Whole genome sequencing detects minimal clustering among *Escherichia coli* Sequence Type 131 *H30* isolates collected from U.S. children's hospitals

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### 1 Abstract

2	Escherichia coli sequence type 131 H30 has garnered global attention as a dominant
3	antimicrobial-resistant lineage of extraintestinal pathogenic E. coli, but its transmission
4	dynamics remain undefined. We applied whole genome sequencing to identify putative
5	transmission clusters among clinical isolates of H30 from children across the U.S. Of 126
6	isolates, 17 were involved in 8 putative transmission clusters; 4 clusters involved isolates with
7	some evidence of healthcare-associated epidemiologic linkages. Geographic clustering analyses
8	showed weak geographic clustering. These findings are consistent with a framework where
9	within-hospital transmission is not a main contributor to the propagation of H30 in a pediatric
10	setting.
11	

12 Key words: E. coli infections; ST131; antimicrobial resistance; pediatric infections

# 13 Background

14	Extraintestinal pathogenic Escherichia coli (ExPEC) cause a wide range of non-intestinal
15	illnesses, ranging from uncomplicated urinary tract infection to potentially fatal bacteremia [1].
16	Unlike intestinal pathogenic <i>E. coli</i> , which is commonly associated with outbreaks, ExPEC
17	infections are historically considered sporadic, and tracking ExPEC transmission has not been a
18	clinical or public health priority. However, the widespread dissemination of antimicrobial-
19	resistant lineages such as sequence type (ST) 131-H30 (also known as ST131 Clade C), a
20	dominant multidrug-resistant (MDR) ExPEC lineage in both adults and children, has brought
21	new interest to understanding the transmission dynamics of these common pathogens [2,3]. In
22	particular, the relative importance of healthcare vs. community transmission to the
23	propagation of MDR ExPEC lineages remains poorly defined, though recent work indicates
24	community exposures may be more important in pediatric patients.[4]
25	
26	The transmission dynamics of ST131-H30 (hereafter, H30) are challenging to study. Like other
27	ExPEC lineages, H30 is known to asymptomatically colonize the gut for extended periods of
28	time prior to—or potentially without ever—transitioning to extraintestinal infection [5]. These
29	instances of long-term intestinal colonization likely result in numerous "silent" transmission
30	events [6]. Whole genome sequencing (WGS) and phylogenetic methods can shed light on
31	pathogen transmission dynamics even in the presence of silent transmission events. Here, we
32	used WGS to identify putative transmission clusters among passively collected clinical H30
33	isolates from four children's hospitals across the U.S. We also quantified genomic evidence of
34	geographic clustering to characterize the spatiotemporal dynamics of H30 among children.

#### 35 Methods

#### 36 Strain collection and whole genome sequencing

- 37 All isolates and clinical data came from a previously described multicenter case-control study.
- 38 Briefly, between September 1, 2009 and September 30, 2013, four freestanding children's
- 39 hospitals—referred to here as "West," "Midwest 1," "Midwest 2," and "East"— collected E. coli
- 40 isolates during the course of standard clinical care from individuals <22 years old. All extended-
- 41 spectrum cephalosporin-resistant and a subset of extended-spectrum cephalosporin-sensitive
- 42 isolates were collected [7]. The Institutional Review Board at each hospital approved the study
- 43 protocol. *H30* isolates were identified using the *fumC/fimH* genotyping scheme [8]; only the
- 44 first *H30* isolate per individual was included.

45

All *H30* isolates underwent WGS on the Illumina NextSeq platform. Sequencing reads were quality filtered, trimmed, mapped to a high-quality *H30* reference genome (EC958), and single nucleotide variants (SNVs) were called and filtered.[9] Filtered SNVs were used to construct a pairwise SNV distance matrix using snp-dists, and a maximum-likelihood phylogenetic tree, using IQ-tree [10,11]. See Supplementary Methods for more details. Sequence data generated are available from the NCBI Sequence Read Archive under BioProject PRJNA578285 (see Supplementary Table 2 for study sample metadata).

### 54 Identification and characterization of putative clusters

55 Pairwise SNV distances within and between all combinations of collection sites were visualized,

and the minimum SNV distance between two isolates from discordant collection sites was used

57	to define a threshold for identification of putative transmission clusters. This approach was
58	selected in an effort to capture direct and indirect transmission events that are
59	epidemiologically relevant, i.e. would warrant further investigation should the clusters have
60	been identified in real-time. Given the substantial geographic distance between the collection
61	sites in this study, we expect no epidemiologically relevant transmission events that span two
62	distinct collection sites. The transcluster package in R (version 3.5.1 ,R Core Team, 2018) was
63	used to estimate counts of uncaptured transmission events separating isolates in each putative
64	cluster while incorporating the sampling dates and estimated evolutionary rate and
65	transmission rate of H30 [12]. See Supplementary Methods for more details.
66	
67	Genomic evaluation of geographic clustering
68	To examine the spatiotemporal dynamics of H30, we quantified genomic evidence of
69	geographic clustering using two approaches. The primary approach was a previously described
70	SNV-distance based approach where a ratio of the median SNV distance within collection sites
71	over the median SNV distance between collection sites (SNV $_{within}$ / SNV $_{between}$ ) is calculated, with
72	a ratio closer to zero indicating more evidence of clustering by collection site [13]. Statistical
73	significance of the pairwise-SNV distance-based clustering was assessed using permutation-
74	based 95% interval estimates with 1000 permutations; a SNV distance ratio below the lower
75	bound of the 95% interval estimate indicated evidence of geographic clustering. Secondarily,
76	we applied a previously described phylogenetically informed approach [14]. Briefly, the number
77	of isolates in well-supported phylogenetic clades of size 2 or greater that were homogeneous
78	for collection site ("pure" clusters) was tallied. Statistical significance of these counts was again

79	assessed using permutation-based 95% interval estimates with 1000 permutations; counts
80	higher than the upper bound of the permuted 95% interval estimate were considered evidence
81	of clustering. Both approaches were first executed on the full sample set and then on four
82	temporally segregated sample sets in approximate one-year increments to explore whether
83	geographic signal interacted with the temporal variability of sampling.
84	
85	Clustering by "geographically close" sites compared to "geographically distant" sites was also
86	examined. In SNV-distance based analyses, pairs of isolates that spanned Midwest 1 and
87	Midwest 2 were classified as geographically close, while all other discordant site pairs were
88	classified as geographically distant. In phylogenetically informed analyses, the two sites in the
89	Midwest region of the U.S. were collapsed into one "Midwest" category. The same methods
90	described above were applied to the full data set and to the temporally segregated sample sets.
91	
92	Results
93	One hundred thirty H30 isolates were identified out of 1,347 E. coli screened over the four-year
94	study period. Three of the 130 H30 isolates were determined to be non-H30 after in silico
95	analysis and one isolate was identified as a subsequent isolate from an individual already in the
96	study, leaving 126 H30 isolates in the remainder of the analyses. After quality filtering and
97	recombination masking, 3,433 variable sites were identified and included in the whole-genome-
98	based SNV alignment.
99	

100	There were 7,875 different pairwise comparisons made, with the pairwise SNV distance ranging
101	from 0 to 165 SNVs. The minimum SNV distance between isolates from discordant collection
102	sites was 14 SNVs, and pairs of isolates separated by less than or equal to 14 SNVs were
103	considered to be members of a putative transmission cluster (Figure 1A). Using this threshold,
104	eight putative clusters were identified involving seventeen isolates, seven clusters containing
105	two isolates and one cluster containing three isolates (Figure 2A, Supplementary Figure 1). The
106	putative cluster with three isolates (Cluster 1) consisted of one pair separated by 15 SNVs,
107	which was just beyond the selected cutoff, but because the other two pairs within the cluster
108	were separated by <14 SNVs, all three isolates were included in further analyses. Clusters
109	contained a mix of community- and healthcare-associated isolates (Supplementary Figure 2).
110	
111	Out of the eight identified putative clusters, documented epidemiologic data associated with
112	four clusters (Clusters 2,6,7,8) was consistent with possible nosocomial acquisition. Clusters 2
113	and 6 involved individuals with documented overlapping dates of hospitalization (Figure 2B).
114	The genomic evidence for direct transmission within these clusters is less clear: they were
115	separated by 12 and 10 SNVs, respectively, and the transcluster method estimated that there
116	were between 8 and 19 transmission events separating the isolates in these clusters (Figure
117	2A). Additionally, only one of the two isolates in Cluster 2 was phenotypically resistant to
118	trimethoprim-sulfamethoxazole (Supplementary Figure 2). However, the within-cluster
119	difference in isolation dates was 179 and 199 days, so long-term colonization and within-host
120	evolution may have inflated the estimated number of transmission events and resulted in a loss
121	of a resistance determinant. Clusters 7 and 8 consisted of isolates that differed by 0-1 SNVs

122	after quality filtering and were collected between 1 and 7 days of one another, with the
123	transcluster method estimating direct transmission (Figure 2A). While there was no
124	documentation of overlapping hospitalizations within Cluster 7 or 8, both individuals within
125	Cluster 7 had surgical site infections associated with neurological procedures, while both
126	individuals within Cluster 8 were paraplegic. These connections are consistent with a plausible
127	epidemiological link in inpatient or outpatient care, although conclusively establishing such a
128	link is outside the scope of these data.

129

130 Genomic clustering analyses demonstrated minimal evidence of geographic clustering by 131 collection site. Visual inspection of geographic sites on the phylogenetic tree did not show 132 remarkable evidence of geographic clusters (Supplementary Figure 1). The median SNV 133 distance within pairs across concordant sites was not significantly different from the median SNV distance within pairs across discordant sites. (SNV<sub>within</sub> / SNV<sub>between</sub> = 1.01, 95% interval 134 135 estimate 0.99-1.01 Figure 1A). Similarly, the median SNV distance within pairs across the most 136 geographically proximate discordant sites (Midwest 1 and Midwest 2) was not significantly 137 lower than the median SNV distance within pairs across more geographically distant site pairs 138 (SNV<sub>within</sub> / SNV<sub>between</sub> = 1.03, 95% interval estimate 0.99-1.02, Figure 1B). The phylogenetic-139 informed approach demonstrated weak clustering in the data by study site and no clustering by 140 Midwest sites vs. other sites (Supplementary Figure 3). Results for temporally segregated 141 sample sets were similar, with most measures not supporting evidence of clustering 142 (Supplementary Table 1 and Supplementary Figures 4 and 5).

143

# 144 **Discussion**

145	We applied WGS to clinical isolates collected from four freestanding U.S. children's hospitals
146	over four years to identify putative transmission clusters and investigate the spatiotemporal
147	dynamics of <i>E. coli</i> ST131- <i>H30</i> . We identified eight putative transmission clusters of H30
148	involving seventeen isolates, including two clusters with documented overlapping
149	hospitalizations and two clusters with other plausible healthcare-associated epidemiologic
150	links. Genomic spatiotemporal analyses demonstrated little evidence of geographic clustering
151	of <i>H30</i> more broadly.
152	
153	To our knowledge, there are no available data about transmission of H30 between children
154	within healthcare settings. Our observation of limited plausible within-hospital transmission is
155	not surprising, given the infrequent documentation of MDR-ExPEC transmission within
156	healthcare, generally [15]. These findings are consistent with a framework where within-
157	hospital transmission is not a dominant contributor to the propagation of H30 in a pediatric
158	setting. However, the identification of some plausible nosocomial transmission highlights the
159	utility of WGS of isolates collected during the course of standard clinical care to uncover silent
160	transmission events.
161	
162	There are also no data, to our knowledge, describing the spatiotemporal dynamics of H30
163	within the U.S. using geographically diverse isolates. Our observation of limited geographic
164	clustering was unexpected; we anticipated a stronger genomic signature associated with

165 sustained local circulation at the various geographic sites. These findings may reflect the rapid

and recent dissemination of *H30* at the time of this data collection. Whether these patterns
remain the same today, almost two decades after *H30* is believed to have disseminated rapidly
and globally, is worthy of further study [2].

169

170	The results of this study should be interpreted in the context of multiple limitations. First, the
171	available epidemiologic data were limited — including a lack of detail about the location of
172	specific wards during overlapping hospitalizations — and, as such, all observations of plausible
173	transmission should be interpreted cautiously. Second, as highlighted elsewhere [12], the
174	selection of a SNV threshold as a method of defining putative transmission clusters has
175	limitations. However, the multicenter design in this study provided the opportunity to apply a
176	conservative threshold where even indirect transmission was epidemiologically unlikely, which
177	we believe to be a reasonable approach given the limited transmission data available about
178	H30. Finally, the local epidemiology of H30 may have changed since the collection of these
179	isolates. This study also had several strengths, including a multicenter design; a large collection
180	of H30 isolates from an understudied pediatric population; and the use of WGS and
181	phylogenetically informed approaches to investigate both transmission-based and geographic
182	clustering.

183

As antimicrobial resistance rates among ExPEC rise, there is new urgency to improve our
 understanding of the transmission dynamics of these common pathogens. Taken together, our
 findings of minimal evidence of transmission clusters or broader geographic clustering are
 consistent with the prevailing conceptualization of *H30* as a globally and recently disseminated

188 epidemic strain that is often community-associated [2]. Future studies should consider focusing

189 on community-based exposures when investigating the transmission dynamics of *H30*.

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Figure 1: Distribution of pairwise single nucleotide variant (SNV) differences between *H30* clinical isolates from four children's hospitals in the U.S. A) Within single collection sites compared to between discordant collection sites. Dashed line indicates selected threshold for identifying putative transmission clusters; and B) Between geographically distant discordant collection sites vs. between geographically close discordant collection sites.

Figure 2: A) Phylogeny of eight identified putative transmission clusters of *H30* identified from four children's hospitals in the U.S. colored by study site, with the number of days separating their collection; the number of single nucleotide variants (SNVs) separating them after quality filtering; and a range of estimated number of transmission events separating them as calculated by the R package transcluster. The range of estimated transmission events reflect a range of reasonable values for substitution and transmission rates, but do not account for potential intra-host evolution or diversity. B) Temporal depiction of the overlapping hospitalizations of individuals in Cluster 2 and Cluster 6. The black diamond indicates the date of isolate collection and the purple bars represent time hospitalized. Time is measured in days since the isolation of the first isolate in each cluster.