

# Regional Spread of *bla*<sub>NDM-1</sub>-Containing *Klebsiella pneumoniae* ST147 in Post-Acute Care Facilities

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**Background.** Carbapenem-resistant *Enterobacterales* (CRE) harboring  $bla_{_{\rm KPC}}$  have been endemic in Chicago-area healthcare networks for more than a decade. During 2016–2019, a series of regional point-prevalence surveys identified increasing prevalence of  $bla_{_{\rm NDM}}$ -containing CRE in multiple long-term acute care hospitals (LTACHs) and ventilator-capable skilled nursing facilities (vSNFs). We performed a genomic epidemiology investigation of  $bla_{_{\rm NDM}}$ -producing CRE to understand their regional emergence and spread.

*Methods.* We performed whole-genome sequencing on New Delhi metallo-beta-lactamase (NDM)+ CRE isolates from 4 point-prevalence surveys across 35 facilities (LTACHs, vSNFs, and acute care hospital medical intensive care units) in the Chicago area and investigated the genomic relatedness and transmission dynamics of these isolates over time.

**Results.** Genomic analyses revealed that the rise of NDM+ CRE was due to the clonal dissemination of an sequence type (ST) 147 *Klebsiella pneumoniae* strain harboring  $bla_{NDM-1}$  on an IncF plasmid. Dated phylogenetic reconstructions indicated that ST147 was introduced into the region around 2013 and likely acquired NDM around 2015. Analyzing the relatedness of strains within and between facilities supported initial increases in prevalence due to intrafacility transmission in certain vSNFs, with evidence of subsequent interfacility spread among LTACHs and vSNFs connected by patient transfer.

**Conclusions.** We identified a regional outbreak of  $bla_{NDM-1}$  ST147 that began in and disseminated across Chicago area post-acute care facilities. Our findings highlight the importance of performing genomic surveillance at post-acute care facilities to identify emerging threats.

Keywords. NDM; Klebsiella pneumonia; ST147; genomic epidemiology; carbapenem resistance.

Carbapenem-resistant *Enterobacterales* (CRE) represent an urgent antibiotic-resistance threat due to their resistance to firstline antibiotics and transmissibility in healthcare settings [1, 2]. The emergence of epidemic lineages of CRE that are resistant to nearly all antibiotics and that cause infections with high mortality rates, such as *Klebsiella pneumoniae* carbapenemase (KPC) containing *Klebsiella pneumoniae* (KPC-Kp) sequence type (ST) 258 [3], has further escalated the need for more effective strategies to interrupt CRE transmission. Most interventions to prevent the spread of CRE and other healthcare-associated antibiotic-resistance threats have been implemented at the level

#### Clinical Infectious Diseases<sup>®</sup> 2021;73(8):1431–9

of individual healthcare facilities. However, there is now a multitude of evidence that the frequent movement of colonized and infected patients among regional healthcare facilities necessitates regional surveillance and infection prevention strategies [4].

Long-term acute care hospitals (LTACHs) and ventilatorcapable skilled nursing facilities (vSNFs) are potentially high-impact settings for implementation of regional CRE surveillance and infection prevention interventions [5, 6]. Patients in these facilities have been shown to be colonized with CRE at high rates, likely due to a combination of their chronic severe illness, long lengths of stay, and high rates of prior or ongoing antibiotic exposure. Modeling and epidemiologic studies have suggested that the high CRE prevalence in LTACHs in particular has a significant impact on connected healthcare facilities with which they share patients [7, 8]. Currently, less is known about the regional influence of vSNFs, although the even longer lengths of patient stay and more limited resources for infection prevention indicate that they might also be important settings in regional amplification of antibiotic resistance.

A bundled infection prevention intervention [9] (Chicago PROTECT [10]) was initiated in July 2017 to control CRE in Chicago-area healthcare facilities, including in vSNFs and LTACHs. Serial point-prevalence surveys conducted to monitor

Received 18 March 2021; editorial decision 4 May 2021; published online 17 May 2021.

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the impact of the intervention demonstrated that KPC-Kp levels remained stable across regional facilities. However, during the intervention period, New Delhi metallo-beta-lactamase (NDM) containing CRE prevalence unexpectedly increased in a subset of surveyed vSNFs. Here, we applied whole-genome sequencing to investigate the underlying transmission dynamics related to the increase in NDM prevalence in the region.

## METHODS

### Study Isolates and Metadata

From October 2016 to July 2019, 20 medical intensive care units (ICUs) in 20 short-term acute care hospitals, 7 LTACHs, and 8 vSNFs in the Chicago region were invited to participate in serial 1-day point-prevalence surveys of residents. In vSNFs, surveys were performed in ventilator wards. Medical ICUs were surveyed once in 2016-2017; vSNFs and LTACHs were surveyed every 6-12 months. Patients who were present in their room at the time of the survey were considered eligible for participation. Written informed consent was waived for this project, and patients who were competent were provided a standardized verbal explanation of the rationale for surveillance and were asked for verbal assent. Local staff obtained a rectal swab sample from each participating patient and collected deidentified patient information assessed at the time of the survey (age up to 90 years, sex, respiratory support status, length of stay, contact precautions status, facility awareness of resident CRE status). Swabs were processed at a central laboratory within 6 hours of collection. Overnight growth from MacConkey agar plates was screened for 5 carbapenemase gene families (KPC, NDM, VIM, IMP, and OXA-48) using multiplex polymerase chain reaction assays (Acuitas MDRO gene test and Acuitas Resistome test, OpGen, Gaithersburg, MD, during 2016-2017; Xpert Carba-R, Cepheid, Sunnyvale, CA, during 2018-2019).

For all genomic analyses, only the first isolate of a given ST (for *K. pneumoniae* isolates) or species (for all other species) was used for each patient. We used a Fisher exact test to test for the statistical significance of the difference in NDM or KPC prevalence between the first and last surveys. Fisher exact *P* values were corrected using the Benjamini-Hochberg method.

#### Whole-Genome Sequencing

Genomic DNA was extracted from cultures derived from single subcultured colonies. Genomic libraries were prepared with the NEBNext Ultra DNA library prep kit and sequenced at the University of Michigan Advanced Genomics Core on an Illumina NovaSeq 6000. All sequenced isolates have been deposited under BioProject PRJNA686897.

#### **Genomic Analysis**

We processed whole-genome sequences [11, 12] and identified in silico multilocus sequence types [13, 14], generated and annotated assemblies [12, 15–20], called single-nucleotide variants (SNVs) [21–28], identified phylogenetic clustering of facilities [8], and calculated pairwise SNV distances between isolates [29]. Reference-based whole-genome alignments of study and public ST147 isolates [30–40] were used to generate a phylogenetic tree using IQ-TREE v1.6.12 [41, 42]. We inferred ancestral dates of the phylogeny with the R package BactDating v1.0.12 [43–45]. NDM-containing plasmids were identified from publicly available complete plasmids [21, 29, 46–50]. See Supplementary Methods for details of the genomic analysis.

#### **Determining Patient Flow Between Facilities**

We constructed a patient transfer matrix of the Chicago metropolitan region using the Centers for Medicare and Medicaid Services' minimum dataset, Medicare Provider Analysis and Review limited dataset, Medicaid Analytic eXtract Data from 2010–2012. Using the patient transfer matrix, we constructed a directed weighted patient transfer network of healthcare facilities in the Chicago area using R igraph v1.2.6 [51], including all healthcare facilities in the study, and patient flow was determined as in [8]. See Supplementary Methods for details about calculating patient flow. Comparison of patient flow for interfacility isolate pairs  $\leq 12$  SNVs vs >12 SNVs was performed using Wilcox tests.

#### **Data Analysis and Visualization**

Data analysis and visualization was performed in R v4.0.2 [52]. Data visualization used the following packages: tidyverse v1.3.0 [53], pheatmap v1.0.12, lubridate v1.7.9.2, tidytree v0.3.3, treeio v1.12.0, ggtree v2.2.4 [54, 55], ggplotify v0.0.5, ggnewscale v0.4.4, and cowplot v1.1.0. Code for analysis and visualization can be found here: https://github.com/Snitkin-Lab-Umich/ndm-st147-chicago-ms.

#### **Ethical Review**

Bacterial isolates and deidentified clinical metadata were collected under a prior surveillance project that underwent ethical review at the Centers for Disease Control and Prevention and was determined to be a nonresearch activity (public health surveillance). The project was also evaluated independently at each participating healthcare facility and deemed either a public health assessment or human subjects research and approved by local review boards where applicable.

### RESULTS

Prevalence of NDM, but not KPC, increased over time in certain vSNFs that were not closely connected by patient transfer. We first detected the presence of NDM+ CRE isolates in vSNFs and LTACHs during a regional point-prevalence survey conducted in 2017 and subsequently performed 3 follow-up surveys (Figure 1A). A summary of the patient population for each facility type across the 4 surveys can be found in Table 1. We found that while the prevalence of KPC+ CRE generally remained stable over time, the prevalence of NDM+ CRE increased in 3 vSNFs

not closely connected by patient transfer (Fisher exact P < .05 for vSNFs J, K, and L; Figure 1B, Supplementary Figures 1, 2; Supplementary Table 1). The majority of NDM+ isolates were *K. pneumoniae* ST147 and carried *bla*<sub>NDM-1</sub> on an IncF plasmid.

To understand the molecular basis for the increase in NDM+ CRE, we performed whole-genome sequencing on all CRE isolates from survey 1 and NDM+ isolates from the subsequent 3 follow-up surveys. We found that the presence of NDM was highly correlated with the presence of a suite of genes present on an NDM+ IncF plasmid isolated from *K. pneumoniae* [56] (Supplementary Figure 3). Most isolates that contained the IncF plasmid were  $bla_{NDM-1}$ *K. pneumoniae* ST147; however, 1  $bla_{NDM-1}$  *Escherichia coli* ST354 isolate also contained the plasmid (Figure 2). While short-read sequencing data alone are insufficient to provide structural data to associate NDM with the plasmid backbone, the high degree of correlation between NDM and the IncF-associated plasmid genes in concert with the phylogenetic relationships between isolates strongly suggests that these genes are co-inherited (Supplementary Figure 3). In addition to NDM, the IncF plasmid harbored a number of antibiotic-resistance genes from several different resistance classes and the qacE gene, which may confer reduced susceptibility to common biocides [57] (Supplementary Figure 3).

## Regional ST147 Isolates Are Phylogenetically Distinct from All Public Isolates

We investigated the phylogeography of ST147 in the Chicago area to determine whether circulating ST147 could be attributed to 1 or multiple importation events into the region. To this end, we



**Figure 1.** Prevalence of New Delhi metallo-beta-lactamase (NDM) increased over time in certain vSNFs. *A*, Time window of when facilities were tested for each survey. Observance of NDM+ carbapenem-resistant *Enterobacterales* in vSNFs and LTACHs in survey 1 led to targeted follow-up surveys (2, 3, and 4) in these facilities. *B*, Proportion of NDM and *Klebsiella pneumoniae* carbapenemase—positive samples across surveys and facilities. vSNF 0 was not included as there was uneven sampling across surveys. ICUs are not shown in panel B because of very low prevalence (see Table 1). Abbreviations: ICU, intensive care unit; LTACH, long-term acute care hospital; vSNF, ventilator-capable skilled nursing facility.

## Table 1. Summary of Point-Prevalence Survey Results from Intensive Care Units, Long-Term Acute Care Hospitals, and Ventilator-Capable Skilled Nursing Facilities for Surveys 1, 2, 3, and 4

Variable	Intensive Care Unit	Long-Term Acute Care Hospital	Ventilator-Capable Skilled Nursing Facility
Number of surveys	1	4	4
Number of facilities	20	7	8
Number of patients eligible	238	1338	1325
Number of patients surveyed, n (% of eligible)	212 (89)	1188 (89)	1154 (87)
Age, mean (standard deviation), y	62 (17)	62 (15)	60 (15)
Male, n (%)	119 (56)	644 (54)	627 (54)
Length of stay, median (interquartile range), d	5 (3–10)	21 (11–37)	126 (33–410)
Mechanical ventilation, n (%)	102 (48)	405 (21)	477 (33)
Tracheostomy collar, n (%)	0(0)	250 (21)	384 (33)
Contact precautions, n (%)	58 (27)	736 (62)	679 (59)
Carbapenemase gene			
Klebsiella pneumoniae carbapenemase, n (%)	11 (5)	182 (15)	360 (31)
New Delhi metallo-beta-lactamase, n (%)	2 (1)	30 (3)	146 (13)
OXA-48, n (%)	1 (0)	0 (0)	1 (0)
IMP, n (%)	0(0)	1 (0)	O (O)
VIM, n (%)	O (O)	4 (0)	66 (6)
Any carbapenemase gene, n (%)	14 (7)	201 (17)	479 (42)
Of carbapenemase-positive			
With contact precautions, n/N (%)	9/14 (64)	169/201 (84)	364/479 (76)
Known to facility, n/N (%)	6/14 (43)	107/201 (53)	303/479 (63)

constructed a whole-genome phylogeny that included publicly available ST147 genomes from across the globe. Examination of the phylogenetic reconstruction revealed that all of the ST147 isolates from the study form a monophyletic cluster, consistent with a single regional introduction (Figure 3). We also noted that while none of the NDM+ ST147 public isolates harbored the IncF plasmid, the majority of ST147s in the current study contained the plasmid. Moreover, 1 of the ST147 isolates in the KPC+/NDM– outgroup (from survey 3) contained the IncF plasmid but lacked NDM (Supplementary Figure 4), suggesting that the plasmid may have been acquired in a locally circulating ST147 strain, followed by integration of a mobile element harboring NDM. A dated phylogenetic analysis of circulating ST147 yielded an estimate of August 2015 for when the NDM+ clade of ST147 first arose in the region (95% credible interval [CI], February 2015–March 2016; Figure 4, Supplementary Figure 5, Supplementary Table 2) compared with an estimate of July 2013 for when ST147 first entered the region (CI, October 2011–October 2014; Supplementary Table 2).



Figure 2. The majority of NDM+ isolates are *Klebsiella pneumoniae* sequence type 147 and carry NDM on an IncF plasmid. Number of sequenced isolates of various species and sequence types, what carbapenemase(s) they contain, and whether they have the IncF plasmid. Abbreviations: KPC, *Klebsiella pneumoniae* carbapenemase; NDM, New Delhi metallo-beta-lactamase.



Figure 3. Study isolates are clonally separated from all publicly available isolates outside the Chicago region. Maximum likelihood phylogeny of study and public isolates annotated by geographic region and genomic element. Abbreviations: KPC, *Klebsiella pneumoniae* carbapenemase; NDM, New Delhi metallo-beta-lactamase.

### Genomic Evidence Indicates That Intrafacility Transmission is Driving Prevalence at High-Prevalence vSNFs

After determining that the increase in NDM prevalence corresponds to a clonal outbreak of  $bla_{NDM-1}$  ST147, we investigated the potential transmission dynamics of this clone within and between healthcare facilities. We observed a substantial clustering of isolates from certain vSNFs on the phylogeny (Figure 5A, Supplementary Figure 6), which suggests potential intrafacility transmission. To further investigate whether these clusters may represent within-facility transmission, we calculated pairwise SNV distances among all pairs of isolates and compared these distances for isolates from the same facility (intrafacility pairs) to isolates from different facilities (interfacility pairs) across surveys (Figure 5B). Indeed, starting in survey 3, we observed a disproportionate representation of small SNV distances ( $\leq 12$ SNVs; see Methods section for threshold selection), which is consistent with intrafacility transmission in vSNFs. Of note, in survey 4, we observed spikes in small SNV distances for both intra- and interfacility pairs, with closely related intrafacility pairs being primarily from vSNFs and closely related interfacility pairs being from both vSNF-LTACH and vSNF-vSNF pairs (Supplementary Figure 7). Putting these closely related interfacility pairs in the context of the regional patient transfer network supports a potential role of patient transfer in regional *bla*<sub>NDM-1</sub> ST147 spread in survey 4, with vSNF-LTACH and vSNF-vSNF isolate pairs less than 12 SNVs apart being from facilities with higher patient flow between them than isolate pairs with 12 or more SNVs (Wilcox P < .001; Supplementary Figure 8; higher patient flow indicates more movement of patients from source to destination facility, see Supplementary Methods for details).

## DISCUSSION

We performed genomic analyses of CRE isolates collected through serial point-prevalence surveys in the Chicago area to investigate an increase in NDM+ CRE prevalence across a regional healthcare network. Our analysis supports the increase in NDM+ CRE being due to the clonal dissemination of a single *bla*<sub>NDM-1</sub> ST147 strain of *K. pneumoniae* that emerged in 2015. Putting genomic analysis in the context of the regional healthcare network supports this strain first reaching high prevalence in a small number of vSNFs due to intrafacility transmission, followed by interfacility spread to connected healthcare facilities.

Whole-genome sequencing showed that the majority of *bla*<sub>NDM-1</sub> ST147 harbored an IncF multidrug-resistance plasmid. Incorporating public data into the analysis revealed that these isolates formed a monophyletic clade, suggesting a single introduction into the region, either through importation of a preexisting NDM+ ST147 strain or acquisition of *bla*<sub>NDM</sub> by a locally circulating ST147 strain. Furthermore, examination of the global phylogeny indicates that while NDM+ ST147 has evolved multiple times in different locations and sometimes resulted in clonal outbreaks, none of the global NDM+ ST147 isolates we included in our analysis harbor the IncF plasmid found in our study isolates. The rapid and widespread dissemination of this strain in the region indicates that the NDM-carrying IncF plasmid we identified here can stably associate with an ST147 strain with epidemic potential. Given the potential negative impact of epidemic NDM-carrying K. pneumoniae, this possibility warrants close monitoring.

By combining regional surveillance with genomic analysis, we were able to discern that NDM initially spread in 3 vSNFs, likely via intrafacility transmission, with evidence of subsequent spread to



Figure 4. New Delhi metallo-beta-lactamase–positive sequence type 147 *Klebsiella pneumoniae* was introduced into the region around 2015. Dated phylogeny generated by BactDating. Gray bar on the root is the lower and upper bounds of the confidence interval (2015.09 to 2016.17). Abbreviations: ICU, intensive care unit; LTACH, long-term acute care hospital; vSNF, ventilator-capable skilled nursing facility.

healthcare facilities connected by patient transfer. There are several factors that likely contributed to the spread of this NDM+ ST147 clone. First, vSNF patients are a high-risk population for carriage of CRE as they are chronically ill, are usually admitted from ICUs or LTACHs, and are often exposed to antibiotics [58]. Second, patients in vSNFs generally have long lengths of stay, often much longer than patient stays at LTACHs [59], meaning that they have a longer period of time to acquire a multidrug-resistant organism. Furthermore, multibed rooms are common and the facilities themselves are often underresourced from a staffing and infection control perspective [6], both of which could facilitate intrafacility spread. Our findings paired with these observations indicate that vSNFs may be important healthcare facilities to detect emerging threats and potentially contain them before widespread dissemination. In the current study, we note that NDM+ isolates were uncommon in ICUs, and the outbreak of ST147 might not have been detectable until much later if sampling were restricted to ICUs.

Our study has several strengths. Active surveillance of diverse types of healthcare facilities in the region allowed us to identify and investigate a potential multidrug-resistant organism threat earlier than would have been possible if serial point-prevalence surveys across several facility types were not ongoing. Furthermore, cross-sectional patient sampling within each survey allowed us to obtain a complete snapshot of CRE prevalence at a given facility at a given point in time and to detect the increase in NDM+ isolates over time. Finally, we were able to leverage information from whole-genome sequencing to investigate the relatedness of isolates, as well as the intra- and interfacility transmission dynamics of NDM across the health-care network.

Our study also has several important limitations. First, the cross-sectional study design could have led to potential biases in the number of NDM+ isolates sequenced at facilities, given that the patients at these facilities had different average lengths of stay, and



**Figure 5.** Intrafacility transmission is driving prevalence at high-prevalence vSNFs. *A*, Number of isolates in the largest subclade of the maximum likelihood phylogeny containing  $\geq$ 90% of isolates from the given facility (see Methods section for more details). Note that the  $\gamma$ -axis is  $\log_{10}$ -scaled. *B*, Pairwise SNV distances of isolates from the same and different facilities across surveys. The gray diamond at a pairwise SNV distance of 12 indicates the threshold for closely related isolates (see Methods section for details). Abbreviations: LTACH, long-term acute care hospital; SNV, single-nucleotide variant; vSNF, ventilator-capable skilled nursing facility.

precluded a more nuanced examination of NDM-1 intrafacility transmission dynamics and associated patient risk factors. Second, we lacked data from short-term acute care or community settings, particularly in the last 3 surveys, which limited our ability to examine the relative importance of other regional reservoirs for NDM+ ST147. However, the short-term acute care data that were available did not support their role in  $bla_{_{\rm NDM-1}}$  ST147 expansion. Third, we used facility-level aggregate patient transfer data to infer the likelihood of patient-level exposure to facilities; lack of patient-level facility exposure data precluded us from performing a more detailed exposure network analysis [60]. Last, we used short-read sequencing data, which limited our ability to investigate more complex plasmid dynamics. While we plan to perform long-read sequencing on a subset of these isolates in the future, we find it notable that we were able to leverage publicly available complete plasmid sequences to determine that NDM was carried on the same plasmid in the majority of isolates.

In conclusion, we identified an emerging *bla*<sub>NDM-1</sub> ST147 clone of *K. pneumoniae* with epidemic potential. The identification of this clone and characterization of its ability to disseminate within and between healthcare facilities were made possible through whole-genome sequencing of NDM+ isolates from serial point-prevalence surveys at vSNFs, LTACHs, and ICUs. Our findings highlight the importance of performing surveillance of multidrug-resistant organisms not only in acute care hospital ICUs but also in post-acute care facilities such as LTACHs and vSNFs. vSNFs in particular appear to be especially important as sentinel sites of active surveillance for rare and emerging resistant pathogens.

#### **Supplementary Data**

Supplementary materials are available at *Clinical Infectious Diseases* online. Consisting of data provided by the authors to benefit the reader, the posted materials are not copyedited and are the sole responsibility of the authors, so questions or comments should be addressed to the corresponding author.

#### Notes

Author Contributions. All authors developed the methodology and reviewed and edited the manuscript. M. L., E. S., M. H., A. M. J., and Z. L. conceptualized the research goals and aims. Z. L., R. C., A. P., and E. S. developed and implemented the software and curated the data. Z. L., R. C., and A. P. performed formal analysis. M. L., M. H., and E. S. provided resources. Z. L. and E. S. wrote the original draft. Z. L. and R. C. visualized the results. M. L., M. H., A. M. J., and E. S. provided supervision. M. L., M. H., and E. S. managed the project. M. L., M. H., and E. S. acquired funding.

Acknowledgments. The authors gratefully acknowledge the patients and staff of the facilities for their participation in this study. They thank officials from the Chicago Department of Public Health, Cook County Department of Public Health, Illinois Department of Public Health, and Centers for Disease Control and Prevention (CDC) for their direct involvement in and support of Chicago PROTECT. They also thank Louis Fogg and Vincent Young for fruitful discussion of the analyses presented here. They thank Ellen Benson, Mary Carl Froilan, Claire Heshmat, Jinal Makhija, and Mitali Shah for their role in specimen and data collection at participating healthcare facilities and Pamela Bell and Karen Lolans for their role in laboratory analysis. OpGen, Inc. (Gaithersburg, MD) provided Acuitas multidrugresistant organism gene test and Acuitas Resistome test in kind during 2016–2017.

**Disclaimer.** Any opinions, findings, conclusions, or recommendations expressed here are those of the authors and do not necessarily reflect the views of the CDC, National Science Foundation, or the National Institutes of Health.

*Financial support.* This work was supported by CDC Cooperative Agreement (grantU54 CK000481) and SHEPheRD (task order 200-2011-42037), the National Science Foundation Graduate Research Fellowship Program (grant DGE 1256260 to Z. L.), the National Institutes of Health via the Molecular Mechanisms of Microbial Pathogenesis Training Grant (T32AI007528, A.M-J.), and the National Institutes of Health (1R01AI148259-01 to E. S. S.).

**Potential conflicts of interest.** M. L. and M. H. have received research support in the form of contributed product from OpGen, LLC, and from Sage Products (now part of Stryker Corporation). M. L. has also received an investigator-initiated grant from CareFusion Foundation (now part of BD). M. H. and R. W. have participated in clinical studies where participating healthcare facilities received contributed product from Sage Products Inc, Molnlycke, Clorox, or Medline. Neither M. H., R. W., nor their hospitals received product, funding, payments, or any other form of compensation. M. L. reports honorarium from antibiotic resistance symposium (Medical College of Wisconsin) and participates on CDC's Healthcare Infection Control Practices Advisory Committee. All other authors report no potential conflicts.

All authors have submitted the ICMJE Form for Disclosure of Potential Conflicts of Interest. Conflicts that the editors consider relevant to the content of the manuscript have been disclosed.

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