

Retrospective Cohort Study

Impact of preoperative antibiotics and other variables on integrated microbiome-host transcriptomic data generated from colorectal cancer resections

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Abstract**BACKGROUND**

Integrative multi-omic approaches have been increasingly applied to discovery and functional studies of complex human diseases. Short-term preoperative antibiotics have been adopted to reduce site infections in colorectal cancer (CRC)

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Data sharing statement: All de-multiplexed, paired-end 16S rRNA gene sequence files and RNA-sequence data along with associated metadata were deposited into the Gene Expression Omnibus, which is a public repository that archives and freely distributes comprehensive sets of microarray, next-generation sequencing, and other forms of high-throughput functional genomic data submitted by the scientific community data base under project accession number GSE165255. All the tissues analyzed were collected from patients that gave informed consent for sharing results of the analysis of their anonymized tissues on public databases, where the risk of identification is very low. The statistical code used in this study is available from the corresponding author at ellen.li@stonybrookmedicine.edu.

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resections. We hypothesize that the antibiotics will impact analysis of multi-omic datasets generated from resection samples to investigate biological CRC risk factors.

AIM

To assess the impact of preoperative antibiotics and other variables on integrated microbiome and human transcriptomic data generated from archived CRC resection samples.

METHODS

Genomic DNA (gDNA) and RNA were extracted from prospectively collected 51 pairs of frozen sporadic CRC tumor and adjacent non-tumor mucosal samples from 50 CRC patients archived at a single medical center from 2010-2020. The 16S rRNA gene sequencing (V3V4 region, paired end, 300 bp) and confirmatory quantitative polymerase chain reaction (qPCR) assays were conducted on gDNA. RNA sequencing (IPE, 125 bp) was performed on parallel tumor and non-tumor RNA samples with RNA Integrity Numbers scores ≥ 6 .

RESULTS

PERMANOVA detected significant effects of tumor *vs* nontumor histology ($P = 0.002$) and antibiotics ($P = 0.001$) on microbial β -diversity, but CRC tumor location (left *vs* right), diabetes mellitus *vs* not diabetic and Black/African Ancestry (AA) *vs* not Black/AA, did not reach significance. Linear mixed models detected significant tumor *vs* nontumor histology*antibiotics interaction terms for 14 genus level taxa. QPCR confirmed increased *Fusobacterium* abundance in tumor *vs* nontumor groups, and detected significantly reduced bacterial load in the (+)antibiotics group. Principal coordinate analysis of the transcriptomic data showed a clear separation between tumor and nontumor samples. Differentially expressed genes obtained from separate analyses of tumor and nontumor samples, are presented for the antibiotics, CRC location, diabetes and Black/AA race groups.

CONCLUSION

Recent adoption of additional preoperative antibiotics as standard of care, has a measurable impact on -omics analysis of resected specimens. This study still confirmed increased *Fusobacterium nucleatum* in tumor.

Key Words: Colorectal cancer; Antibiotics; African Continental Ancestry Group; Diabetes mellitus; 16S rRNA gene; RNA-sequencing

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Core Tip: This pilot study explored the effect of five variables [tumor histology, preoperative antibiotics, laterality of colorectal cancer (CRC) location, diabetes mellitus, Black/African Ancestry (AA) race] on analysis of microbiome and host transcriptome among archived frozen CRC resection samples. The introduction of short-term preoperative antibiotics as standard of care has a measurable effect on the analysis. Despite the small sample size and variable exposure to preoperative antibiotics, it was still possible to use the data for discovery studies. *Fusobacterium* abundance was increased in tumor *vs* nontumor regions. Expression of VBP1 was decreased in expression in both Black/AA tumor and nontumor samples.

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INTRODUCTION

Imbalances in mucosal associated microbiota (dysbiosis) have been reported in human colorectal cancer (CRC)^[1]. The increased risk of CRC in patients with inflammatory bowel diseases and in animal models of intestinal inflammation support the concept that bacteria promoting colonic inflammation may be proto-oncogenic^[2]. According to the driver and passenger hypothesis, there are key pathogens that can drive tumorigenesis and support other bacteria as passengers to proliferate and exacerbate disease in sporadic CRC^[3]. Similarly, the keystone hypothesis states that certain low abundance pathogens can promote inflammation by altering a normal microbiota into a dysbiotic one^[4]. There are certain pathogens that are associated with CRC including increased abundances of *Peptostreptococcus*, *Bacteroides fragilis*, *Fusobacterium nucleatum* (*F. nucleatum*), and *Escherichia coli* and decreased abundances of *Clostridium*, *Bifidobacterium*, *Faecalibacterium* and *Roseburia*^[1-6]. The potential mechanisms at which these particular bacteria may affect the adenoma-carcinoma sequence, include gene expression alternations, promotion of chronic inflammation and release of carcinogenic metabolites^[1-6]. The approach of collecting and integrating multi-omic host and microbiome data has been increasingly applied to discovery and functional studies of human gastrointestinal diseases^[7,8]. In an ongoing multi-omic analysis of archived frozen mucosal samples of tumor and adjacent nontumor regions of CRC surgical resection specimens (2010-2020), we discovered that a major change was made in the preoperative antibiotic protocol as of January 2017. Prior to that time, the standard of care was to administer only intravenous antibiotics within 30 min of incision, and only a few CRC resection patients were placed on short-term oral antibiotics within a month of the surgery, for various clinical indications. However, after this time, the standard operating protocol for preoperative antibiotics was to prescribe outpatient oral neomycin and metronidazole 24 h in advance of the procedure, in order to reduce surgical site infections^[9-11]. The use of antibiotics can shift the microbiome depending on the dosage and duration of the antibiotic exposure. Several studies have shown that tumorigenesis and tumor growth can be attenuated with different antibiotic cocktails and timing of antibiotic exposure with duration of inflammation. On the other hand, early exposure to antibiotics increased risk of CRC and interfered with chemotherapy efficacies due to microbial dysbiosis^[5]. With these conflicting findings and this change in protocol at our institution, it allowed us to examine how differential use of antibiotics, along with other clinical/demographic factors influences integrative, multi-omic analyses of CRC.

The five following variables were included in the analysis of the microbiome and host transcriptome datasets generated in this pilot study: (1) Tumor histology (tumor *vs* nontumor); (2) Preoperative antibiotics (yes/no); (3) Laterality of CRC location (left *vs* right); (4) Diabetes mellitus (yes/no); and (5) Black/African Ancestry (AA) race (yes/no). The rationale for comparing tumor *vs* nontumor histology is based on multiple previous reports of differences between tumor and nontumor regions of CRC resection specimens^[1,12,13]. Since antibiotics clearly have an effect on the human microbiome^[14], it was crucial to assess the impact of the change in antibiotic protocol on the metagenomic and transcriptomic data, before making the commitment to expand the pilot study by analyzing more CRC resection samples. Because molecular differences have been previously reported right sided and left sided CRCs^[15], laterality of CRC location was included in the analysis.

The original targets of this pilot discovery and functional study were two biological CRC risk factors: (1) Diabetes mellitus; and (2) Black/AA race. Diabetes mellitus has been associated with increased CRC risk and poorer survival^[16,17], and has been implicated in CRC pathogenesis^[18]. Several studies have described alterations in the fecal microbiome of patients with diabetes mellitus compared to those without diabetes mellitus in the absence of a CRC diagnosis^[19-21]. Transcriptomic profiling of CRC resection tumor and adjacent nontumor samples suggested evidence of diabetic "field cancerization" of the nontumor region^[22].

CRC incidence and mortality has been persistently higher in Black/AA compared to all other races in the United States^[23,24]. Paredes *et al*^[25] recently reported that transcriptomic profiling of Black/AA compared to White/European Ancestry (EA) revealed reduced immune related gene expression in tumor samples and plasma cytokine levels collected from Black/AA CRC patients. We report here the results of this pilot study to investigate the effects of the tumor histology, preoperative antibiotics, laterality of CRC location, diabetes mellitus status and Black/AA race on microbiome and human transcriptomic data of CRC patients.

MATERIALS AND METHODS

Patient samples

Sequencing analysis of 51 pairs of tumor and nontumor frozen mucosal samples collected from 50 treatment-naïve sporadic CRC subjects (excluding samples collected after neoadjuvant therapy), archived in the Stony Brook Cancer Center Tissue Analytics Shared Resource, was approved by the Stony Brook Institutional Review Board (IRB, IRB2019-00682) and by the Cold Spring Harbor Laboratory IRB (IRB 1467912). All the archived samples were collected prospectively from CRC patients scheduled between 2010-2020 for surgical resection for clinical care, who had given their informed consent for banking of surgical remnant for possible genomic sequencing, collection of longitudinal clinical metadata and access to clinical formalin-fixed paraffin embedded (FFPE) tissues for possible genomic sequencing under a protocol approved by the Stony Brook University IRB (No. 163184). CRC samples collected from individuals diagnosed with hereditary CRC syndromes or inflammatory bowel diseases and individuals who received neoadjuvant treatment, were excluded from this analysis. The clinical metadata included age at the time of tissue collection, self-identified race and ethnicity, family history of a first degree relative with CRC, tumor location (right, cecum-transverse colon; left, splenic flexure-rectum), pathologic cancer stage, smoking status (current, past, never), body mass index, diabetes mellitus status, preoperative antibiotics within a month of surgery (yes/no), cancer stage (0, 1, 2, 3, 4). Participants who enrolled in the study after 2017 were automatically assumed to be exposed to preoperative antibiotics as the new protocol prescribes oral neomycin (1 g × 3 doses) and metronidazole (500 mg × 3 doses) to the patient 24 h prior to surgery. DNA and RNA were extracted from the archived frozen tissues using the Qiagen Allprep DNA/RNA/miRNA kits (Qiagen, Hilden, Germany) according to the manufacturer's protocol. DNA and RNA were extracted from 5 µm sections of FFPE tumor and non-tumor samples using the Qiagen Allprep DNA/RNA FFPE (Qiagen, Hilden, Germany) kits according to the manufacturer's protocol except that xylene was used to de-paraffinize the FFPE samples.

16S rRNA gene sequencing

The 16S rRNA libraries were constructed by generating broad-range polymerase chain reaction (PCR) amplicons using barcoded primers that target the V3V4 variable region of the 16S rRNA gene: Primers 338F (5'-ACTCCTACGGGAGGCAGCAG-3') and 806R (5'-GGACTACHVGGGTWTCTAAT-3'), as previously described from 51 paired tumor and nontumor DNA samples^[22]. Illumina paired-end sequencing was performed on the Miseq platform with versions v2.4 of the Miseq Control Software and of MiSeq Reporter, using a 600-cycle version 3 reagent kit. Illumina Miseq paired-end reads were aligned to human reference genome hg19 with bowtie2 and matching sequences were discarded as previously described^[25]. All de-multiplexed, paired-end 16S rRNA gene sequence files along with associated metadata were deposited into the Gene Expression Omnibus under project accession number GSE165255. The paired end reads were assembled, aligned and classified using the SINA/SILVA classifier as previously described^[26-28]. Operational taxonomic units (OTUs) were produced by binning sequences with identical taxonomic assignments.

Taqman quantitative PCR analysis of mucosal genomic DNA

Real time Taqman PCR analyses were conducted using established specific primers and probe for the *F. nucleatum* nusG gene^[29,30] and broad range primers and probe bacterial 16S rRNA gene^[31] shown in Table 1. The Taqman primers and probe for the human solute carrier family 21 or *SLCO2A1* also termed prostaglandin cotransporter or *PGT* gene^[29], a single copy autosomal gene located on human chromosome 3, were from Taqman assay ID Hs00194554_m1 (Thermo Fisher Scientific, Waltham, MA, United States). The probes and primers were custom ordered as two separate Taqman assay kits (Thermo Fisher Scientific, Waltham, MA, United States). The first kit combined the *F. nucleatum* NUS gene assay (FAM probe) with the total bacterial 16S rRNA gene assay (VIC probe). The second kit combined the *F. nucleatum* nus gene (FAM probe) with the human *SLCO2A1* gene assay (VIC probe). The PCR assays were carried out in triplicate with 80 ng of sample DNA in 20 µL in each well. The thermal conditions were 10 min at 95 °C and 45 cycles of 15 s at 95 °C and 1 min at 60 °C. *F. nucleatum* subsp. *nucleatum* Knorr ATCC 25586 genomic DNA (gDNA) purchased from ATCC (Manassas, VA, United States) and a gene block was synthesized using the predicted PCR amplicon from the *F. nucleatum* subsp. *animalis* 4_8 genome reference

Table 1 Specific Taqman polymerase chain reaction primer and probe sequences for the *Fusobacterium nucleatum* nusG gene and broad range Taqman primer and probe sequences for the bacterial 16S rRNA gene

Target gene	Sequence
<i>F. nucleatum</i> nusG gene forward primer ^[29]	5'-CAACCATTACTTTAACTCTACCATGTTCA-3'
<i>F. nucleatum</i> nusG gene reverse primer ^[29]	5'-GTTGACTTTACAGAAGGAGATTATGTAAAAATC-3'
<i>F. nucleatum</i> nusG gene probe ^[30]	5'-TCAGCAACTTGTCTCTTGTATCTTTAAATGAACC-3'
Broad range 16S rRNA gene forward primer ^[31]	5'-TCCTACGGGAGGCAGCAGT-3'
Broad range 16S rRNA gene reverse primer ^[31]	5'-GGACTACCAGGGTATCTAATCCTGTT-3'
Broad range 16S rRNA gene probe ^[31]	5'-CGTATTACCGCGGCTGCTGGCAC-3'

F. nucleatum: *Fusobacterium nucleatum*.

sequence for the Human Microbiome Project (Assembly: GCA_000400875, Integrated DNA Technologies, Coralville, IA, United States) were used as positive controls. The 80 hg of DNA template was used in each 20 μ L reaction and with either *F. nucleatum* (FAM probe)/*SLCO2A1* (VIC probe) or the *F. nucleatum* (FAM probe) broad-range 16S rRNA gene (VIC probe) in triplicate.

RNA sequence analysis

RNA-sequencing was conducted on a subset of tumor and nontumor RNA samples with RIN scores ≥ 6 at the CSHL Cancer Center Sequencing Technologies and Analysis Shared Resource and unpaired tumor RNA samples at the New York Genome Center. At both sequencing centers, the RNA sequence libraries were prepared with the Kapa RNA kit with RiboErase (Roche Sequencing and Life Science Kapa Biosystems, Wilmington, MA, United States) according to the manufacturer's protocol and Illumina 125 bp PE sequencing was conducted on HiSeq2500 instruments with a targeted depth of 20 million. The sequences were aligned using Salmon in Patro *et al*^[32]. The sequences were deposited in NCBI's Gene Expression Omnibus database with accession number GSE165255.

Statistical analysis

Statistical analysis was performed utilizing the Biostatistics and Bioinformatics Shared Resource at the Stony Brook University Cancer Center. Patient demographics were compared between the subset of samples analyzed and the total set of samples archived in the Stony Brook Cancer Center Tissue Analytics Shared Resource (2010-2020) using either Wilcoxon rank sum test for continuous variables, and chi-square test using GraphPad Prism. Alpha diversity indices [*e.g.*, Sobs, Shannon complexity (H), Shannon Evenness (H/Hmax)] were calculated on samples yielding a total OTU count inferred through 1000 replicate resamplings using Explicet^[33]. Linear mixed models were used to compare alpha-diversity (Sobs, ShannonH, ShannonE) between different groups of histology, antibiotics, location, diabetes and Black/AA race. Log-transformation was applied if the normality assumption was not satisfied. Compound symmetry (CS) covariance structure was utilized to model the correlation among measurements from the same patient. β -diversity was assessed by calculating distance matrices based on the Morisita-Horn dissimilarity index and visualized by principal coordinate analysis (PCoA). A PERMANOVA analysis^[34] was performed to assess the statistical significance of differences in β -diversity with the following five variables: (1) Tumor histology (tumor/nontumor); (2) Pre-operative antibiotics (yes/no); (3) Anatomic location (left/right); (4) Diabetes mellitus (yes/no); and (5) Black/AA race (yes/no). These analyses were conducted using the vegan 2.56 package of R 3.6.1, and the default setting for number of permutations ($n = 999$). To compare relative abundance of each OTU between tumor *vs* nontumor, generalized linear mixed model (GLMM) or generalized estimating equation (GEE) models were used by using the actual counts of each OTU as the outcomes, which were assumed to follow a negative binomial distribution^[26]. CS covariance structure was utilized to model the correlation among measurements from the same patient. The log overall count for each individual in each group was considered as an offset in order to normalize for differences in sequencing depth of coverage. When models had a fitting issue because of excessive 0 counts, all sample's counts+1 were used as the outcome and log (overall count+1) was used as the offset. The two-way interaction term between tumor histology

(tumor/nontumor) and preoperative antibiotics (yes/no) was first added in each model to estimate the difference between tumor *vs* normal within patients with or without pre-operative antibiotics. For OTUs that had model fitting difficulty and OTUs with non-significant interaction, the two-way interaction term was removed and the aforementioned models were fit again. Univariate linear mixed models were used to estimate the coefficient of correlation and the *P* values for the log transformed relative abundances of selected OTUs. The *P* values were based on the *t*-test for GLMM and the *Z*-test for GEE. The Bonferroni adjusted *P* values < 0.05 were considered as statistically significant. These analyses were performed using SAS 9.4 (SAS Institute Inc., Cary, NC, United States).

Differentially expressed genes (DEGs) (\log_2 fold change ≥ 1 , adjusted *P* value < 0.05) were identified using DESeq2^[35] for the five groups: (1) Tumor histology (tumor *vs* nontumor); (2) Preoperative antibiotics within a month of the surgery (yes/no); (3) Anatomic location of the CRC and adjacent nontumor region (left *vs* right); (4) Diabetes mellitus status (yes/no); and (5) Black/AA self-declared race (yes/no). For the latter four variables, the tumor and nontumor samples were analyzed separately. The DEG lists were also deposited in NCBI's Gene Expression Omnibus database with accession number GSE165255.

RESULTS

Patient characteristics of samples analyzed

The characteristics of the patients for the subset of samples analyzed compared to that of the total collection of archived sporadic CRC samples (2010-2020) are shown in [Table 2](#). Since the samples in the subset were originally selected to provide Black/AA samples and “matched” White/EA samples for another transcriptomic profiling performed at a separate sequencing facility^[25], there was significantly higher representation of Black/AA samples in this pilot study. Left-sided CRCs were also more highly represented in the subset compared to the overall collection. Because most of the subset samples were collected prior to January 2017, (when the protocol adding preoperative oral antibiotic prophylaxis was first introduced), there was a lower representation of samples collected from patients who had preoperative antibiotic treatment compared to the total sample collection. Of the 18 diabetic patients, only one had type 1 diabetes mellitus and the remaining 17 patients were diagnosed with type 2 diabetes mellitus.

Colonic mucosal microbiome analysis

We generated 5706758 16S rRNA gene sequences from 51 pairs of CRC tumor and nontumor samples. After excluding sequence libraries with total counts < 1000, the remaining 89 sequence libraries (41 tumor, 48 nontumor, 26 preoperative antibiotics, 63 no preoperative antibiotics, 55 left, 34 right, 32 diabetic, 57 not diabetic, 21 Black/AA, 68 not Black/AA) had an average sequencing depth of 64752 (minimum 1032; maximum 248838). As shown in [Table 3](#), no significant differences were detected in any of the three alpha diversity indices between the following five groups: (1) Preoperative antibiotics (yes/no); (2) Tumor *vs* nontumor histology; (3) Anatomic location of sample (left *vs* right); (4) Diabetes mellitus status (yes/no), and (5) Black/AA race *vs* not Black/AA race. Exploratory PERMANOVA using the Morasita Horn index for β -diversity was performed with the same five groups (see [Table 4](#)). Tumor histology and preoperative antibiotics demonstrated significant *F* statistics, but anatomic location, diabetes and Black/AA race did not reach significance. The PCoA comparisons using these indices for these five groups are displayed in [Figure 1](#).

Because PERMANOVA identified tumor histology and preoperative antibiotics as significant, fitted linear mixed models were used to measure the effect of preoperative antibiotics and tumor histology along with first order preoperative antibiotics*tumor histology interactions on the relative abundances of individual genus-level taxa. For this analysis, we included those OTUs with average relative abundances greater than 0.001% and that were observed in at least 25% of the samples. Because of model convergence issues, 4 OTUs (*Firmicutes/Eubacterium*, *Firmicutes/Acidaminococcus*, *Proteobacteria/Neisseriaceae*, *Proteobacteria/Desulfovibrio*) were also excluded because of failure of their models to converge. Of the 106 OTUs included in the relative abundance regression analysis, 14 exhibited significant first order tumor histology*preoperative antibiotics interaction terms (see [Table 5](#)). The estimated differences in tumor *vs* nontumor samples were analyzed separately for those 14 OTUs depending on whether the patients were prescribed additional preoperative

Table 2 Comparison of patient characteristics between the subset of sporadic colorectal cancer samples analyzed with that of the total collection of archived samples in the Stony Brook Cancer Center Tissue Analytics Shared Resource (2010-2020)

	Subset analyzed, n = 51	Total collection, n = 190	P value
Age (yr) ± IQR	62 ± 20	65 ± 20	0.4329
Male sex (%)	30 (58.8)	115 (60.5)	0.8254
Race (%)			0.0295
White	38 (74.5)	163 (85.8)	
Black	11 (21.6)	14 (7.4)	
Asian	1 (2.0)	6 (3.2)	
Other	1 (1.9)	7 (3.7)	
Hispanic ethnicity (%)	6 (11.8)	22 (11.6)	0.9707
Family history 1 st degree relative (%)	7 (13.7)	34 (17.9)	0.4817
BMI (kg/m ²)	27.8 ± 8	28.2 ± 8	0.5683
Diabetes mellitus (%)	18 (35.3)	55 (28.9)	0.4853
Smoking (%)			0.1103
Current	7 (13.7)	10 (5.3)	
Past	21 (41.2)	88 (46.3)	
Never	23 (45.1)	92 (48.4)	
Anatomic location (%)			0.0210
Left	31 (60.8)	81 (42.6)	
Right	20 (39.2)	109 (57.4)	
Cancer stage (%)			0.4578
Stage 0	1 (2.0)	6 (3.2)	
Stage 1	9 (17.6)	27 (14.2)	
Stage 2	14 (27.4)	63 (33.2)	
Stage 3	25 (49.0)	75 (39.5)	
Stage 4	2 (3.9)	19 (15.8)	
Preoperative antibiotics (%)	16 (31.4)	91 (47.9)	0.0350

IQR: Inter-quartile range; BMI: Body mass index.

antibiotics. One of 14 OTUs, *Fusobacteria/Leptotrichia*, was associated with increased relative abundance in tumor *vs* nontumor, regardless of preoperative antibiotic exposure (adjusted $P < 0.0001$ after Bonferroni correction = unadjusted P value*28 with antibiotics, and adjusted $P = 0.01$ after Bonferroni correction with no antibiotics). Of the 92 OTUs without significant first order preoperative antibiotic*tumor histology interaction terms, 19 OTUs, including *Fusobacterium* spp. demonstrated significant differences in tumor *vs* nontumor samples with adjusted $P < 0.05$ after Bonferroni correction (see Table 6).

Taqman quantitative PCR confirmation of increased *F. nucleatum* relative abundance in tumor vs non-tumor samples

F. nucleatum (both subspecies *nucleatum* and subspecies *animalis*) were enumerated in tissues specimens by quantitative PCR (qPCR) of the *nusG* gene, while total bacterial load was assayed by broad-range 16S rRNA gene qPCR. The human *SLCOA2* gene was assayed in parallel in order to normalize results. QPCR assays were performed on 37 paired tumor/nontumor mucosal gDNA samples, (10 pairs, +preoperative antibiotics; 27 pairs, -preoperative antibiotics). DNA samples were depleted in 7 tumor samples and 1 nontumor samples of the 51 paired tumor/nontumor samples and were therefore excluded from the analysis. *F. nucleatum* *nusG* was undetectable

Table 3 Estimated differences in alpha diversity indices between the following groups

Variable	Sobs		ShannonH		ShannonE	
	Estimate (95%CI)	P value	Estimate (95%CI)	P value	Estimate (95%CI)	P value
Tumor <i>vs</i> nontumor	-1.34 (-4.04, 1.35)	0.32	-0.05 (-0.25, 0.15)	0.61	-0.004 (-0.04, 0.03)	0.77
Pre-op antibiotics <i>vs</i> none	2.93 (-3.51, 9.37)	0.36	0.27 (-0.12, 0.66)	0.17	0.04 (-0.02, 0.09)	0.20
Left <i>vs</i> right	2.83 (-2.44, 8.10)	0.29	-0.10 (-0.43, 0.23)	0.53	-0.03 (-0.08, 0.02)	0.26
Diabetic <i>vs</i> nondiabetic	3.73 (-2.30, 9.75)	0.22	0.26 (-0.11, 0.62)	0.16	0.03 (-0.02, 0.09)	0.22
Black/ AA race <i>vs</i> not Black/ AA race	2.70 (-4.43, 9.83)	0.45	0.09 (-0.34, 0.52)	0.69	0.01 (-0.06, 0.07)	0.80

Linear mixed models were used to estimate differences. The *P* values are based on *t*-tests from the linear mixed models. CI: Confidence interval; AA: African Ancestry.

Table 4 PERMANOVA results for the following groups

Variable	P value
Tumor <i>vs</i> nontumor	0.002
Pre-operative antibiotics <i>vs</i> no preoperative antibiotics	0.001
Left <i>vs</i> right anatomic location	0.367
Diabetes mellitus <i>vs</i> not diabetic	0.061
Black/ AA race <i>vs</i> not Black/ AA race	0.258

AA: African Ancestry.

Table 5 Operational taxonomic units (genus level) with significant tumor histology*pre-operative antibiotics interaction terms

OTU (genus level)
<i>Actinobacteria/Gardnerella</i>
<i>Actinobacteria/Eggerthella</i>
<i>Firmicutes/Bacilli/unspecified</i>
<i>Firmicutes/Staphylococcus</i>
<i>Firmicutes/Parvimonas</i>
<i>Firmicutes/Anaerostipes</i>
<i>Firmicutes/Howardella</i>
<i>Firmicutes/Solobacterium</i>
<i>Fusobacteria/Fusobacteriales/unspecified</i>
<i>Fusobacteria/Leptotrichia</i>
<i>Proteobacteria/Sutterella</i>
<i>Proteobacteria/Ralstonia</i>
<i>Proteobacteria/Enterobacter</i>
<i>Proteobacteria/Haemophilus</i>

OTU: Operational taxonomic unit.

(undetermined) in the qPCR assays for at least one of the remaining 7 paired tumor and normal samples, and were also excluded from analysis. Both the *F. nucleatum* subspecies *nucleatum* and subspecies *animalis* were detected under these assay conditions. The mean threshold cycles (Ct) for the *F. nucleatum* nusG, broad-range 16S

Table 6 The operational taxonomic units (genus level) without significant tumor histology*preoperative antibiotics interaction terms, with significant ($P < 0.05$ after Bonferroni correction) estimated tumor/nontumor ratios of relative abundance and 95% confidence intervals

OTU	Ratio (95%CI)	P value
Increased in tumor		
<i>Firmicutes/Carnobacteriaceae/unspecified</i>	22.21 (7.57, 65.21)	< 0.0001
<i>Firmicutes/ Peptoniphilus</i>	2.13 (1.45, 3.13)	0.0042
<i>Firmicutes/Catenibacterium</i>	3.89 (1.79, 8.46)	0.0206
<i>Firmicutes/Dialister</i>	2.05 (1.48, 2.83)	0.0005
<i>Fusobacteria/Fusobacterium</i>	5.30 (2.82, 9.97)	< 0.0001
<i>Proteobacteria/Campylobacter</i>	7.40 (3.30, 16.62)	< 0.0001
<i>Proteobacteria/Citrobacter</i>	3.51 (2.12, 5.81)	< 0.0001
Decreased in tumor		
<i>Actinobacteria/Coriobacteriaceae/unspecified</i>	0.45 (0.32, 0.64)	0.0003
<i>Bacteroidetes/unspecified</i>	0.49 (0.32, 0.74)	0.0240
<i>Bacteroidetes/S24-7</i>	0.50 (0.36, 0.70)	0.0016
<i>Cyanobacteria/Chloroplast</i>	0.44 (0.31, 0.64)	0.0021
<i>Firmicutes/Lachnospiraceae/unspecified</i>	0.76 (0.68, 0.84)	< 0.0001
<i>Firmicutes/Marvinbryantia</i>	0.39 (0.24, 0.65)	0.0113
<i>Firmicutes/vadinBB60</i>	0.50 (0.36, 0.70)	0.0052
<i>Firmicutes/Turcibacter</i>	0.44 (0.30, 0.66)	0.0074
<i>Firmicutes/Allobaculum</i>	0.43 (0.29, 0.62)	0.0002
<i>Proteobacteria/Rickettsiales/mitochondria</i>	0.32 (0.19, 0.53)	0.0003
<i>Tenericutes/Anaeroplasma</i>	0.42 (0.28, 0.62)	0.0004
<i>Verrucomicrobia/Akkermansia</i>	0.58 (0.42, 0.80)	0.0350

OTU: Operational taxonomic unit; CI: Confidence interval.

rRNA and human *SLCOA2* assays are shown in [Figure 2A-C](#). Pairwise comparisons of the mean tumor *F. nucleatum* nusG gene Ct \pm SD with nontumor samples (32.2 ± 4.8 vs 34.0 ± 4.2 , $P = 0.0125$), confirmed that there was a higher abundance of *F. nucleatum* in tumor samples compared with their paired adjacent nontumor samples. The mean 16S rRNA gene Ct was significantly higher in the (+)antibiotics group compared with the (-)antibiotics group (24.8 ± 3.7 vs 22.3 ± 3.4 , $P = 0.0085$, missing 1 tumor (+)antibiotics and 1 tumor (-)antibiotics Ct value). This suggests that the preoperative antibiotics significantly reduced mucosal associated bacteria load. The difference in the mean *F. nucleatum* Ct between the (+)antibiotics group and the (-)antibiotics group (34.1 ± 3.7 vs 32.7 ± 4.8 , $P = 0.24$) did not reach significance. The difference in the mean human *SLCOA2* Ct between the (+)antibiotics group and the (-)antibiotics group also did not reach significance (34.5 ± 0.8 vs 34.4 ± 2.3 , $P = 0.74$, missing 2 nontumor (-)antibiotics Ct values).

In this current study the detection rates for the detection of *F. nucleatum* nusG gene were 84% and 93% respectively for the frozen tumor and nontumor samples. Of note, the Taqman probe used in the current study differed from the probe used in the previous FFPE studies, in that the probe in the current study did not overlap the reverse primer. The mean Ct values for each of the three qPCR assays performed on paired FFPE tumor/nontumor samples were compared with the Ct values obtained on the parallel pairs of frozen tumor/nontumor samples collected from the same two CRC patients (see [Table 7](#)). The broad range 16S rRNA gene Ct values were significantly higher in the FFPE samples compared to the paired frozen mucosal samples (30.6 ± 1.6 vs 22.7 ± 1.7 , $P = 0.0034$, $n = 4$), despite using 80 hg of gDNA in all assays. The differences in the mean *F. nucleatum* nusG Ct values did not reach

Table 7 Comparison of the mean quantitative polymerase chain reaction mean threshold cycles \pm SD between genomic DNA extracted from paired frozen and formalin-fixed paraffin embedded samples

	<i>F. nucleatum</i> nusG		16S rRNA		Human SLCO2A1	
	Frozen	FFPE	Frozen	FFPE	Frozen	FFPE
Tumor A	25.9 \pm 1.2	35.4 \pm 0.1	21.8 \pm 0.1	31.4 \pm 0.1	32.6 \pm 2.5	39.3 \pm 0.6
Nontumor A	37.2 \pm 0.6	39.9/ND	22.2 \pm 0.1	31.7 \pm 0.3	34.8 \pm 0.5	ND
Tumor B	26.0 \pm 1.0	27.5 \pm 1.0	21.6 \pm 0.2	28.3 \pm 0.1	33.2 \pm 1.0	32.5 \pm 1.3
Nontumor B	31.5 \pm 1.4	35.1 \pm 0.7	25.2 \pm 0.1	31.2 \pm 0.6	34.6 \pm 0.9	38.2 \pm 0.1

F. nucleatum: *Fusobacterium nucleatum*; FFPE: Formalin-fixed paraffin embedded; ND: Not detected.

significance, but one of the FFPE samples bordered on being not detectable (ND). The differences in the mean human *SLCO2A1* Ct values did not reach significance although one of the FFPE samples was ND.

Effect of tumor histology and preoperative antibiotics on human RNA-sequencing data

Since significant effects of tumor histology and preoperative antibiotics were noted in the microbiome analysis, we were particularly interested in the potential effect of preoperative antibiotics on the human transcriptomic profiles generated in parallel. RNA-seq data was obtained from CSHL for 33 paired tumor/nontumor RNA samples and 4 unpaired tumor RNA samples at CSHL. RNA-sequencing was completed on an additional 11 unpaired tumor RNA samples at the NYGC sequencing center. PCoA demonstrated a clear separation between the tumor and nontumor transcriptomic profiles (see [Figure 3](#)). Out of a total of 31052 genes, 1235 DEGs were decreased in tumor ($n = 48$) *vs* nontumor ($n = 33$, Log_2 fold change ≤ -1 , adjusted P value < 0.05) and 1229 DEGs were increased.

No clear separation was observed on PCoA for the remaining four variables: Preoperative antibiotics (see [Figure 3](#)), left *vs* right CRC location (not displayed), diabetic *vs* not diabetic (not displayed), or Black/AA race *vs* not Black/AA race (not displayed). DESeq2 analyses were conducted on the tumor samples separately from the nontumor samples for these four variables. For the (+)antibiotics ($n = 15$) *vs* the (-)antibiotics ($n = 33$) group of tumor samples, 30 DEGs were decreased and 188 DEGs were increased. For the (+)antibiotics ($n = 13$) *vs* (-)antibiotics ($n = 20$) nontumor samples, no DEGs were decreased and 32 DEGs were increased. Six upregulated DEGs were common with the same polarities in both tumor and nontumor (+)antibiotics/(-)antibiotics DEG lists (see [Table 8](#)).

For the left ($n = 30$) *vs* right ($n = 18$) CRC location groups of tumor samples, 12 DEGs were decreased and 7 DEGs were increased, and for the left ($n = 18$) *vs* right ($n = 15$) CRC location groups of nontumor samples, 72 DEGs were decreased and 36 DEGs were increased. However, no DEGs were common to both tumor and nontumor left *vs* right DEG lists. For the diabetic ($n = 18$) *vs* nondiabetic ($n = 30$) groups of tumor samples, 52 DEGs and 9 DEGs were increased, and for the diabetic ($n = 12$) *vs* nondiabetic ($n = 21$) groups of nontumor samples, 2 DEGs were decreased and 6 DEGs were increased. No DEGs were common to both tumor and nontumor diabetic/nondiabetic DEG lists.

In the analysis of the Black/AA ($n = 11$) *vs* not Black/AA ($n = 37$) groups of tumor samples, 5 DEGs were decreased and 11 DEGs were increased in Black/AA samples. For the Black/AA ($n = 10$) *vs* not Black/AA ($n = 33$) groups of nontumor samples, 42 DEGs were decreased and 5 DEGs were increased in Black/AA samples. Three DEGs were common to both tumor and nontumor Black/AA *vs* not Black/AA groups (see [Table 9](#)).

DISCUSSION

The results of this pilot study illustrate the need for thorough curation of the clinical metadata linked to archived gastrointestinal resection specimens for discovery and functional studies on CRC pathophysiology. Even after prospectively interviewing

Table 8 Differentially expressed genes, (+)antibiotics vs (-)antibiotics, common to both tumor and nontumor samples

Gene (increased)	Symbol	Tumor log ₂ fold change	Tumor adjusted P value	Nontumor log ₂ fold change	Nontumor adjusted P value
ENSG00000023902	PLEKHO1	1.127	0.0461	1.694	0.0130
ENSG00000253304	TMEM200B	1.326	0.0445	1.719	0.0481
ENSG00000187608	ISG15	1.534	0.0301	2.202	0.0102
ENSG00000185745	IFIT1	1.708	0.0243	2.245	0.0176
ENSG00000109705	NKX3-2	2.082	0.0476	2.859	0.0264
ENSG00000145936	KCNMB1	2.011	0.0480	2.874	0.0176

Table 9 Differentially expressed genes, Black/African Ancestry vs not Black/African Ancestry, common to both tumor and nontumor samples

Gene	Symbol	Tumor log ₂ fold change	Tumor adjusted P value	Nontumor log ₂ fold change	Nontumor adjusted P value
Decreased					
ENSG00000155959	VBPI	-8.217	5.26 × 10 ⁻¹⁰	-8.318	5.26 × 10 ⁻¹⁰
ENSG00000102109	PCSK1N	-5.965	0.0050	-7.175	0.0004
Increased					
ENSG00000225972	MTND1P23	4.0913	5.67 × 10 ⁻⁷	3.801	0.0001

research subjects for antibiotic exposure prior to surgical resection and carefully reviewing the electronic medical record for prescribed medications, it was difficult to assess this potentially important confounding variable. Further discussion with the colorectal surgery service revealed that a major change in pre-operative antibiotics was established as standard of care as of January 2017 to reduce site infections. This change in protocol was made, because there was accumulating evidence that the addition of short term perioperative oral antibiotics reduced intra-abdominal surgical site infections^[9-11]. The reduced mucosal associated bacterial abundance based on our 16S rRNA broad range PCR assays, may contribute to the reduced incidence of postoperative intra-abdominal infections. Our results indicate that there is a measurable effect not only on the host mucosal-associated microbial communities but also on the host colonic mucosal transcriptomic profiles. Reviewing the literature, while some studies clearly excluded CRC subjects who had received additional preoperative antibiotics^[13], it is not clear in a number of published reports, whether exposure to preoperative antibiotics was taken into consideration in the analysis. Though the effect of the antibiotics is transient, and the baseline microbiome is shown to recover within 1.5 mo with the most potent antibiotics^[36], the impact of preoperative antibiotics has a measurable effect on the mucosal transcriptomic profiles generated from the resection specimens.

A major limitation of this pilot study is the small number of subjects who were analyzed and potential selection bias with respect to the five variables included in the analyses. We detected significant differences in microbial β-diversity between tumor vs nontumor histology groups and (+)antibiotics vs (-)antibiotics. However, failure to detect differences with respect to CRC location, diabetes or Black/AA race could be because this study was underpowered to detect a significant effect of these three variables. Despite heterogeneity in pre-operative antibiotic protocols, qPCR analysis confirmed previous reports showing that *F. nucleatum* abundance was increased in tumor compared to paired nontumor samples^[29,37-41]. Lower detection rates of *F. nucleatum* nusG gene by PCR were previously reported on archived FFPE CRC tissues, ranging from 13%-45%^[37,38] while our study reports 84% and 93% detection rates for tumor and non-tumor fresh frozen regions respectively. Furthermore, *F. nucleatum* has been detected in advanced adenomas but not in early adenomas, which are precursor stages along the adenoma-carcinoma sequence^[39,41]. *F. nucleatum* abundance has been associated with poor prognosis and resistance to chemotherapy^[37,41,42]. In xenograft models of human CRC, antibiotic treatment for three weeks reduced *Fusobacterium* load, cancer cell proliferation and overall tumor growth, however treatment for only

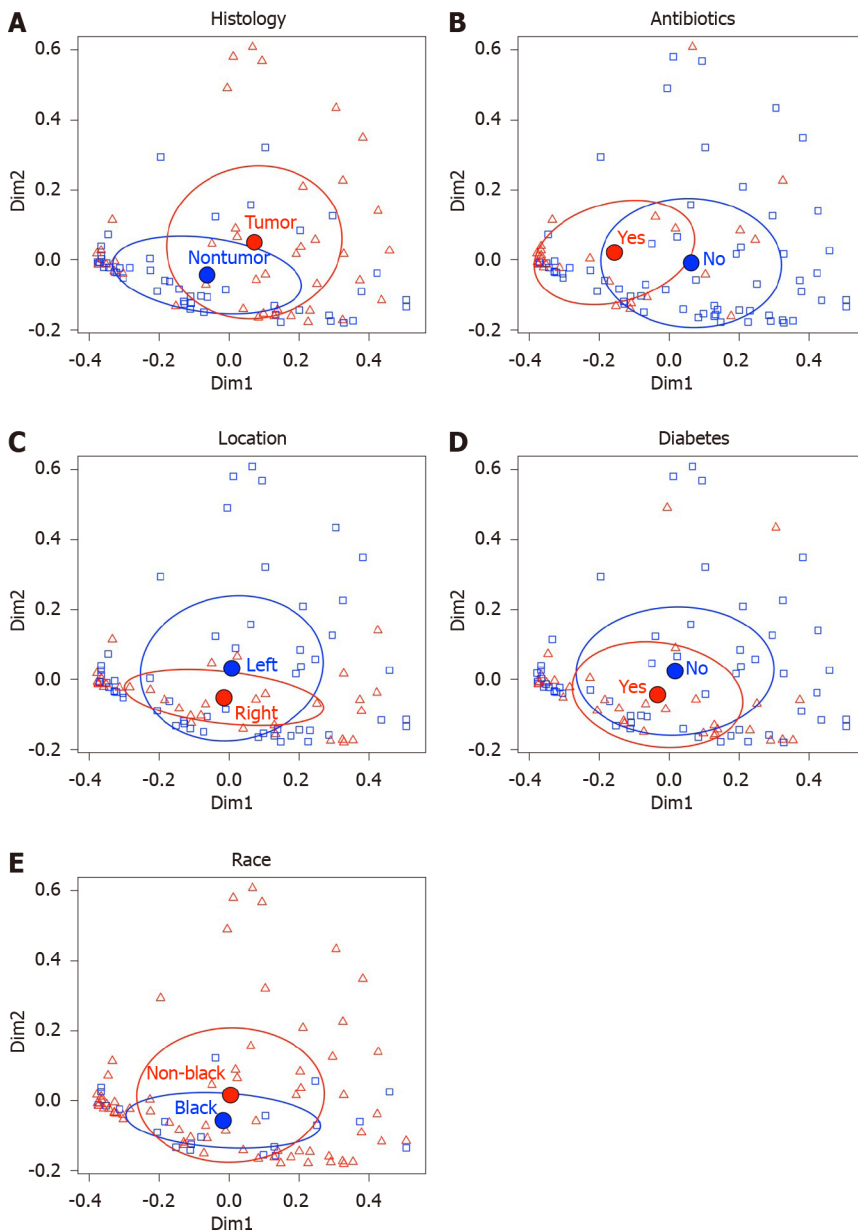


Figure 1 Principal coordinate analysis plots for Morita Horn dissimilarity indices. A: Preoperative antibiotic treatment (yes/no); B: Tumor vs nontumor histology; C: Anatomic location of sample (left vs right); D: Diabetes mellitus status (yes/no); E: Black/African Ancestry race (yes/no). The filled circles and surrounding ovals indicate the mean \pm SD centroid for each group.

24 h had no significant effect^[38]. There has been one report that *F. nucleatum* abundance is higher in colonic effluents collected from Black/AA male veterans compared to White/EA male veterans undergoing screening colonoscopy^[43].

Despite the small sample size and variable exposure to preoperative antibiotics, it was still possible to use the data for discovery studies. Expression of the von Hippel-Landau binding protein 1 or *VBP1* in Black/AA CRC tumors ($n = 64$) was observed to be significantly lower compared to White/EA CRC tumors ($n = 284$, $P = 0.026$) in The Cancer Genome Atlas (TCGA) database and in a recently published transcriptomic profiling study^[21]. The polarity observed for differences in proprotein convertase subtilisin/kexin type 1 inhibitor or *PCSK1N* Black/AA vs White/EA CRC tumors in the TCGA database however, was opposite to what was observed in this pilot study. The *MTND1P23* gene was not present in the TCGA database. We are particularly intrigued by the results indicating reduced *VBP1* expression in Black/AA tumor vs not Black/AA tumor and Black/AA nontumor vs not Black/AA nontumor, because of a recent report that *VBP1* suppresses HIF-1 α -induced epithelial-mesenchymal transition *in vitro* and tumor metastasis *in vivo*^[44].

Given that the new preoperative antibiotic protocol adopted at this medical center is 24 h of oral antibiotics in addition to current IV antibiotics administered within 30 min

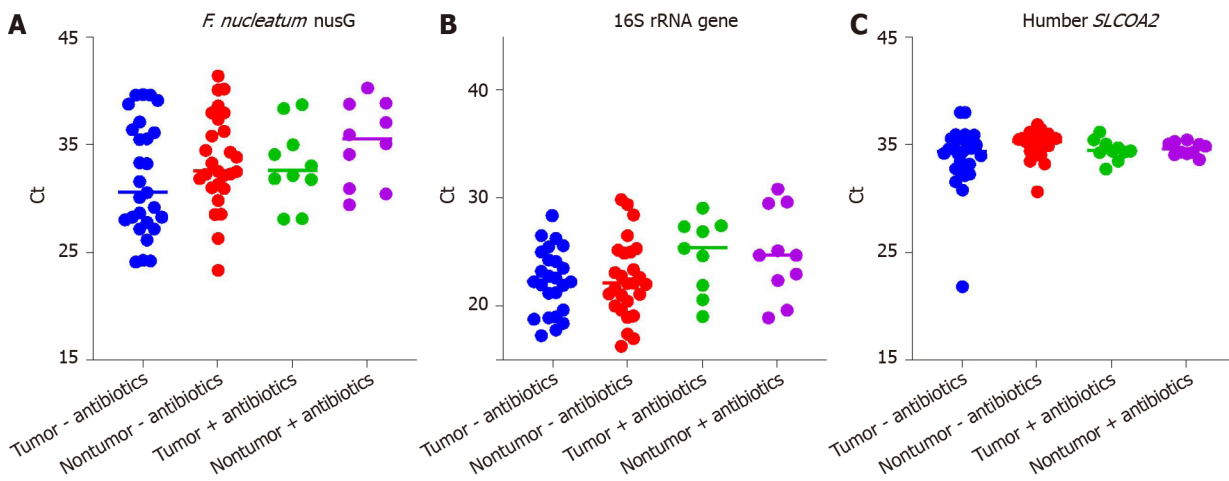


Figure 2 Scatter plots of threshold cycle values. A: *Fusobacterium nucleatum nusG* gene; B: Broad range 16S rRNA gene; C: Human *SLCOA2* gene quantitative polymerase chain reaction assays. *F. nucleatum*: *Fusobacterium nucleatum*.

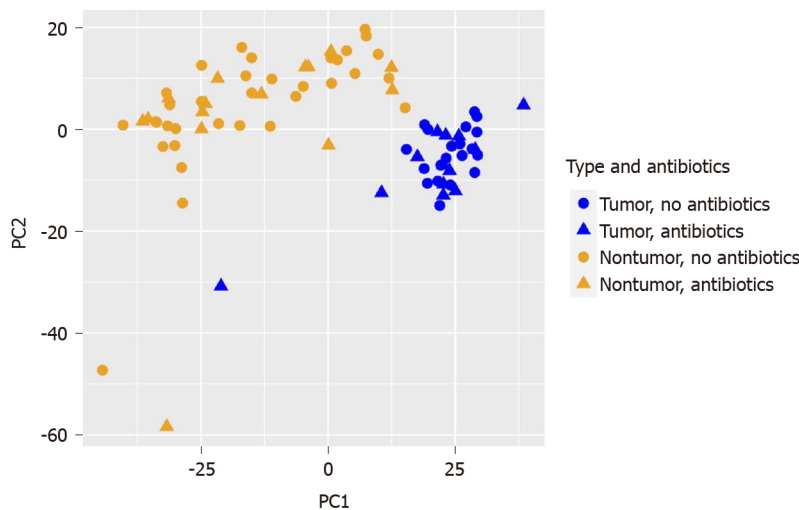


Figure 3 Principal coordinate analysis of human colorectal cancer RNA-seq data with respect to tumor histology (tumor vs nontumor) and preoperative antibiotics (yes/no).

of incision for colorectal resections, a relevant question is how to further pursue the findings of this initial discovery and functional study. Going forward, probably the best solution is to perform targeted PCR assays on archived FFPE CRC and advanced adenoma tissues collected prior to the change in preoperative antibiotics protocol in order to sufficiently power the analysis of evaluating the effect of laterality, diabetes status and race on microbiome and transcriptomic data of CRC patients. In particular, utilizing the targeted PCR to detect *Fusobacterium*, it can possibly be used as a clinical prognostic biomarker for diabetic CRC patients. We also plan to shift our prospective collection of colonic tissues away from surgical resections to prospective collection of colonoscopic biopsy samples.

CONCLUSION

The recent addition of preoperative oral antibiotics 24 h to the standard administration of IV antibiotics within 30 min of incision has a measurable effect on colonic mucosal gene expression in addition to its effect on the amount and composition of mucosal associated bacteria in the resected specimen. Despite heterogeneity in the preoperative antibiotics in this study cohort, increased abundance of *F. nucleatum*, was observed in tumor *vs* nontumor regions of the resected specimen. This study identified the *VBP1* gene, which may suppress CRC metastasis, as having decreased RNA expression in

both tumor and nontumor regions of the resected specimen collected from Black/AA subjects.

ARTICLE HIGHLIGHTS

Research background

Imbalances in mucosal associated microbiota (dysbiosis) have been reported in human colorectal cancer (CRC). There are certain pathogens that are associated with CRC including increased abundances of *Peptostreptococcus*, *Bacteroides fragilis*, *Fusobacterium nucleatum*, and *Escherichia coli* and decreased abundances of *Clostridium*, *Bifidobacterium*, *Faecalibacterium* and *Roseburia*. The approach of collecting and integrating multi-omic host and microbiome data has been increasingly applied to discovery and functional studies of human gastrointestinal disease.

Research motivation

A major change was made in the preoperative antibiotic protocol at this hospital as of January 2017. Prior to that time, the standard of care was to administer only intravenous antibiotics within 30 min of incision, and only a few CRC resection patients were placed on short-term oral antibiotics within a month of the surgery, for various clinical indications. However, after this time, the standard operating protocol for preoperative antibiotics was to prescribe outpatient oral neomycin and metronidazole 24 h in advance of the procedure, in order to reduce surgical site infections. The use of antibiotics can shift the microbiome depending on the dosage and duration of the antibiotic exposure. Several studies have shown that tumorigenesis and tumor growth can be attenuated with different antibiotic cocktails and timing of antibiotic exposure with duration of inflammation. On the other hand, early exposure to antibiotics increased risk of CRC and interfered with chemotherapy efficacies due to microbial dysbiosis. With these conflicting findings and this change in protocol at our institution, it allowed us to examine how differential use of antibiotics, along with other clinical/demographic factors influences integrative, multi-omic analyses of CRC.

Research objectives

To examine the effect of the five following variables were included in the analysis of the microbiome and host transcriptome datasets generated in this pilot study: (1) Tumor histology (tumor *vs* nontumor); (2) Preoperative antibiotics (yes/no); (3) Laterality of CRC location (left *vs* right); (4) Diabetes mellitus (yes/no); and (5) Black/African Ancestry (AA) race (yes/no).

Research methods

Genomic DNA (gDNA) and RNA were extracted from prospectively collected 51 pairs of frozen sporadic CRC tumor and adjacent non-tumor mucosal samples from 50 CRC patients archived at a single medical center from 2010-2020. 16S rRNA gene sequencing (V3V4 region, paired end, 300 bp) and confirmatory quantitative polymerase chain reaction (PCR) assays were conducted on gDNA. RNA sequencing (IPE, 125 bp) was performed on parallel tumor and non-tumor RNA samples with RNA Integrity Numbers scores ≥ 6 .

Research results

Exploratory PERMANOVA using the Morasita Horn index for β -diversity was performed with each of the five groups. Tumor *vs* nontumor histology ($P = 0.002$) and preoperative antibiotics ($P = 0.001$) demonstrated significant F statistics, but anatomic location, diabetes and Black/AA race did not reach significance. Differences in α -diversity did not reach significance between the five groups. Fourteen taxa at the genus level exhibited significant tumor*preoperative antibiotic interactions. Of the taxa without tumor*preoperative antibiotic interactions, 7 taxa were significantly increased in tumor *vs* nontumor, including *Fusobacterium*, and 11 taxa were significantly decreased. The increase in *Fusobacterium nucleatum* (*F. nucleatum*) abundance was confirmed by Taqman PCR assays. Additional preoperative antibiotics significantly reduced mucosa-associated total bacterial abundance, which may contribute to reduction of intra-abdominal surgical site infections. Analysis of a subset of parallel formalin-fixed paraffin embedded (FFPE) samples retained polarity of the observed trends but impaired signal strength. Principal coordinate analysis of the

transcriptomic data showed a clear separation from tumor and nontumor samples. Consequently, differentially expressed genes were analyzed separately for the other four variables separately in tumor and nontumor samples. Differentially expressed genes common to the tumor and nontumor groups were identified for additional preoperative antibiotics and Black/AA race. The *VBPI* gene, which may suppress CRC metastasis, exhibits reduced expression in Black/AA subjects compared to not Black/AA subjects.

Research conclusions

The recent addition of preoperative oral antibiotics 24 h to the standard administration of IV antibiotics within 30 min of incision has a measurable effect on colonic mucosal gene expression in addition to its effect on the amount and composition of mucosal associated bacteria in the resected specimen. Despite heterogeneity in the preoperative antibiotics in this study cohort, increased abundance of *F. nucleatum*, was observed in tumor *vs* nontumor regions of the resected specimen. This study identified the *VBPI* gene, which may suppress CRC metastasis, as having decreased RNA expression in both tumor and nontumor regions of the resected specimen collected from Black/AA subjects.

Research perspectives

Given that the addition of preoperative antibiotics to the standard administration of IV antibiotics within 30 min of incision has a measurable effect on colonic mucosal gene expression, in addition to its effect on the amount and composition of mucosa-associated bacteria in the resected specimen, is being widely adopted as standard of care, we plan to perform targeted PCR assays on archived CRC FFPE tissues to confirm our results collected prior to when the change in protocol was adopted (January 2017). Because patients undergoing colonoscopy are not routinely prescribed antibiotics before the procedure, we also plan to shift prospective collection of colonic neoplastic and normal tissues away from surgical resections to prospective collection of research colonoscopic biopsy samples.

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