Persistent cross-species transmission systems dominate Shiga toxin-

producing *Escherichia coli* O157:H7 epidemiology in a high incidence

region: a genomic epidemiology study

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Keywords: *E. coli* O157, STEC, genomic epidemiology, zoonosis

ABSTRACT

BACKGROUND

Several areas of the world suffer notably high incidence of Shiga toxin-producing *Escherichia*

coli, among them Alberta, Canada. We assessed the role of persistent cross-species transmission

systems in Alberta's *E. coli* O157:H7 epidemiology.

METHODS

We sequenced and assembled 229 *E. coli* O157:H7 isolates originating from collocated cattle

(n=108) and human (n=121) populations from 2007-2015 in Alberta. We constructed a timed

phylogeny using BEAST2 using a structured coalescent model. We then extended the tree with

human isolates through 2019 (n=432) to assess the long-term disease impact of local persistent

lineages. Shiga toxin gene (*stx*) profile was determined for all isolates.

RESULTS

During 2007 to 2015, we estimated 107 (95% HPD 101, 111) human lineages arose from cattle

lineages, and 31 (95% HPD 22, 43) from other human lineages; i.e., 77.5% of human lineages

arose from cattle lineages. We identified 11 persistent lineages local to Alberta, which were

associated with 36.4% (95% CI 27.8%, 45.6%) of human isolates. Of 115 isolates in local

persistent lineages, 6.1% carried only *stx2a* and the rest *stx1a/stx2a*. During the later period, six

local persistent lineages continued to be associated with human illness, including 74.7% (95% CI

68.3%, 80.3%) of reported cases in 2018 and 2019. The *stx* profile of isolates in local persistent

lineages shifted from the earlier period, with 51.2% encoding only *stx2a*.

CONCLUSIONS

Our study identified multiple locally evolving lineages transmitted between cattle and humans

persistently associated with *E. coli* O157:H7 illnesses for up to 13 years. Of concern, there was a

dramatic shift in the local persistent lineages toward strains with the more virulent *stx2a*-only

profile. We hypothesize that the large proportion of disease associated with local transmission

systems is a principal cause of Alberta's high *E. coli* O157:H7 incidence.

INTRODUCTION

Several areas around the globe experience exceptionally high incidence of Shiga toxin-producing

Escherichia coli (STEC), including the virulent serotype *E. coli* O157:H7. These include

Scotland,[1] Ireland,[2] Argentina,[3] and the Canadian province of Alberta.[4] All are home to large

populations of agricultural ruminants, STEC's primary reservoir. However, there are many

regions with similar ruminant populations where STEC incidence is unremarkable. What

differentiates high risk regions is unclear. Moreover, with systematic STEC surveillance only

conducted in limited parts of the world,[5] there may be unidentified regions with exceptionally

high disease burden.

STEC infections can arise from local reservoirs, transmitted through food, water, direct animal

contact, or contact with contaminated environmental matrices. The most common reservoirs

include domesticated ruminants such as cattle, sheep, and goats. While STEC has been isolated

from a variety of other animal species and outbreaks have been linked to species such as deer[6]

and swine,[7] it is unclear what roles they play as maintenance or intermediate hosts. STEC

infections can be imported through food items traded nationally and internationally, as has been

seen with *E. coli* O157:H7 outbreaks in romaine lettuce from the United States.[8] Secondary

transmission is believed to cause approximately 15% of cases, but the pathogen is not believed to

be sustained long-term through person-to-person transmission alone.[9,10]

The mix of STEC infection sources in a region directly influences public health measures needed

to control disease burden. Living near cattle and other domesticated ruminants has been linked to

STEC incidence, particularly for *E. coli* O157:H7.[2,11-15] These studies suggest an important role

for local reservoirs in STEC epidemiology. A comprehensive understanding of STEC's disease

ecology would enable more effective investigations into potential local transmission systems and

ultimately their control. Here, we take a phylodynamic, genomic epidemiology approach to more

precisely discern the role of the cattle reservoir in the dynamics of *E. coli* O157:H7 human

infections. We focus on the high incidence region of Alberta, Canada to provide insight into

characteristics that make the pathogen particularly prominent in such regions.

METHODS

METHODS

STUDY DESIGN AND POPULATION

We conducted a multi-host genomic epidemiology study in Alberta, Canada. Our primary

analysis focused on 2007 to 2015 due to the availability of isolates from intensive provincial

cattle studies.[16-19] To select both cattle and human isolates, we block randomized by year to

ensure representation across the period. We define isolates as single bacterial species obtained

from culture. We sampled 123 *E. coli* O157 cattle isolates from 4,660 available. Selected cattle

isolates represented 7 of 12 cattle study sites and 56 of 89 sampling occasions from the source

studies.[16-19] Samples were taken from fecal pats, rectal grabs, and hide swabs from cattle in

feedlots and fecal samples from transport trucks. We sample 123 of 1,148 *E. coli* O157 isolates

collected from cases reported to the provincial health authority (Alberta Health) during the

corresponding time period (Supplemental Information).

In addition to the 246 isolates for the primary analysis, we contextualized our findings with three

additional sets of *E. coli* O157:H7 isolates (Figure 1): 445 from Alberta Health from 2009 to

2019 and already sequenced as part of other public health activities; 152 from the U.S. from

1999 to 2016; and 54 from elsewhere around the world between 2007 and 2015. The additional

Alberta Health isolates were sequenced by the National Microbiology Laboratory (NML)-Public

Health Agency of Canada (Winnipeg, Manitoba, Canada) as part of PulseNet Canada activities.

Isolates sequenced by the NML for 2018 and 2019 constituted the majority of reported *E. coli*

O157:H7 cases for those years (217 of 247; 87.9%). U.S. isolates were considered separately

from other global isolates, as the U.S. is Alberta's most frequent international trade partner, with

both processed beef and live cattle crossing the border. U.S. isolates from 1999 to 2009 and

global isolates were identified from previous literature,[20] and U.S. isolates from 2010 to 2016

were randomly selected from *E. coli* O157:H7 sequences available through the U.S. CDC's

PulseNet BioProject PRJNA218110.

This study was approved by the University of Calgary Conjoint Health Research Ethics Board,

#REB19-0510. A waiver of consent was granted, and all case data were deidentified.

WHOLE GENOME SEQUENCING, ASSEMBLY, AND INITIAL PHYLOGENY

The 246 isolates for the primary analysis were sequenced using Illumina NovaSeq 6000 and

assembled into contigs using the Unicycler v04.9 pipeline, as described previously (BioProject

PRJNA870153).[21] Raw read FASTQ files were obtained from Alberta Health for the additional

445 isolates sequenced by the NML and from NCBI for the 152 U.S. and 54 global sequences.

We used the SRA Toolkit v3.0.0 to download sequences for U.S. and global isolates using their

BioSample (i.e. SAMN) numbers. The corresponding FASTQ files could not be obtained for 6

U.S. and 7 global isolates we had selected (Figure 1).

PopPUNK v2.5.0 was used to cluster Alberta isolates and identify any outside the O157:H7

genomic cluster (Supplemental Figure S1).[22] For assembling and quality checking (QC) all

sequences, we used the Bactopia v3.0.0 pipeline.[23] This pipeline performed an initial QC step on

the reads using FastQC v0.12.1, which trimmed adapters and read ends with quality lower than 6

and discarded reads after trimming with overall quality scores lower than 10. None of the isolates

were eliminated during this step for low read quality. We used the Shovill v1.1.0 assembler

within the Bactopia pipeline to *de novo* assemble the Unicycler contigs for the primary analysis

and raw reads from the supplementary datasets. Bactopia generated a quality report on the

assemblies, which we assessed based on number of contigs (<500), genome size (≥5.1 Mb), N50

(>30,000), and L50 (≤50). Low-quality assemblies were removed. This included 1 U.S.

sequence, for which 2 FASTQ files had been attached to a single BioSample identifier; the other

sequence for the isolate passed all quality checks and remained in the analysis. Additionally, 16

sequences from the primary analysis dataset and 4 from the extended Alberta data had a total

length <5.1 Mb. These sequences corresponded exactly to those identified by the PopPUNK

analysis to be outside the primary *E. coli* O157:H7 genomic cluster. Finally, although all isolates

were believed to be of cattle or clinical origin during initial selection, detailed metadata review

identified 1 isolate of environmental origin in the primary analysis dataset and 8 that had been

isolated from food items in the extended Alberta data. These were excluded. We used

STECFinder v1.1.0[24] to determine Shiga toxin gene (*stx*) profile and confirm the *E. coli*

O157:H7 serotype using the *wzy* or *wzx* O157 O-antigen genes and detection of the H7 H-

antigen. After processing, we had 229 isolates (121 human, 108 cattle) in our primary sample,

432 additional Alberta Health isolates, 146 U.S. isolates, and 47 global isolates (Figure 1,

Supplemental Data File).

Bactopia's Snippy workflow, which incorporates Snippy v4.6.0, Gubbins v3.3.0, and IQTree

v2.2.2.7, followed by SNP-Sites v2.5.1, were used to generate a core genome SNP alignment

with recombinant blocks removed. The maximum likelihood phylogeny of the core genome SNP

alignment generated by IQTree was visualized in Microreact v251. The number of core SNPs

between isolates was calculated using PairSNP v0.3.1. Clade was determined based on the

presence of at least one defining SNP for the clade as published previously.[25] Isolates were

identified to the subclade level [e.g. G(vi)] when both clade and subclade SNPs were present and

the clade level (e.g. G) when only clade SNPs were present.

PHYLODYNAMIC AND STATISTICAL ANALYSES

For our primary analysis, we created a timed phylogeny, a phylogenetic tree on the scale of time,

in BEAST2 v2.6.7 using the structured coalescent model in the Mascot v3.0.0 package with

demes for cattle and humans (Supplemental Table S1). The analysis was run using four different

seeds to confirm that all converged to the same solution, and tree files were combined before

generating a maximum clade credibility (MCC) tree. State transitions between cattle and human

isolates over the entirety of the tree, with their 95% highest posterior density (HPD) intervals,

were also calculated from the combined tree files. We determined the influence of the prior

assumptions on the analysis (Supplemental Table S1) with a run that sampled from the prior

distribution (Supplemental Figure S2, Supplemental Information).

Local persistent lineages (LPLs) were identified based on following criteria: 1) a single lineage

of the MCC tree with a most recent common ancestor (MRCA) with ≥95% posterior probability;

2) all isolates <30 core SNPs from one another; 3) contains at least 1 cattle isolate; 4) contains ≥5

isolates; and 5) the isolates were collected at sampling events (for cattle) or reported (for

humans) over a period of at least 1 year. From non-LPL isolates, we estimated the number of

local transient isolates vs. imported isolates. For the 121 human *E. coli* O157:H7 isolates in the

primary sample, we determined what portion belonged to local persistent lineages (LPL) and

what portion were likely to be from local transient *E. coli* O157:H7 populations vs. imported. We

first defined the LPLs as described in the main text. Human isolates within the LPLs were then

enumerated (n=44). The 77 human isolates outside LPLs included 58 clade G(vi) isolates and 19

non-G(vi) isolates. Based on the maximum clade credibility (MCC) tree from the primary

analysis, none of the non-G(vi) human isolates was likely to have been closely related to an

isolate from the Alberta cattle population, suggesting that all 19 were imported. As a proportion

of all non-LPL human isolates, these 19 constitute 24.7%. While it may be possible that all clade

G(vi) isolates are part of a local evolving lineage, it is also possible that exchange of both cattle

and food from other locations is causing the regular importation of clade G(vi) strains and

infections. Thus, we used the proportion of non-LPL human isolates outside the G(vi) clade to

estimate the proportion of non-LPL human isolates within the G(vi) clade that were imported:

$58 \times 24.7\% = 14$. This left an estimated 44 (36.4%) human isolates associated with infections

from transient local strains, a combined 33 (27.3%) associated with imported infections, and 44

(36.4%) associated with infections from persistent local strains. Conducting a similar exercise on

the 108 *E. coli* O157:H7 isolates from cattle in the primary sample, we estimated 26 (24.1%)

were associated with transmission with transient strains, 11 (10.2%) were imported, and 71

(65.7%) were associated with transmission with persistent strains.

To contextualize our results in terms of ongoing human disease burden, we created a timed

phylogeny using a constant, unstructured coalescent model of the 229 Alberta isolates from the

primary analysis and the additional Alberta Health isolates. Outbreaks were down-sampled to

avoid biasing the tree by randomly selecting 1 to 2 isolates per outbreak; as such, only 230 of the

432 additional isolates were included in the analysis (Supplemental Table S1). We identified

LPLs as above, and leveraged the near-complete sequencing of isolates from 2018 and 2019 to

calculate the proportion of reported human cases associated with LPLs.

We created a timed phylogeny of Alberta isolates and U.S. isolates from 1996 to 2016 to test

whether the LPLs or Alberta's dominant *E. coli* O157:H7 clade (G) were linked to U.S. ancestors

(Supplemental Table S1). We also created a timed phylogeny of temporally overlapping Alberta,

U.S., and global isolates from 2007 to 2015, excluding clades A and B, which were too limited to

make meaningful comparisons.

All BEAST2 analyses were run for 100,000,000 Markov chain Monte Carlo iterations or until all

parameters converged with effective sample sizes >200, whichever was longer. Exact binomial

95% confidence intervals (CIs) were computed for proportions.

RESULTS

RESULTS

Across the 854 isolates included in the analyses, we identified 11,234 core genome SNPs. The

monophyletic clade G(vi) constituted 74.4% (n=635) of all isolates (Figure 2). The majority of

all Alberta isolates belonged to the G(vi) clade (582 of 661; 88.0%), compared to 51 (34.9%) of

the U.S. isolates and 2 (4.3%) of the global isolates (Table 1). There were 487 (76.7%) clade

G(vi) isolates with the *stx1a/stx2a* profile, compared to 1 (0.5%) among the 219 isolates outside

the G(vi) clade.

THE MAJORITY OF CLINICAL CASES EVOLVED FROM LOCAL CATTLE LINEAGES

In our primary sample of 121 human and 108 cattle isolates from Alberta from 2007 to 2015,

SNP distances were comparable between species (Figure 3a). Among sampled human cases, 19

(15.7%; 95% CI 9.7%, 23.4%) were within 5 SNPs of a sampled cattle strain.

The phylogeny generated by our primary structured coalescent analysis indicated cattle were the

primary reservoir, with a high probability that the hosts at nodes along the tree's backbone were

cattle (Figure 3b). The root was estimated at 1812 (95% HPD 1748, 1870). The most recent

common ancestor (MRCA) of clade G(vi) strains in Alberta was inferred to be a cattle strain,

dated to 1971 (95% HPD 1961, 1980). With our assumption of a relaxed molecular clock, the

mean clock rate for the core genome was estimated at 1.00×10^{-4} (95% HPD 8.45×10^{-5}, 1.18×10^{-4})

substitutions/site/year. The effective population size, N_e, of the human *E. coli* O157:H7

population was estimated as 913 (95% HPD 620, 1232), and for cattle as 49 (95% HPD 32, 67).

We estimated 107 (95% HPD 101, 111) human lineages arose from cattle lineages, and 31 (95%

HPD 22, 43) arose from other human lineages (Figure 3c). In other words, 77.5% of human

lineages arose from cattle lineages. We observed minimal influence of our choice of priors

(Supplemental Figure S2, Supplemental Text).

LOCAL PERSISTENT LINEAGES ACCOUNT FOR THE MAJORITY OF ONGOING HUMAN DISEASE

In our primary analysis, we identified 11 local persistent lineages (LPLs) (Figure 3b). LPLs

included a range of 5 (G(vi)-AB LPLs 9 and 10) to 26 isolates (G(vi)-AB LPL 2), with an

average of 10. LPLs tended to be clustered on the MCC tree. G(vi)-AB LPLs 1-4, 6-8, and 9 and

10 were clustered with MRCAs inferred at 1997 (95% HPD 1993, 2000), 1998 (95% HPD 1995,

2001), and 1996 (95% HPD 1993, 1999), respectively. Cattle were the inferred host of all three

ancestral nodes.

LPLs included 71 of 108 (65.7%; 95% CI 56.0%, 74.6%) cattle and 44 of 121 (36.4%; 95% CI

27.8%, 45.6%) human isolates. Of the remaining human isolates, 33 (27.3%) were associated

with imported infections and 44 (36.4%) with infections from transient local strains

(Supplemental Text). Of the remaining cattle isolates, 11 (10.2%) were imported and 26 (24.1%)

were associated with transmission from transient strains. Of the 115 isolates in LPLs, 7 (6.1%)

carried only *stx2a*, and the rest *stx1a/stx2a*. Among the 114 non-LPL isolates, 27 (23.7%) were

stx2a-only, 1 (0.9%) was *stx1a*-only, 6 (5.3%) were *stx1a/stx2c*, and the remaining 80 (70.2%)

were *stx1a/stx2a*.

To understand long-term persistence, we expanded the phylogeny with additional Alberta Health

isolates from 2009 to 2019 (Supplemental Table S1). Six of the 11 LPLs identified in our

primary analysis continued to cause disease during the 2016 to 2019 period (Figure 4a). With

most of the cases reported during 2018 and 2019 sequenced, we were able to estimate the

proportion of reported *E. coli* O157:H7 associated with LPLs. Of 217 sequenced cases reported

during these two years, 162 (74.7%; 95% CI 68.3%, 80.3%) arose from Alberta's LPLs. The *stx*

profile of LPL isolates shifted as compared to the primary analysis, with 83 (51.2%) of the LPL

isolates encoding only *stx2a* and the rest *stx1a/stx2a* (Figure 4b). Among the 55 non-LPL

isolates during 2018-2019, the *stx2c*-only profile emerged with 16 (29.1%) isolates, and *stx2a*-

only was found in only 6 (10.9%) cases.

All 5 large (≥10 cases) sequenced outbreaks in Alberta during the study period were within clade

G(vi). LPLs gave rise to 3 large outbreaks, accounting for 117 cases, including 83 from an

extended outbreak by a single strain, defined as isolates within 5 SNPs of one another, during

2018 and 2019 (Figure 4a). The two large outbreaks that did not arise from LPLs both occurred

in 2014 and were responsible for 164 cases.

INTERNATIONAL IMPORTATION DOES NOT EXPLAIN ALBERTA'S CURRENT DISEASE BURDEN

Only 2 U.S. isolates coincided with Alberta LPLs, specifically G(vi)-AB LPL 9 in 2014 and

G(vi)-AB LPL 11 in 2015 (Supplemental Figure S3). Isolates in these two LPLs from Alberta

dated to 2007 and 2009, respectively, and were identified multiple times up to and including

during the 2018-2019 period (Figure 4a). There was no evidence of early U.S. ancestors of LPLs.

No LPL contained a global isolate. Based on migration events calculated from the tree, we

estimated that 15.4% of combined human and cattle Alberta lineages were imported

(Supplemental Table S2). Sequences from outside North America were separated from Alberta

sequences by a median of 325 (IQR 288-349) SNPs. Including U.S. and global isolates in the

phylogeny did not alter the LPLs identified, though some minor rearrangement of the tree was

observed (Supplemental Figure S3).

DISCUSSION

Focusing on a region that experiences an especially high incidence of STEC, we conducted a deep genomic epidemiologic analysis of *E. coli* O157:H7's multi-host disease dynamics. Our study identified multiple locally evolving lineages transmitted between cattle and humans. These were persistently associated with *E. coli* O157:H7 illnesses over periods of up to 13 years. Of clinical importance, there was a dramatic shift in the *stx* profile of the strains arising from local persistent lineages toward strains carrying only *stx2a*, which has been associated with increased progression to hemolytic uremic syndrome (HUS).[26] We hypothesize that the large proportion of cases associated with local transmission systems is a principal cause of Alberta's high *E. coli* O157:H7 incidence.

Our study has provided quantitative estimates of cattle-to-human migration in a high incidence region, the first such estimates of which we are aware. Our estimates are consistent with prior work that established an increased risk of STEC associated with living near cattle.[2,11-15] We showed that 77% of strains infecting humans arose from cattle lineages. These transitions can be seen as a combination of the historic evolution of *E. coli* O157:H7 from cattle in the rare clades and the infection of humans from local cattle or cattle-related reservoirs in clade G(vi). While our findings indicate the majority of human cases arose from cattle lineages, transmission may have involved intermediate hosts or environmental reservoirs several steps removed from the cattle reservoir. However, our analysis demonstrates that local cattle remain an integral part of the transmission system for the vast majority of cases, even when they may not be the immediate source of infection.

The cattle-human transitions we estimated were based on structured coalescent theory,[27] which

we used throughout our analyses. This approach is similar to phylogeographic methods that have

previously been applied to *E. coli* O157:H7.[20] We inferred the full backbone of the Alberta *E.*

coli O157:H7 phylogeny as arising from cattle, consistent with the postulated global spread of

the pathogen via ruminants.[20] Our estimate of the origin of the serotype, at 1812 (95% HPD

1748, 1870), was somewhat earlier than previous estimates, but consistent with global (1890;

95% HPD 1845, 1925)[20] and United Kingdom (1840; 95% HPD 1817, 1855)[28] studies that used

comparable methods. Our dating of Alberta's G(vi) clade to 1971 (95% HPD 1961, 1980) also

corresponds to proposed migrations of clade G into Canada from the U.S. in 1965-1977.[20] Our

study thus adds to the growing body of work on the larger history of *E. coli* O157:H7, providing

an in-depth examination of the G(vi) clade.

Our identification of the 11 local persistent lineages (LPLs) is significant in demonstrating that

the majority of Alberta's reported *E. coli* O157:H7 illnesses are of local origin. Our definition

ensured that every LPL had an Alberta cattle strain and at least 5 isolates separated by >1 year,

making the importation of the isolates in a lineage highly unlikely. Further supporting the

evolution of the LPLs within Alberta, all 11 LPLs were in clade G(vi), several were

phylogenetically related with MRCAs dating to the late 1990s, and few non-Alberta isolates fell

within LPLs. The two U.S. isolates associated with Alberta LPLs may reflect Alberta cattle that

were slaughtered in the U.S. Thus, we are confident that the identified LPLs represent locally

evolving lineages and potential persistent sources of disease.

Based on our LPL analysis, we estimated only 27% of human and 10% of cattle *E. coli* O157:H7

isolates were imported. This was consistent with the overall importation estimate of 15% for all

Alberta lineages from our global structured coalescent analysis. While these estimates may

appear low given the recent focus on row crops and other produce as potential vehicles of

disease,[8] 26% of sporadic STEC infections have been attributed to animal contact and the farm

environment, with a further 19% to pink or raw meat.[10] Similarly, 24% of *E. coli* O157 outbreaks

in the U.S. were attributed to beef, animal contact, water, or other environmental sources.[9] In

Alberta, these are all inherently local exposures, given that 90% of beef consumed in Alberta is

produced and/or processed there. Even person-to-person transmission, responsible for 15% of

sporadic cases and 16% of outbreaks,[9,10] includes secondary transmission from cases infected

from local sources, which may explain our estimate of 23% for person-to-person transmission.

To our knowledge, our study provides the first comprehensive determination of local vs.

imported status for *E. coli* O157:H7 cases. Similar studies in regions of both high and moderate

incidence would provide further insight into the role of localization on *E. coli* O157:H7

incidence.

Of the 11 lineages we identified as LPLs during the 2007-2015 period, 6 were also identified in

the 2016-2019 period. During the initial period, 36% of human cases were linked to an LPL, and

6.1% carried only *stx2a*. The risk of HUS increases in strains of STEC carrying only *stx2a*,

relative to *stx1a/stx2a*,[26] meaning the earlier LPL population had few of the high-virulence

strains. In 2018 and 2019, the 6 long-term LPLs were associated with both greater incidence and

greater virulence, encompassing 75% of human cases with more than half of LPL isolates

carrying only *stx2a*. The cause of this shift remains unclear, though shifts toward greater

virulence in *E. coli* O157:H7 populations have been seen elsewhere.[29] The growth and diversity

of G(vi)-AB LPL 1 and G(vi)-AB LPL 6 in the later period suggest these lineages were in stable

reservoirs or adapted easily to new niches. Identifying these reservoirs could yield substantial

insights into disease prevention, given the significant portion of illnesses caused by persistent

strains.

We developed a novel measure of persistence for use in this study, specifically for the purposes

of identifying lineages that pose an ongoing threat to public health in a specific region.

Persistence has been defined variably in the literature, for example as shedding of the same strain

for at least 4 months.[30] Most recently, the U.S. CDC has identified the first Recurring, Emergent,

and Persistent (REP) STEC strain, REPEXH01, which has been detected since 2017 in over 600

cases. REPEXH01strains are within 21 allele differences of one another

(https://www.cdc.gov/ncezid/dfwed/outbreak-response/rep-strains/repexh01.html). Given that we

used high resolution SNP analysis rather than MLST, we used a difference of <30 SNPs to

define persistent lineages. Supporting the persistence we have observed, the REPEXH01 strain is

also an *E. coli* O157:H7 strain; however, O157:H7 was defined as sporadic in a German study

using the 4-month shedding definition, which may be due to ecological differences.[30]

Understanding microbial drivers of persistence is an active field of research, with early findings

suggesting a correlation of STEC persistence to the accessory genome and traits such as biofilm

formation and nutrient metabolism.[30,31] Our approach to studying persistence was specifically

designed for longitudinal sampling in high-incidence regions and may be useful for others

attempting to identify sources that disproportionately contribute to disease burden.

Our analysis was limited to only cattle and humans. However, small ruminants (e.g., sheep,

goats) have also been identified as important STEC reservoirs,[12,15,25] and Alberta has experienced

outbreaks linked to swine.[7] Had isolates from a wider range of potential reservoirs been

available, we would have been able to elucidate more clearly the roles that various hosts and

common sources of infection play in local transmission. This may help explain the 3 human-to-

cattle predicted transmissions, which could be erroneous. We also limited our analysis only to *E.*

coli O157:H7 despite the growing importance of non-O157 STEC as historical multi-species

collections of non-O157 isolates are lacking. As serogroups differ meaningfully in exposures,[32]

our results may not be generalizable beyond the O157 serogroup. Finally, we were not able to

estimate the impact of strain migration between Alberta and the rest of Canada, because

metadata for publicly-available *E. coli* O157:H7 sequences from Canada was limited, such that

we could not be sure they were from outside Alberta.

E. coli O157:H7 infections are a pressing public health problem in many high incidence regions

around the world including Alberta, where a recent childcare outbreak caused >300 illnesses. In

the majority of sporadic cases, and even many outbreaks,[9] the source of infection is unknown,

making it critical to understand the disease ecology of *E. coli* O157:H7 at a system level. Here

we have identified a high proportion of human cases arising from cattle lineages and a low

proportion of imported cases. Local transmission systems, including intermediate hosts and

environmental reservoirs, need to be elucidated to develop management strategies that reduce the

risk of STEC infection. In Alberta, local transmission is dominated by a single clade, and over

the extended study period, persistent lineages caused an increasing proportion of disease. The

local lineages with long-term persistence are of particular concern because of their increasing

virulence, yet they also present opportunity as larger, more stable targets for reservoir

identification and control.

ACKNOWLEDGEMENTS

We would like to acknowledge Dr. Angela Ma, Hannah Tyrrell, and Dr. Surangi Thilakarathna for their work preparing clinical isolates for sequencing, and Dr. Jesse Berman for reviewing an early version of this manuscript.

FUNDING

Funding for this work was provided by the Beef Cattle Research Council (FOS.01.18). The sponsor had no role in the study design; collection, analysis, or interpretation of data; writing of the report; or the decision to submit the paper for publication.

DECLARATION OF INTERESTS

The authors declare no conflicts of interest.

AUTHOR CONTRIBUTIONS

Gillian A.M. Tarr: Conceptualization, Methodology, Software, Formal analysis, Data curation, Writing - Original Draft, Visualization, Funding acquisition. **Linda Chui**: Conceptualization, Methodology, Resources, Writing - Review & Editing, Supervision, Funding acquisition. **Kim Stanford**: Conceptualization, Methodology, Resources, Writing - Review & Editing, Supervision, Funding acquisition. **Emmanuel W. Bumunang**: Investigation, Data curation, Writing - Review & Editing. **Rahat Zaheer**: Methodology, Investigation, Writing - Review & Editing. **Vincent Li**: Validation, Data curation, Writing - Review & Editing. **Stephen B. Freedman**: Conceptualization, Writing - Review & Editing, Project administration, Funding acquisition. **Chad Laing**: Conceptualization, Methodology, Writing - Review & Editing,

Funding acquisition. **Tim A. McAllister**: Conceptualization, Methodology, Resources, Writing -

Review & Editing, Supervision, Project administration, Funding acquisition.

DATA SHARING STATEMENT

Data from this study not previously published will be made available at publication. Deidentified

participant data, associated NCBI accession numbers for sequence data, and an accompanying

data dictionary will be provided as an attached data supplement.

Figure 1. *E. coli* O157:H7 isolates selected for the study and included in analysis. Four sets of isolates, all originating from cattle

or humans, were included in the study.

Figure 2. Maximum likelihood core SNP tree of the 854 *E. coli* O157:H7 isolates referenced in the study. This includes 229

randomly sampled cattle and human isolates from Alberta, Canada, from 2007 through 2015; 432 additional Alberta isolates

sequenced as part of public health activities from 2009 through 2019; and 152 isolates from the U.S. and 47 isolates from elsewhere

around the globe from 1996 to 2016 to examine international transmission history. Clade is shown in the coloration of the tips on the

tree, geographic origin is shown on the inner ring, species of origin on the middle ring, and Shiga toxin gene (*stx*) profile on the outer

ring. The tree was rooted at clade A. Clade G constituted the majority of isolates.

Figure 3. Relationship of randomly selected *E. coli* O157:H7 strains isolated from 121 reported human cases and 108 beef cattle in Alberta, Canada, 2007-2015. Target diagrams show SNP distances from cattle (A, top) and humans (A, bottom) to cattle

(blue) and humans (orange), with rings labeled with the SNP distance between isolates. Cattle isolates were highly related with 53% of

cattle isolates within 5 SNPs of another cattle isolate and 83% within 15 SNPs (A, top). Human isolates showed a bimodal distribution

in their relationship to cattle isolates, with 87% within 52 SNPs of a cattle isolate and the remainder 185-396 SNPs apart (A, bottom).

The maximum clade credibility tree for the structured coalescent analysis of cattle and human isolates (B) was colored by inferred

host, cattle (blue) or human (orange). The majority of ancestral nodes inferred as cattle suggests cattle as the primary reservoir. The

root was estimated at 1812 (95% HPD 1748, 1870). Eleven local persistent lineages (LPLs) were identified, all in the G(vi) clade and

labeled G(vi)-AB LPL 1 through 11 (yellow and gray coloration highlights LPLs but has no other meaning). These accounted for 44

human (36.4%) and 71 cattle (65.7%) isolates. The structured coalescent model estimated 107 cattle-to-human state transitions

between branches, compared to only 31 human-to-human transitions, inferring cattle as the origin of 77.5% of human lineages (C).

Figure 4. Extension of Alberta, Canada *E. coli* O157:H7 analysis to include 229 randomly selected study isolates and 432 additional public health isolates available from 2009 to 2019. Six local persistent lineages (LPLs) in clade G continued to be associated with disease after the initial study period, as indicated by branches colored in orange (A). LPLs are shaded and labeled as in Figure 3. Outbreaks reported during the period were down-sampled to avoid biasing the phylogeny, and the number of cases

represented associated with each outbreak are shown in red (LPL-associated outbreaks) or purple (non-LPL-associated outbreaks) text.

In 2018 and 2019, 74.7% of reported cases were associated with an LPL. The *stx* profile across all clades shifted from the initial study

period (2007-2015) to the later study period (2016-2019), with more of the virulent *stx2a*-only profile observed in 2018 and 2019 than

in previous years (B). The peak in sequences in 2014 is due to two outbreaks; routine sequencing began in 2018 and 2019, accounting

for the rise in sequenced cases during those years.

TABLES

Table 1. Distribution of study isolates by geographic source, clade, and Shiga toxin gene (*stx*) profile

Clade	Source	*stx1a*	*stx1a/stx2a*	*stx1a/stx2c*	*stx2a*	*stx2c*	*stx2a/stx2c*	*stx2a/stx2d*	None detected	Total
G(vi)		**2**	**487**	**0**	**146**	**0**	**0**	**0**	**0**	**635**
	Alberta	0	443	0	139	0	0	0	0	582
	U.S.	2	42	0	7	0	0	0	0	51
	Global	0	2	0	0	0	0	0	0	2
Other G		**3**	**0**	**4**	**3**	**16**	**2**	**0**	**3**	**31**
	Alberta	0	0	4	0	10	1	0	0	15
	U.S.	2	0	0	0	2	0	0	1	5
	Global	1	0	0	3	4	1	0	2	11
F		**0**	**0**	**0**	**41**	**11**	**49**	**1**	**5**	**107**
	Alberta	0	0	0	12	9	12	1	1	35
	U.S.	0	0	0	29	2	35	0	4	70
	Global	0	0	0	0	0	2	0	0	2
Other (A-E)		**2**	**1**	**38**	**1**	**35**	**2**	**0**	**2**	**81**
	Alberta	1	0	15	0	13	0	0	0	29
	U.S.	0	0	9	1	9	1	0	0	20
	Global	1	1	14	0	13	1	0	2	32
Total		**7**	**488**	**42**	**191**	**62**	**53**	**1**	**10**	**854**

REFERENCES

1.   Innocent GT, Mellor DJ, McEwen SA, et al. Spatial and temporal epidemiology of

sporadic human cases of Escherichia coli O157 in Scotland, 1996-1999. *Epidemiol Infect* 2005;

133(6): 1033-41.

2.   Ohaiseadha C, Hynds PD, Fallon UB, O'Dwyer J. A geostatistical investigation of

agricultural and infrastructural risk factors associated with primary verotoxigenic E. coli (VTEC)

infection in the Republic of Ireland, 2008-2013. *Epidemiol Infect* 2017; **145**(1): 95-105.

3.   Rivero MA, Passucci JA, Rodriguez EM, Parma AE. Role and clinical course of

verotoxigenic Escherichia coli infections in childhood acute diarrhoea in Argentina. *J Med*

Microbiol 2010; **59**(Pt 3): 345-52.

4.   Lisboa, Szelewicki, Lin, et al. Epidemiology of Shiga Toxin-Producing Escherichia coli

O157 in the Province of Alberta, Canada, 2009–2016. *Toxins* 2019; **11**(10): 613.

5.   Kirk MD, Pires SM, Black RE, et al. World Health Organization Estimates of the Global

and Regional Disease Burden of 22 Foodborne Bacterial, Protozoal, and Viral Diseases, 2010: A

Data Synthesis. *PLoS Med* 2015; **12**(12): e1001921.

6.   Laidler MR, Tourdjman M, Buser GL, et al. Escherichia coli O157:H7 Infections

Associated With Consumption of Locally Grown Strawberries Contaminated by Deer. *Clinical*

Infectious Diseases 2013; **57**(8): 1129-34.

7.   Honish L, Punja N, Nunn S, et al. Escherichia coli O157:H7 Infections Associated

with Contaminated Pork Products — Alberta, Canada, July–October 2014. *MMWR Morbidity*

and Mortality Weekly Report 2017; **65**(52): 1477-81.

8.   Bottichio L, Keaton A, Thomas D, et al. Shiga Toxin-Producing Escherichia coli

Infections Associated With Romaine Lettuce-United States, 2018. *Clin Infect Dis* 2020; **71**(8):

e323-e30.

9.   Tack DM, Kisselburgh HM, Richardson LC, et al. Shiga Toxin-Producing Escherichia

coli Outbreaks in the United States, 2010-2017. *Microorganisms* 2021; **9**(7).

10.   Kintz E, Brainard J, Hooper L, Hunter P. Transmission pathways for sporadic Shiga-

toxin producing E. coli infections: A systematic review and meta-analysis. *Int J Hyg Environ*

Health 2017; **220**(1): 57-67.

11.   Jaros P, Cookson AL, Campbell DM, et al. A prospective case-control and molecular

epidemiological study of human cases of Shiga toxin-producing Escherichia coli in New

Zealand. *BMC Infect Dis* 2013; **13**: 450.

12.   Elson R, Grace K, Vivancos R, et al. A spatial and temporal analysis of risk factors

associated with sporadic Shiga toxin-producing Escherichia coli O157 infection in England

between 2009 and 2015. *Epidemiol Infect* 2018; **146**(15): 1928-39.

13.   Frank C, Kapfhammer S, Werber D, Stark K, Held L. Cattle density and Shiga toxin-

producing Escherichia coli infection in Germany: increased risk for most but not all serogroups.

Vector Borne Zoonotic Dis 2008; **8**(5): 635-43.

14.   Friesema IH, Van De Kassteele J, CM DEJ, Heuvelink AE, Van Pelt W. Geographical

association between livestock density and human Shiga toxin-producing Escherichia coli O157

infections. *Epidemiol Infect* 2011; **139**(7): 1081-7.

15.   Mulder AC, van de Kassteele J, Heederik D, Pijnacker R, Mughini-Gras L, Franz E.

Spatial Effects of Livestock Farming on Human Infections With Shiga Toxin-Producing

Escherichia coli O157 in Small but Densely Populated Regions: The Case of the Netherlands.

Geohealth 2020; **4**(11): e2020GH000276.

16.   Stephens TP, McAllister TA, Stanford K. Perineal swabs reveal effect of super shedders

on the transmission of Escherichia coli O157:H7 in commercial feedlots. *J Anim Sci* 2009;

87(12): 4151-60.

17.   Stanford K, Hannon S, Booker CW, Jim GK. Variable efficacy of a vaccine and direct-

fed microbial for controlling Escherichia coli O157:H7 in feces and on hides of feedlot cattle.

Foodborne Pathog Dis 2014; **11**(5): 379-87.

18.   Stanford K, Gibb D, McAllister TA. Evaluation of a shelf-stable direct-fed microbial for

control of Escherichia coli O157 in commercial feedlot cattle. *Canadian Journal of Animal*

Science 2013; **93**(4): 535-42.

19.   Stanford K, Johnson RP, Alexander TW, McAllister TA, Reuter T. Influence of Season

and Feedlot Location on Prevalence and Virulence Factors of Seven Serogroups of Escherichia

coli in Feces of Western-Canadian Slaughter Cattle. *PLoS One* 2016; **11**(8): e0159866.

20.   Franz E, Rotariu O, Lopes BS, et al. Phylogeographic Analysis Reveals Multiple

International transmission Events Have Driven the Global Emergence of Escherichia coli

O157:H7. *Clin Infect Dis* 2019; **69**(3): 428-37.

21.   Bumunang EW, Zaheer R, Stanford K, et al. Genomic Analysis of Shiga Toxin-

Producing E. coli O157 Cattle and Clinical Isolates from Alberta, Canada. *Toxins (Basel)* 2022;

14(9).

22.   Lees JA, Harris SR, Tonkin-Hill G, et al. Fast and flexible bacterial genomic

epidemiology with PopPUNK. *Genome Research* 2019; **29**(2): 304-16.

23.   Petit RA, 3rd, Read TD. Bactopia: a Flexible Pipeline for Complete Analysis of Bacterial

Genomes. *mSystems* 2020; **5**(4).

24.   Zhang X, Payne M, Kaur S, Lan R. Improved Genomic Identification, Clustering, and

Serotyping of Shiga Toxin-Producing Escherichia coli Using Cluster/Serotype-Specific Gene

Markers. *Front Cell Infect Microbiol* 2021; **11**: 772574.

25.   Strachan NJ, Rotariu O, Lopes B, et al. Whole Genome Sequencing demonstrates that

Geographic Variation of Escherichia coli O157 Genotypes Dominates Host Association. *Sci Rep*

2015; **5**: 14145.

26.   Tarr GAM, Stokowski T, Shringi S, et al. Contribution and Interaction of Shiga Toxin

Genes to Escherichia coli O157:H7 Virulence. *Toxins* 2019; **11**(10).

27.   Muller NF, Rasmussen DA, Stadler T. The Structured Coalescent and Its

Approximations. *Mol Biol Evol* 2017; **34**(11): 2970-81.

28.   Dallman TJ, Ashton PM, Byrne L, et al. Applying phylogenomics to understand the

emergence of Shiga-toxin-producing Escherichia coli O157:H7 strains causing severe human

disease in the UK. *Microb Genom* 2015; **1**(3): e000029.

29.   Byrne L, Dallman TJ, Adams N, Mikhail AFW, McCarthy N, Jenkins C. Highly

Pathogenic Clone of Shiga Toxin-Producing Escherichia coli O157:H7, England and Wales.

Emerg Infect Dis 2018; **24**(12): 2303-8.

30.   Barth SA, Menge C, Eichhorn I, et al. The Accessory Genome of Shiga Toxin-Producing

Escherichia coli Defines a Persistent Colonization Type in Cattle. *Appl Environ Microbiol* 2016;

82(17): 5455-64.

31.   Barth SA, Weber M, Schaufler K, Berens C, Geue L, Menge C. Metabolic Traits of

Bovine Shiga Toxin-Producing Escherichia Coli (STEC) Strains with Different Colonization

Properties. *Toxins (Basel)* 2020; **12**(6).

32.   Tarr GAM, Rounds J, Vachon MS, Smith K, Medus C, Hedberg CW. Differences in risk

factors for transmission among Shiga toxin-producing Escherichia coli serogroups and stx

profiles. *J Infect* 2023; **87**(6): 498-505.

SUPPLEMENTAL METHODS

STEC CASE DEFINITION

Alberta Health defines a confirmed case of Shiga toxin-producing *E. coli* (STEC), including *E. coli* O157:H7, as STEC isolation or Shiga toxin antigen or nucleic acid detection. Clinical illness, which may include diarrhea, bloody diarrhea, abdominal cramps, hemolytic uremic syndrome, thrombocytopenia purpura, or pulmonary edema, may or may not be present.[33]

SAMPLING FROM THE PRIOR DISTRIBUTION

Results in our Bayesian phylodynamic analyses are drawn from posterior distributions, which are influenced by both the data and the prior information we have about the system (Supplemental Table S1). In order to confirm that our primary results were not overly influenced by our prior assumptions, we conducted an analysis in which the sampling draws were made from the prior distribution, as opposed to the posterior distribution. We graphed these results against the sampling draws made from the posterior distributions from the four runs conducted for our primary analysis (each performed with a different random seed). The comparison shows that the draws from prior distribution differ markedly from the draws from the posterior distributions for the model's key parameters (Supplemental Figure S2). From this, we concluded that our prior assumptions were not overly influencing the results of the primary analysis.

 SUPPLEMENTAL FIGURES

Supplemental Figure S1. Genomic clustering of 690 Alberta *E. coli* O157 isolates. Clustering performed from raw reads using

PopPUNK v2.5.0 with 10,146 *E. coli* reference genomes.[22] From the 246 isolates selected for sequencing for the study and 445

additional Alberta Health isolates included for contextualization, one isolate was removed prior to clustering analysis, because it was

591   identified through metadata review as an environmental (non-human, non-cattle) isolate. Cluster 1 included the Sakai and EDL933

592   reference strains. Clusters 826 and 827 were novel clusters. Isolates outside of Cluster 1 were excluded from all subsequent analyses.

Supplemental Figure S2. Comparison of key parameters drawn from the posterior

distributions of four runs using different starting seeds to draws from the prior

distribution. The prior distributions for the clock rate (A, purple-grey), tree height (B, red),

mascot (C, yellow), backward migration rate (D, not visible), human effective population size (E,

grey), and cattle effective population size (F, red) all differed substantially from the posterior

distributions of the four runs.

Supplemental Figure S3. Comparison of Alberta, U.S., and global *E. coli* O157:H7 isolates. Tips are colored based on isolate

origin. Internal nodes are sized based on Bayesian posterior probability. LPLs are shaded and labeled as in Figure 3. Alberta isolates

2007-2016 and U.S. isolates 1996-2016 were analyzed for clade G only (A). Alberta, U.S., and other global isolates from 2007-2015

were analyzed for clades C through G (B). Two U.S. isolates, from 2014 and 2015, arose from Alberta LPLs 9 and 11, respectively.

No global isolates were associated with Alberta LPLs.

SUPPLEMENTAL TABLES

609   **Supplemental Table S1.** Analyses conducted and model priors.

Analysis	Isolates Included	Tree Model	Substitution Model	Clock Model
Primary analysis [a]	Alberta 2007-2015 (n=229)	Structured coalescent with 2 demes; N_e initial value 10 and Weibull distribution (shape=1, scale=100); migration initial value 1.0 and Uniform distribution (minimum=0 and maximum=100)	HKY with empirical frequencies and discrete Gamma site model with 4 categories	Relaxed log-normal with initial value 3.5×10^{-5} and Log-Normal distribution (M=3.5×10^{-5}, S=1.5, with mean in real space)
Alberta long-term persistence	Alberta 2007-2019 (n=459)[b]	Coalescent constant population with N_e initial value 10 and Weibull distribution (shape=1, scale=100)	HKY with empirical frequencies and discrete Gamma site model with 4 categories	Relaxed log-normal with initial value 1.5×10^{-4} and Log-Normal distribution (M=1.5×10^{-4}, S=1.5, with mean in real space)
Clade G Alberta-U.S. importation	Alberta 2007-2016 (n=260)[b] U.S. 1996-2016 (n=56)	Structured coalescent with 2 demes; N_e initial value 10 and Weibull distribution (shape=1, scale=100); migration initial value 1.0 and Uniform distribution (minimum=0 and maximum=100)	HKY with empirical frequencies and discrete Gamma site model with 4 categories	Relaxed log-normal with initial value 1.5×10^{-4} and Log-Normal distribution (M=1.5×10^{-4}, S=1.5, with mean in real space)
Global circulation [c]	Alberta 2007-2015 (n=281)[b] U.S. 2007-2015 (n=46) Global 2007-2015 (n=47)	Structured coalescent with 3 demes; N_e initial value 10 and Weibull distribution (shape=1, scale=100); migration initial value 1.0 and Uniform distribution (minimum=0 and maximum=100)	HKY with empirical frequencies and discrete Gamma site model with 4 categories	Relaxed log-normal with initial value 1.5×10^{-4} and Log-Normal distribution (M=1.5×10^{-4}, S=1.5, with mean in real space)

610   [a] Primary analysis was run using four different random seeds to confirm that all converged to the same solution. The four runs were combined to produce the final

611   maximum clade credibility tree and state transition estimates. Model priors from this analysis were also used in an analysis in which draws were taken from the

612   prior distribution, as opposed to the posterior distribution, to confirm that the final results were not overly influenced by the choice of priors.

613 [b] Outbreaks were down-sampled to avoid bias.

614 [c] Clades A and B were excluded from this analysis given the very small number of isolates available for them from any locale.

616 **Supplemental Table S2.** Estimated migrations from structured coalescent analysis of Alberta,

617 U.S., and global isolates, excluding clades A and B.

Migration Direction	Mean	95% HPD
Alberta to Alberta	478	357, 624
Alberta to Global	26	19, 34
Alberta to U.S.	66	50, 78
Global to Alberta	0	0, 2
Global to Global	39	24, 54
Global to U.S.	0	0, 0
U.S. to Alberta	87	8, 147
U.S. to Global	0	0, 1
U.S. to U.S.	49	0, 106

618 Abbreviation: HPD, highest posterior density interval

SUPPLEMENTAL REFERENCES

621   33.   Alberta Health. Escherichia coli verotoxigenic infections. 2021.

622   https://open.alberta.ca/publications/escherichia-coli-verotoxigenic-infections (accessed January

623   25 2024).