

# **Liver abscess microbiota of feedlot steers finished in natural and traditional management programs**

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## **Abstract**

Liver abscess etiology in feedlot steers involves the escape of bacteria from the digestive tract to form a polymicrobial abscess within or on the external surface of the liver. However, little is known about the effects of feedlot finishing systems on the microbial composition of the liver abscess purulent material. Liver abscesses were collected at the time of harvest from steers originating from a single feedlot managed in either a traditional program (which included tylosin phosphate supplementation) or a natural program (without tylosin phosphate supplementation). The purulent material of liver abscesses from traditionally managed steers (*N* = 53 abscesses) and that of naturally managed steers (*N* = 62 abscesses) was characterized using the V4 region of the 16S rRNA gene. Two phyla and three genera were found in greater than 1% relative abundance across all abscesses. The genus *Fusobacterium* was identifed in all liver abscess samples and accounted for 64% of sequencing reads. *Bacteroides* and *Porphyromonas* genera accounted for 33% and 1% of reads, respectively. *Trueperella* was more likely to be found in the liver abscesses of naturally managed steers than traditionally managed steers (*P* = 0.022). Over 99% of the genus-level bacterial sequences observed across all liver abscesses belonged to Gram-negative genera. Bacteria known to colonize both the rumen and hindgut were identifed within liver abscesses. No differences in alpha diversity or beta diversity were detected between liver abscess communities (between the two management programs or individual pens) when tested as richness, Shannon Diversity Index, or weighted UniFrac distances (*P* > 0.05). These results were consistent with previous identifcation of *Fusobacterium necrophorum* as the primary bacteriologic agent within liver abscesses and emphasized the relationship between the gastrointestinal microbiota and liver abscess formation. Though the microbiota of the liver abscess purulent material was similar between steers fed an antibiotic-free diet and those fed an antibiotic-containing diet from the same feedlot, divergence was detected in liver abscess communities with some being dominated by *Fusobacterium* and others being dominated by *Bacteroides*.

# **Lay Summary**

As feedlot cattle consume grain, the rumen becomes more acidic. If the lining of the digestive tract is damaged, bacteria that normally remain in the digestive tract can enter the body. Certain bacteria like *Fusobacterium necrophorum* are involved in the formation of liver abscesses. Feedlot cattle are commonly fed an antibiotic (tylosin phosphate) to reduce the occurrence of liver abscesses, but increasing scrutiny is placed on the antibiotic use. However, the effect of eliminating the antibiotic used to prevent liver abscesses on the bacterial communities involved in liver abscess formation is unknown. This study compared the bacteria found within liver abscesses of cattle fed tylosin phosphate with that of cattle not fed tylosin phosphate. All liver abscesses contained *F. necrophorum*, and *Bacteroides* was the second most commonly identifed bacterium. Trace amounts of bacteria known to colonize the mouth and digestive tract were observed. *Trueperella*, a bacteria targeted by tylosin phosphate, was found more frequently in liver abscesses from cattle that received no antibiotic. While the core bacterial composition of the liver abscess was unaffected by antibiotic supplementation to feedlot steers, reduced *Trueperella* in liver abscesses from cattle-fed tylosin phosphate could be related to a reduction in liver abscess prevalence.

**Key words:** antibiotic, feedlot, liver abscess, steers, tylosin, 16S **Abbreviations:** ASV, amplicon sequence variant

# **Introduction**

<span id="page-0-11"></span><span id="page-0-4"></span>Occurrence of liver abscesses in feedlot steers is associated with a reduction in live performance, hot carcass weight, and visceral value ([Brink et al., 1990;](#page-7-0) [Brown and Lawrence, 2010](#page-7-1)). Prevalence of liver abscesses among commercial cattle has increased from the earliest reports of 5.3% ([Smith, 1940](#page-9-0)) to 17.8% reported by the most recent National Beef Quality Audit ([Eastwood et](#page-8-0) [al., 2017\)](#page-8-0). While administering in-feed antibiotics to livestock is scrutinized ([Aarestrup, 1999](#page-7-2); [Haskell et al., 2018](#page-8-1); [Chen et](#page-7-3) <span id="page-0-10"></span><span id="page-0-9"></span><span id="page-0-7"></span><span id="page-0-6"></span><span id="page-0-5"></span>[al., 2019](#page-7-3)), tylosin phosphate supplementation remains the most economical method to reduce liver abscess prevalence ([Brown et](#page-7-4)  [al., 1975](#page-7-4); [Nagaraja and Lechtenberg, 2007](#page-8-2)). Historically, Fusobacterium necrophorum has been implicated as the primary etiologic agent in the liver abscess formation [\(Nagaraja and](#page-8-2)  [Lechtenberg, 2007\)](#page-8-2). Although the use of culture-based microbiological techniques has consistently demonstrated F. necrophorum presence within polymicrobial abscesses, these results may oversimplify the microbial community of liver abscess purulent

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<span id="page-1-9"></span><span id="page-1-6"></span><span id="page-1-2"></span><span id="page-1-1"></span><span id="page-1-0"></span>material as many unculturable microbes are not assessed [\(Naga](#page-8-3)[raja and Chengappa, 1998](#page-8-3)). In recent years, a limited number of studies have utilized high-throughput sequencing to assess the microbiota within liver abscesses ([Amachawadi et al., 2016,](#page-7-5) [2021](#page-7-6); [Weinroth et al., 2017](#page-9-1); [Stotz et al., 2021](#page-9-2)). Differences in liver abscess microbiota have been attributed to cattle source (ranch of origin, backgrounding location, etc.), breed composition, feedlot location, and inclusion of tylosin phosphate in the diet ([Amachawadi et al., 2017;](#page-7-7) [Weinroth et al., 2017\)](#page-9-1). Natural feedlot fnishing programs exclude tylosin phosphate and the use of growth technologies (steroidal implants and beta-adrenergic agonists). Additionally, natural programs that have specifcations for cattle management before feedlot entry often require cattle to have never been given an antibiotic. These specifcations create microbial selection pressures even before the cattle arrive at the feedlot. Therefore, the objective of this study was to use 16S rRNA gene sequencing to compare the liver microbiota of steers managed within a single feedlot under a traditional program with that of steers managed in a natural program (without tylosin phosphate supplementation, steroidal implants, beta-adrenergic agonists, or antimicrobial treatments).

## **Materials and Methods**

# Animal care and use

All cattle were harvested in a commercial processing facility and samples were collected postmortem under commercial conditions. All procedures were reviewed and approved by Colorado State University Institutional Animal Care and Use Committee via waiver (IACUC waivers #2018-888 and #2019-773). Observations and sample collections did not change normal commercial practices.

# Cattle population

Fourteen pens of yearling steers with an average of 281 steers per pen (range of 212 to 323 steers per pen) were identifed for observation in a commercial feedlot in the High Plains region. Pens enrolled in a traditional management program  $(N = 7)$  and pens enrolled in a natural management program  $(N = 7)$  arrived at the feedlot over a 45-d period from late August through early October 2018. Traditional and natural pens were selected in pairs by the arrival date to minimize temporal effects. Steers were observed in the management program in which they were placed in accordance with management prior to feedlot arrival. Upon arrival, all steers were sorted and vaccinated according to standard feedlot protocol. Traditionally managed cattle received standard hormonal implants containing trenbolone acetate and estradiol.

All steers were fed using a step-up feeding program that included receiving, intermediate, and fnishing diets. Diet ingredients and nutrient analysis are summarized in [Sup](http://academic.oup.com/jas/article-lookup/doi/10.1093/jas/skac252#supplementary-data)[plementary Table S1.](http://academic.oup.com/jas/article-lookup/doi/10.1093/jas/skac252#supplementary-data) Traditionally managed steers were fed an additional diet including ractopamine hydrochloride (Optafexx; Elanco Animal Health; Greenfeld, IN) during the fnal 28 to 42 d of the fnishing period. Monensin (Rumensin; Elanco Animal Health) and tylosin phosphate (Tylan; Elanco Animal Health) were also fed to traditionally managed steers. Naturally managed cattle were not administered growth-promoting technologies or antibiotics. When treated for illness with an antibiotic, naturally managed cattle were removed from natural pens and, consequently, removed from the study population.

### Liver abscess collection

<span id="page-1-8"></span>Cattle were transported to a commercial processing facility for harvest from February through April of 2019. Traditionally managed cattle were fed for an average of 179 d (SD = 12.6), and naturally managed cattle were fed for an average of 214 d (SD = 14.4). Identities of feedlot pens were maintained through the harvest process to allow for the collection of liver abscesses from cattle from each pen. Livers identifed as inedible (because of abscess, adherence to internal tissues, cirrhosis, fukes, telangiectasias, or contamination) were removed from the production line and evaluated by trained personnel for abscess presence. Livers were palpated to identify abscesses that harbored purulent material. Abscesses and surrounding liver tissue were extracted with sterile scalpels. When the liver abscess capsule was compromised during tissue removal, the entire abscess sample was discarded. Abscesses from individual livers were placed in sterile collection bags (VWR; Radnor, PA), sealed, and transported in insulated containers to the Center for Meat Safety and Quality at Colorado State University (Fort Collins, CO) for further processing.

## Liver abscess processing

On the same date as sample collection, liver abscess samples were processed and prepared for storage. Abscess capsules or the external surface of the liver tissue were fame sterilized using 100% ethanol. Following sterilization, abscess capsules were opened with a sterile scalpel, and purulent material was extracted and transferred to sterile 50-mL conical tubes (VWR) using sterile tongue depressors. Aliquots of liver abscess purulent material were stored at −80 °C until the time of DNA extraction.

#### DNA extraction and sequencing

<span id="page-1-10"></span>DNA extraction and library preparation were performed at Colorado State University consistent with the recommendations of [Weinroth et al. \(2022\)](#page-9-3). A randomly selected subset of the liver abscess purulent material aliquots ( $N = 10$  per pen) was thawed for 16 h at 4 °C before extraction. Purulent material aliquots were individually sampled with sterile swabs (Becton, Dickinson and Company; Franklin Lakes, NJ) and randomized and loaded into 96-well plates by cutting the inoculated swab tip into the plate well with fame-sterilized scissors. Cross contamination was prevented by covering all inactive wells. Sixteen negative controls and two positive controls (ZymoBIOMICS Microbial Community Standard 6300, Zymo Research; Irvine, CA) were included. Ten technical replicates were also included to evaluate consistency across extraction plates; 10 randomly selected liver abscess purulent samples were swabbed in duplicate, and duplicate swabs were loaded on separate plates. Loaded plates were stored at −20 °C until the time of DNA extraction.

<span id="page-1-7"></span><span id="page-1-5"></span><span id="page-1-4"></span><span id="page-1-3"></span>Upon thawing the loaded plates, DNA was extracted using the DNEasy PowerSoil HTP 96 Kit (Qiagen; Hilden, Germany) following the manufacturer's protocol. Extracted DNA was amplifed with barcoded primers targeting the V4 region of the 16S rRNA gene. Primer constructs included the Illumina MiSeq adaptor (Illumina; San Diego, CA), Golay barcode, spacer, and primer. Earth Microbiome Project (EMP) primers 515F and 806R were used for amplifcation ([Caporaso et al., 2011](#page-7-8), [2012;](#page-7-9) [Apprill et al., 2015;](#page-7-10) [Parada et al., 2016](#page-8-4)).

Amplifcation was conducted in duplicate by PCR using an Eppendorf Vapo.Protect MasterCycler Pro-S thermocycler (Eppendorf; Hauppauge, NY). For the initial PCR, 25 μL of reaction mix was prepared by combining 1 μL of template DNA, 1 μL of each barcoded primer (10 μM), 12 μL of molecular-grade water, and 10 μL of Platinum Hot Start PCR Master Mix (Thermo Fisher Scientifc; Waltham, MA). Conditions for PCR followed EMP protocol and included initial denaturation at 94 °C for 3 min; 30 cycles of denaturation (94 °C, 45 s), annealing (50 °C, 60 s) and elongation (72 °C, 90 s); and a fnal 10-min extension at 72 °C. Products of PCR were visually evaluated for effective amplifcation by agarose gel electrophoresis with expected band size of approximately 300 to 350 base pairs. Similarly, negative controls were visually evaluated for lack of banding pattern. The second PCR process was completed using the same reaction conditions as described above; however, 50 μL of reaction mix was prepared by combining 2 μL template DNA, 2 μL of each barcoded primer (10 μM), 24 μL of molecular-grade water, and 20 μL of PCR Master Mix. The main goal of the second amplification was to generate sufficient quantities of amplicons for next-generation sequencing. Agarose gel evaluation of the product was performed as described above.

Duplicate PCR products were combined for each sample. The concentration of amplicon products was determined by Quant-IT PicoGreen dsDNA Assay Kit (Thermo Fisher Scientifc) read on a Fluoroskan (Thermo Fisher Scientifc) plate reader. Pico assay concentration results were qualitatively verifed by comparison to agarose gel banding patterns. Amplicons from all wells of a single 96-well plate (including samples, technical replicates, and controls) were combined before cleaning. To combine amplicons, 300 ng of DNA from each sample was added to a single tube for each plate (referred to as "plate pool"). No more than 50 μL from a single sample was added to the plate pool to maintain the integrity of the negative control. Plate pools were cleaned using MinElute PCR Purifcation Kit (Qiagen) following manufacturer's protocols. The cleaned plate pools were evaluated for DNA concentration by NanoDrop Lite spectrophotometer (Thermo Fisher Scientifc) and combined in equimolar concentrations to form the fnal sequencing library.

The amplicon library was diluted to a loading concentration of 8 pM and combined with 15% PhiX control library. Paired-end sequencing  $(2 \times 250$  bp) was performed using the 500 cycle MiSeq Reagent Kit v2 (Illumina; San Diego, CA) on the Illumina MiSeq platform at the Next Generation Sequencing Core Laboratory at Colorado State University.

#### Bioinformatics and statistical analysis

<span id="page-2-14"></span><span id="page-2-5"></span><span id="page-2-4"></span><span id="page-2-3"></span><span id="page-2-2"></span>All amplicon sequence data were bioinformatically processed in QIIME2 version 2019.4 ([Bolyen et al., 2018](#page-7-11)). Imported and demultiplexed paired-end sequences were denoised with DADA2 [\(Callahan et al., 2016](#page-7-12)) with both forward and reverse reads trimmed to 250 bp. Taxonomy was assigned with the q2-feature-classifer plugin [\(Bokulich et al., 2018](#page-7-13)) using a pretrained naive Bayes Greengenes 13\_8 classifer [\(DeSantis et al., 2006;](#page-7-14) [McDonald et al., 2012\)](#page-8-5), a pretrained naive Bayes Silva 132 classifier, and a Silva 132 ([Quast et al.,](#page-8-6) [2013\)](#page-8-6) classifer trained specifcally for the primer set used for amplifcation. The pretrained Silva classifer was selected for downstream analysis due to a fewer amplicon sequence variants (ASV) being identifed as unclassifed. Reads classifed as mitochondria or chloroplasts were removed from the <span id="page-2-6"></span>data set; controls and technical replicates were also removed. ASV was placed in the Greengenes 13\_8 phylogenetic tree by SEPP methodology using q2-fragment-insertion ([Janssen](#page-8-7)  [et al., 2018](#page-8-7)). Adequate sampling depth was justifed by constructing a rarefaction curve with diversity metrics. Because alpha diversity rarefaction curves showed little diversity added with a sampling depth above 3,000 sequences per sample, diversity analysis was standardized by subsampling without replacement [\(Weiss et al., 2017\)](#page-9-4) to 10,049 sequences per sample, which allowed retention of most samples in the analyses.

<span id="page-2-17"></span><span id="page-2-16"></span><span id="page-2-15"></span><span id="page-2-10"></span><span id="page-2-9"></span><span id="page-2-8"></span><span id="page-2-7"></span>Alpha diversity was measured by richness (the number of observed ASV) and Shannon Diversity Index ([Shannon,](#page-9-5)  [1948](#page-9-5)). Differences in richness and Shannon Diversity were evaluated between management programs and pen assignments with Kruskal–Wallis testing ([Kruskal and Wallis, 1952\)](#page-8-8) and visualized in R version 3.4.1 (R Core Team, 2017) using ggplot2 [\(Wickham, 2009\)](#page-9-6). Beta diversity was measured with unweighted UniFrac ([Lozupone and Knight, 2005\)](#page-8-9) and weighted UniFrac [\(Lozupone et al., 2007](#page-8-10)). K-means clustering was used to group samples based on the unweighted UniFrac distance matrix ([Lloyd, 1982](#page-8-11); MacQueen, 1967). Differences in beta diversity between management programs, pen assignments, and K-means clusters were evaluated with PERMANOVA testing [\(Anderson, 2017\)](#page-7-15) using the vegan package of R ([Oksanen et al., 2022](#page-8-12)). Taxa differential abundance was evaluated by ANCOM testing at both the phylum and genus level ([Mandal et al., 2015](#page-8-13)). Signifcance for differential abundance was evaluated as a *W* value indicating logfold change against a model-determined threshold based on a bimodal distribution. Rarefed abundance data was exported from QIIME2 as relative abundance and visualized in R version 3.4.1 (R Core Team, 2017).

<span id="page-2-13"></span><span id="page-2-11"></span><span id="page-2-0"></span>The sequencing depth of each negative control was evaluated to ensure cleanliness of extraction and library preparation; the number of reads generated by each control well before and after denoising was recorded. The sequencing depth of positive controls was similarly recorded. Additionally, the taxa relative abundance of each positive control was exported and visualized in R version 3.4.1 (R Core Team, 2017) using ggplot2 [\(Wickham, 2009\)](#page-9-6) and compared to the known composition of the mock community for qualitative evaluation. Technical replicates were qualitatively evaluated in pairs by taxa relative abundance to ensure consistency of taxa relative abundance between separate extraction plates.

<span id="page-2-1"></span>For each individual liver abscess microbial community, the presence or absence of *Fusobacterium*, *Bacteroides*, and *Trueperella* was determined from rarefed taxonomy tables. Bacterial presence was compared between management programs by logistic regression in R version 3.4.1 (R Core Team, 2017) using lme4 ([Bates et al., 2015](#page-7-16)) and emmeans (Searle et al., 1980). A mixed effects model was ft using management program of the live steer as a fxed effect and pen assignment of the live steer as a random effect. A predetermined alpha level of 0.05 was used for all comparisons in the observational study.

## <span id="page-2-12"></span>**Results and Discussion**

## Summary of samples processed

In total, 140 unique liver abscess purulent samples were processed. Seventy liver abscesses from naturally managed cattle ( $N = 10$  from each of 7 pens) and 70 liver abscesses from traditionally managed cattle  $(N = 10$  from each of 7 pens) were selected for analysis.

# DNA sequencing data

A total of 3,437,552 sequence reads were generated by Illumina MiSeq sequencing for liver abscess purulent material samples, technical replicates, and controls. Liver abscess purulent material samples and replicates  $(N = 150)$  averaged 21,037 sequences per sample (range: 18 to 43,192; SD = 11,673). Negative controls ( $N = 16$ ) averaged 146 sequences per sample (range: 7 to 547;  $SD = 189$ ). Positive controls (N = 2) averaged 34,636 sequences per sample (range: 31,915 to  $37,356$ ; SD =  $3,847$ ).

After denoising, fltering for sequencing depth, and removing controls, replicates, chloroplasts, and mitochondria, a total of 1,055,145 reads mapped to 69 unique features were included for analysis. Rarefying to 10,049 sequences per sample resulted in retaining 53 of 70 liver abscess purulent material samples from steers managed in the traditional program and 62 of 70 liver abscess purulent material samples from steers managed in the natural program. After denoising, negative controls  $(N = 16)$  averaged 32 sequences per sample (range: 0 to 311; SD = 77) and positive controls  $(N = 2)$  averaged 24,943 sequences per sample (range: 22,272 to 27,614;  $SD = 3,777$ .

## Core microbial composition

Taxonomic classifcation with the pretrained naive Bayes Silva 132 classifer identifed two phyla and three genera of bacteria in greater than 1% relative abundance of all reads ([Figure 1A](#page-3-0) and [B](#page-3-0)). The dominant phyla observed included Fusobacteria (64% of reads) and Bacteroidetes (34% of reads). This represented a much simpler microbial community than was reported by [Weinroth et al. \(2017\)](#page-9-1) and [Amach](#page-7-6)[awadi et al. \(2021\)](#page-7-6) based on the number of taxa observed. The referenced studies used mean sequencing depths that

were a magnitude of order greater than the sequencing depth of the present study; however, alpha diversity rarefaction curves constructed for the current study plateaued at approximately 3,000 sequences per sample. Regardless of sequencing depth, other factors could have affected richness of the microbial communities. For instance, the purulent material analyzed in this observational study originated from steers housed in a single feedlot over the same time period while the purulent material analyzed by [Weinroth et al. \(2017\)](#page-9-1) originated from cattle from fve different feedlots, and [Amach](#page-7-6)[awadi et al. \(2021\)](#page-7-6) evaluated liver abscess representing 22 feedlots. In addition, the length of time between the initial abscess occurrence and harvest could have affected succession of abscess microbial communities. Others have observed decreased microbial richness as selection pressure is applied to a microbial community ([Chaillou et al., 2015](#page-7-17)). If the abscesses evaluated in this study were chronologically older than those of previous evaluations, action of the immune system could have contributed to decreased alpha diversity. Though diffcult to identify the time of abscess occurrence in the live animal, further investigation into the age of the abscess relative to the complexity of its microbial community could help explain observed differences in complexity of liver abscess communities.

<span id="page-3-7"></span><span id="page-3-6"></span><span id="page-3-5"></span><span id="page-3-4"></span><span id="page-3-3"></span><span id="page-3-2"></span><span id="page-3-1"></span>The genera identifed in greater than 1% relative abundance of all reads included *Fusobacterium* (64% of reads; 100% of samples), *Bacteroides* (33% of reads; 93% of samples), and *Porphyromonas* (1% of reads; 7% of samples). *Bacteroides* is a Gram-negative bacterium found in the gastrointestinal tracts of cattle [\(Miura et al., 1980](#page-8-14); [Wetzels et al., 2017;](#page-9-7) [Ozbayram et al., 2018\)](#page-8-15) and has been previously associated with liver abscesses [\(Simon and Stovell, 1971](#page-9-8); [Kanoe et al.,](#page-8-16) [1979](#page-8-16); [Scanlan and Hathcock, 1983](#page-9-9); [Nagaraja and Lechten](#page-8-2)[berg, 2007](#page-8-2)). A previous study demonstrated an increase in the relative abundance of *Bacteroides* on the rumen epithelium during acidosis challenge [\(Wetzels et al., 2017](#page-9-7)). *Porphyromonas* is a Gram-negative ruminal bacterium closely related



<span id="page-3-0"></span>Figure 1. Average taxonomic composition (% relative abundance) of the bacterial communities within liver abscesses from steers in a single feedlot under natural (*N* = 62) and traditional (*N* = 53) management programs averaged by management program at the phylum-level (A) and genus-level (B).

<span id="page-4-22"></span>to *Bacteroides* ([Summanen et al., 2005\)](#page-9-10) that has been found in bovine liver abscesses [\(Scanlan and Hathcock, 1983](#page-9-9); [Naga](#page-8-2)[raja and Lechtenberg, 2007;](#page-8-2) [Weinroth et al., 2017\)](#page-9-1). Driven by *Fusobacterium*, *Bacteroides*¸ and *Porphyromonas*, over 99% of the bacterial sequences observed across all liver abscesses belonged to genera previously classifed as Gram-negative by [Langworth \(1977\),](#page-8-17) [Hofstad \(1984\),](#page-8-18) and [Bostanci and Beliba](#page-7-18)[sakis \(2012\)](#page-7-18).

### <span id="page-4-14"></span>Taxa of interest

<span id="page-4-18"></span><span id="page-4-16"></span><span id="page-4-7"></span>The genus Fusobacterium was identifed in all liver samples from both traditionally and naturally managed steers (Table 1). Fusobacterium was the sole microbial genus in only two of the 115 purulent material samples (2%); all other samples (98%) were identifed as mixed cultures of Fusobacterium with other bacteria. Though bovine liver abscesses have often been described as polymicrobial infections, F. necrophorum has historically been considered the primary etiologic agent of liver abscesses in fed cattle [\(Newsom, 1938;](#page-8-19) [Jensen et al.,](#page-8-20) [1954;](#page-8-20) [Calkins and Dewey, 1968](#page-7-19); [Scanlan and Hathcock,](#page-9-9) [1983;](#page-9-9) [Nagaraja et al., 1996](#page-8-21); [Nagaraja and Chengappa, 1998;](#page-8-3) [Nagaraja and Lechtenberg, 2007\)](#page-8-2). In agreement with the current study, [Weinroth et al. \(2017\)](#page-9-1) found Fusobacterium in all liver abscess samples collected from fed cattle using molecular techniques. Similarly, [Nagaraja et al. \(1999\)](#page-8-22) and [Amachawadi and Nagaraja \(2016\)](#page-7-20) found Fusobacterium in all liver abscess samples collected from feedlot cattle using culture-based microbiological techniques. Historically, others have identifed Fusobacterium within nearly all liver abscess samples collected from commercial processing facilities using culture-based microbiological techniques [\(Newsom, 1938;](#page-8-19) [Simon and Stovell, 1971\)](#page-9-8).

<span id="page-4-20"></span><span id="page-4-17"></span><span id="page-4-5"></span><span id="page-4-4"></span>*Trueperella pyogenes* has been identifed as the second most frequently cultured microbe from liver abscess purulent material ([Berg and Scanlan, 1982](#page-7-21); [Nagaraja et al.,](#page-8-21) [1996](#page-8-21)). *T. pyogenes* is an opportunistic, Gram-positive bacterium known to inhabit ruminant gastrointestinal tracts [\(Ribeiro et al., 2015](#page-8-23)). In the current study, the genus *Trueperella* was found more frequently within liver abscesses from naturally managed cattle (14 of 62; 23%) than traditionally managed cattle (3 of 53; 6%; [Table 1\)](#page-4-0). ANCOM testing identifed *Trueperella* as the only genus that was differentially abundant within liver abscesses of steers managed in traditional and natural programs ( $W = 6$ ). This result is likely associated with traditionally managed cattle receiving an ionophore and tylosin phosphate, a macrolide antibiotic that acts as a bacteriostat against Gram-positive

<span id="page-4-11"></span><span id="page-4-10"></span><span id="page-4-6"></span>bacteria [\(Hof, 1994\)](#page-8-24). However, in a previous study, *T. pyogenes* was isolated more often in liver abscesses of cattle fed tylosin compared to cattle not fed tylosin [\(Nagaraja et](#page-8-22)  [al., 1999](#page-8-22)). [Weinroth et al. \(2017\)](#page-9-1) identifed *T. pyogenes* in all liver abscesses sampled by molecular techniques (using greater sequencing depth than the current study), regardless of cattle management program. Given the variability of previous results, it is likely that the presence of *Trueperella* within liver abscesses of feedlot cattle is not solely dependent on the inclusion of tylosin in the diet. In the current study, *Trueperella* comprised only 0.13% of all sequences identifed, indicating limited presence of *Trueperella* within liver abscesses of the observed population.

## Rare taxa

<span id="page-4-21"></span><span id="page-4-15"></span><span id="page-4-13"></span><span id="page-4-12"></span><span id="page-4-9"></span><span id="page-4-8"></span>Bacteria known to inhabit the ruminant gastrointestinal tract were found as rare taxa within liver abscess microbial communities. Relative abundances of rare taxa are summarized in [Supplementary Table S2.](http://academic.oup.com/jas/article-lookup/doi/10.1093/jas/skac252#supplementary-data) Families Ruminococcaceae and Prevotellaceae were identifed in 26% and 3% of all liver abscesses, respectively. Ruminococcus and Prevotella genera are commonly identifed as constituents of the rumen microbiota ([Firkins and Yu, 2015;](#page-8-25) [Henderson et al., 2015;](#page-8-26) [Ozbayram](#page-8-15)  [et al., 2018;](#page-8-15) [Holman and Gzyl, 2019\)](#page-8-27). The genus Treponema was identifed in 9% of all liver abscesses and has been found in the rumen, specifcally on the rumen epithelium ([Stanton](#page-9-11)  [and Canale-Parola, 1980](#page-9-11); [Liu et al., 2016](#page-8-28)). Campylobacter was found within 10 liver abscesses and composed 0.28% of all reads. Campylobacter has been previously identifed in bovine liver abscesses [\(Weinroth et al., 2017](#page-9-1)) and has been found more prevalently on rumen epithelium as a commensal organism than in rumen contents or feces ([Liu et al., 2016](#page-8-28); [Pacifco et al., 2021](#page-8-29)). Generally, bacteria known to inhabit the microbial communities of the rumen epithelium were found more frequently within liver abscesses than bacteria known to strictly inhabit the rumen contents. This supports the proposed etiology of bovine liver abscesses with respect to the rumenitis-liver abscess complex described by [Jensen et al.](#page-8-20)  [\(1954\)](#page-8-20) and the hypothesis that bacteria escape the rumen by damage to epithelial tissues [\(Nagaraja et al., 1996\)](#page-8-21).

<span id="page-4-19"></span>However, many bacteria found in the rumen are also found in the lower gastrointestinal tract and feces. Ruminococcaceae and Bacteroidaceae have been found in greater relative abundance in the feces compared to the rumen ([Ozbayram et al., 2018;](#page-8-15) [Holman and Gzyl, 2019](#page-8-27)). *Turicibacter*, a genus previously identifed in fecal microbial communities ([Liu et al., 2016](#page-8-28)), was identifed in 13% of all liver

<span id="page-4-0"></span>**Table 1.** Adjusted probability' of an individual abscess from a steer managed in a natural<sup>[2](#page-4-2)</sup> or traditional<sup>3</sup> program to harbor *Fusobacterium, Bacteroides,* or *Trueperella*

Bacterial genus	Natural		Traditional		$P$ -value <sup>4</sup>
	Probability of presence, %	<b>SE</b>	Probability of presence, %	SE	
Fusobacterium <sup>5</sup>	100.00	NA	100.00	NA	NA
<i>Bacteroides</i>	95.56	3.422	94.71	4.326	0.850
Trueperella	23.82	8.676	4.71	3.316	0.022

<span id="page-4-1"></span>1 Adjusted probability generated by transforming the odds estimated by logistic regression to a probability scale.

<span id="page-4-2"></span>2 Program included no growth-promoting technologies or antimicrobials.

<span id="page-4-3"></span>3 Program included hormonal implants, tylosin phosphate, monensin, ractopamine hydrochloride, and treatment with antimicrobials when necessary. 4 *P-*value for the test of the log odds ratio between natural and traditional management programs.

5 No logistic regression analysis performed given *Fusobacterium* presence in all liver abscesses; unadjusted prevalence presented.

abscesses. Additionally, *Romboutsia* and *Clostridium sensu stricto 1*, bacteria known to colonize the hindgut in ruminants as early as immediately after birth, were identifed in 10% and 11% of all liver abscesses, respectively [\(Alipour](#page-7-22)  [et al., 2018](#page-7-22)).

<span id="page-5-4"></span><span id="page-5-1"></span>Rare genera identifed in the liver abscess samples included bacteria of the Ruminococcaceae, Provotellaceae, Clostridiaceae 1, Spirochaetaceae, Erysipelotrichaceae, and Peptostreptococcaceae families; the same families were also identifed in fecal samples from the same population of steers (Fuerniss et al., unpublished data). While greater taxonomic resolution is needed to identify potential homology between taxa present within both feces and liver abscess purulent material, the results suggest that escape of bacteria from the hind gut could be a factor in the formation of polymicrobial liver abscesses. In theory, intestinal epithelial damage from acidosis could allow passage of microbes into the portal blood [\(Oba and](#page-8-30)  [Wertz-Lutz, 2011](#page-8-30)). [Gressley et al. \(2011\)](#page-8-31) suggested that hindgut epithelium might be more susceptible to damage caused by fermentation products compared with ruminal epithelium due to the lack of salivary fow, limited protozoa, and fewer epithelial layers. [Thoefner et al. \(2004\)](#page-9-12) induced ruminal acidosis in dairy heifers and observed mild signs of infammation in the cecum and upper colon upon postmortem examination. Acidosis in feedlot cattle fed high-concentrate diets could contribute to liver abscess formation by compromising the barrier function of the epithelium of the hind gut and promoting microbial translocation to the liver.

# <span id="page-5-6"></span>Alpha diversity within liver abscess microbial communities

Alpha diversity did not differ between liver abscess purulent material from steers managed in traditional and natural programs when measured as richness ( $P = 0.488$ ; [Figure 2A\)](#page-5-0) or Shannon Diversity Index ( $P = 0.356$ ; [Figure 2B](#page-5-0)). Numerically, a slightly greater mean number of ASV and slightly

greater mean Shannon Diversity Index value were found within liver abscesses microbiota from naturally managed steers in comparison to those of traditionally managed steers. Richness of liver abscess communities between pens was also similar ( $P = 0.855$ ) with a range of mean richness values per pen between 5.13 and 7.22 ASV. Similarly, Shannon Diversity Index of liver abscess communities was also similar ( $P = 0.495$ ) between pens with a range of mean Shannon Diversity Index values per pen between 0.83 and 1.30.

<span id="page-5-7"></span><span id="page-5-5"></span><span id="page-5-3"></span><span id="page-5-2"></span>Alpha diversity of the liver abscess purulent material observed in this study was considerably lesser than values previously observed for rumen or fecal samples ([Shanks et](#page-9-13) [al., 2011;](#page-9-13) [Yang et al., 2016](#page-9-14); [Azad et al., 2019](#page-7-23)). However, similarly low levels of alpha diversity were found in bovine liver abscesses by [Amachawadi et al. \(2021\)](#page-7-6) and [Stotz et al. \(2021\).](#page-9-2) Since abscesses develop from a specifc insult to the body from an etiological agent or agents, dominance by the etiological agent is expected in abscess microbial communities. Microbial dominance and diversity are antagonistic which supports lesser alpha diversity for abscess communities. Still, the relative abundances of minor genera (anything other than *Fusobacterium* or *Bacteroides*) observed in this study was less than that of previous studies.

# Beta diversity between liver abscess microbial communities

Using UniFrac phylogenetic distances to compare microbiota, differences between purulent material microbial communities were not observed when compared by management program for unweighted  $(P = 0.169)$  and weighted  $(P = 0.799)$ metrics. However, differences in microbiota were observed between individual pens by unweighted UniFrac  $(P = 0.013)$ . Variation between pens was expected due to the intrinsic pen-specifc factors including ranch of origin, contemporary environment, and feeding behaviors. Unweighted UniFrac



<span id="page-5-0"></span>Figure 2. Alpha diversity, depicted as richness (A) and Shannon Diversity Index (B), of the bacterial communities within liver abscess purulent material from steers in a single feedlot within natural (*N* = 62) and traditional (*N* = 53) management programs.

<span id="page-6-2"></span>is sensitive to presence and absence of rare taxa ([Lozupone](#page-8-9) [and Knight, 2005](#page-8-9)) and indicated that the observed differences in diversity of liver abscess microbiota between pens were driven by the presence or absence of unique taxa that could be associated with pen-specifc factors such as cattle source, prefeedlot management, and pen dynamics. However, differences in microbiota were not observed between individual pens by weighted UniFrac ( $P = 0.067$ ). Weighted UniFrac analysis [\(Lozupone et al., 2007\)](#page-8-10) accounts for the ecological mass-ratio hypothesis which implies that community dynamics are largely infuenced by dominant species and are insensitive to the abundance of rare taxa ([Grime, 1998\)](#page-8-32). Applied to the context of the fndings of this study, the abundance of Fusobacterium and Bacteroides (combined average relative abundance of 98%) characterize major differences in liver abscess microbial communities. Together, unweighted and weighted UniFrac results suggest more variation in abscess communities between pens than between feedlot management programs, especially regarding rare taxa. As such, pen-specifc factors such as cattle source, prefeedlot management, intake patterns, and health challenges should be considered in future studies, especially in large-pen, population-based designs.

To investigate the difference between abscesses regardless of management program, K-means clusters were evaluated. Two distinct K-means clusters were observed [\(Figure 3](#page-6-0)). K-means cluster 1 included 20 abscess communities from naturally managed cattle and 20 microbial communities from traditionally managed cattle. K-means cluster 2 included 42 abscess communities from naturally managed cattle and 33 microbial communities from traditionally managed cattle. No interaction was observed between K-means cluster and management program  $(P = 0.079)$  by PERMANOVA testing of unweighted UniFrac distances. The relative abundances of genera within each cluster are visualized in [Figure 4](#page-6-1), and rare genera are summarized in [Supplementary Table S3](http://academic.oup.com/jas/article-lookup/doi/10.1093/jas/skac252#supplementary-data). *Fusobacterium* relative abundance was greater in K-means cluster 2



Axis 1 (51.46%)

<span id="page-6-0"></span>**Figure 3.** Principal coordinate analysis of liver abscess communities from steers managed naturally (no growth-promoting technologies or antimicrobials) or traditionally (with hormonal implants, tylosin phosphate, monensin, ractopamine hydrochloride, and treatment with antimicrobials when necessary). Microbiota of liver abscess samples from naturally managed cattle was similar to microbiota of liver abscess samples from traditionally managed cattle based on PERMANOVA analysis of unweighted UniFrac distances (*P* = 0.169). Microbiota of liver abscess samples in K-means group 1 differed from microbiota of liver abscess samples in K-means group 2 based on PERMANOVA analysis of unweighted UniFrac distances (*P* = 0.001).



<span id="page-6-1"></span>**Figure 4.** Average taxonomic composition (% relative abundance) of the bacterial communities within liver abscesses from steers in a single feedlot by K-means cluster assignment [\(Figure 3](#page-6-0)). K-means cluster 1 included 40 samples, and K-means cluster 2 included 75 samples.

(ANCOM  $W = 37$ ; 79% vs. 39% relative abundance) while *Bacteroides* relative abundance was greater in K-means cluster 1 (ANCOM  $W = 37$ ; 58% vs. 20% relative abundance). While *Porphyromonas* relative abundance was not statistically different between K-means clusters, mean relative abundance in K-means cluster 1 was 5% and mean relative abundance in K-means cluster 2 was 0%. While generally more rare taxa were observed in K-means cluster 1, alpha diversity measured as Shannon Diversity Index was not different between K-means clusters (*P* = 0.307).

<span id="page-6-3"></span>Divergence of liver abscess communities, particularly those dominated by Fusobacteria and Bacteroidetes, was recently reported by [Stotz et al. \(2021\)](#page-9-2) and [Pinnell et al.](#page-8-33)  [\(2022\)](#page-8-33). The fndings of the present study are consistent with that of previous authors who found greater relative abundance of *Bacteroides* within liver abscess communities than previously reported. The work of [Pinnell et al.](#page-8-33)  [\(2022\)](#page-8-33) suggested that *Bacteroides*-dominated abscess communities could be linked to more distal portions of the gastrointestinal tract (the cecum through rectum) than *Fusobacterium*-dominated abscess communities. The rare taxa observed in numerically greater relative abundance in *Bacteroides-*dominated K-means cluster 1 are consistent with the genera discriminant of *Bacteroides*-dominated liver abscesses reported by [Pinnell et al. \(2022\)](#page-8-33). While the results of this study and previous reports suggested a role of the hind gut in liver abscess occurrence, further research is needed with microbiota comparisons between body sites of individual animals to defnitively link gastrointestinal microbiota to liver abscess communities.

## **Summary**

In this observational study, *Fusobacterium* and *Bacteroides* appeared to dominate the microbial communities of liver abscess purulent material and could be linked to different portions of the gastrointestinal tract. The liver abscess microbial communities characterized in this study were much simpler than in previously published studies, emphasizing the need for further investigation. Though management program did not infuence the diversity of the microbiota of the liver abscess, *Trueperella* was found more frequently within liver abscesses from steers managed in the natural program (without

exposure to tylosin phosphate). Rare taxa identifed suggest a link between the microbiota of the gastrointestinal tract and the microbiota of the liver abscess purulent material. Regardless of the program, steers managed within the same feedlot had similar liver abscess microbiota. Further research is needed to evaluate the routes of entry of gastrointestinalassociated bacteria into the liver. Particularly, the microbiota of the rumen and hindgut epithelial tissues should be evaluated in greater taxonomic depth and compared to bacteria found within the liver abscess.

# **Supplementary Data**

Supplementary data are available at Journal of Animal Science online.

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# **Confict of Interest Statement**

J.A. Scanga serves as an affliate faculty member of Colorado State University and is employed by Meyer Natural Foods (Loveland, Colorado). Meyer Natural Foods was not involved in this research. All other authors declare no confict of interest.

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