS One*. 2016; 11(8):e0160169. <https://doi.org/10.1371/journal.pone.0160169> PMID: 27513472
28. Sepich-Poore GD, Zitvogel L, Straussman R, Hasty J, Wargo JA, Knight R. The microbiome and human cancer. *Science (80-)* [Internet]. 2021 Mar 26; 371(6536):eabc4552. Available from: <https://doi.org/10.1126/science.abc4552> PMID: 33766858
29. Aviles-Jimenez F, Guitron A, Segura-Lopez F, Mendez-Tenorio A, Iwai S, Hernandez-Guerrero A, et al. Microbiota studies in the bile duct strongly suggest a role for *Helicobacter pylori* in extrahepatic cholangiocarcinoma. *Clin Microbiol Infect*. 2016 Feb; 22(2):178.e11–178.e22. <https://doi.org/10.1016/j.cmi.2015.10.008> PMID: 26493848
30. Segura-Lopez FK, Guitron-Cantu A, Torres J. Association between *Helicobacter* spp. infections and hepatobiliary malignancies: a review. *World J Gastroenterol*. 2015 Feb; 21(5):1414–23. <https://doi.org/10.3748/wjg.v21.i5.1414> PMID: 25663761
31. Chen B, Fu SW, Lu L, Zhao H. A Preliminary Study of Biliary Microbiota in Patients with Bile Duct Stones or Distal Cholangiocarcinoma. Hu G, editor. *Biomed Res Int* [Internet]. 2019; 2019:1092563. Available from: <https://doi.org/10.1155/2019/1092563> PMID: 31662965
32. Tripathi A, Debelius J, Brenner DA, Karin M, Loomba R, Schnabl B, et al. The gut-liver axis and the intersection with the microbiome. *Nat Rev Gastroenterol Hepatol*. 2018 Jul; 15(7):397–411. <https://doi.org/10.1038/s41575-018-0011-z> PMID: 29748586

33. Pushalkar S, Hundeyin M, Daley D, Zambirinis CP, Kurz E, Mishra A, et al. The Pancreatic Cancer Microbiome Promotes Oncogenesis by Induction of Innate and Adaptive Immune Suppression. *Cancer Discov.* 2018 Apr; 8(4):403–16. <https://doi.org/10.1158/2159-8290.CD-17-1134> PMID: 29567829
34. Chng KR, Chan SH, Ng AHQ, Li C, Jusakul A, Bertrand D, et al. Tissue Microbiome Profiling Identifies an Enrichment of Specific Enteric Bacteria in *Opisthorchis viverrini* Associated Cholangiocarcinoma. *EBioMedicine* [Internet]. 2016; 8:195–202. Available from: <https://www.sciencedirect.com/science/article/pii/S2352396416301773> PMID: 27428430
35. Maekawa T, Fukaya R, Takamatsu S, Itoyama S, Fukuoka T, Yamada M, et al. Possible involvement of *Enterococcus* infection in the pathogenesis of chronic pancreatitis and cancer. *Biochem Biophys Res Commun.* 2018 Dec; 506(4):962–9. <https://doi.org/10.1016/j.bbrc.2018.10.169> PMID: 30401562
36. Farrell JJ, Zhang L, Zhou H, Chia D, Elashoff D, Akin D, et al. Variations of oral microbiota are associated with pancreatic diseases including pancreatic cancer. *Gut.* 2012 Apr; 61(4):582–8. <https://doi.org/10.1136/gutjnl-2011-300784> PMID: 21994333
37. Fan X, Alekseyenko A V, Wu J, Peters BA, Jacobs EJ, Gapstur SM, et al. Human oral microbiome and prospective risk for pancreatic cancer: a population-based nested case-control study. *Gut.* 2018 Jan; 67(1):120–7. <https://doi.org/10.1136/gutjnl-2016-312580> PMID: 27742762
38. Matson V, Fessler J, Bao R, Chongsuwat T, Zha Y, Alegre M-L, et al. The commensal microbiome is associated with anti-PD-1 efficacy in metastatic melanoma patients. *Science.* 2018 Jan; 359(6371):104–8. <https://doi.org/10.1126/science.aao3290> PMID: 29302014
39. Goel N, Nadler A, Reddy S, Hoffman JP, Pitt HA. Biliary microbiome in pancreatic cancer: alterations with neoadjuvant therapy. *HPB (Oxford).* 2019 Dec; 21(12):1753–60. <https://doi.org/10.1016/j.hpb.2019.04.005> PMID: 31101398