Interfacility patient sharing and *Clostridioides difficile* infection incidence in the Ontario hospital system: A 13-year cohort study

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Abstract

Objective: Interfacility patient movement plays an important role in the dissemination of antimicrobial-resistant organisms throughout healthcare systems. We evaluated how 3 alternative measures of interfacility patient sharing were associated with *C. difficile* infection incidence in Ontario acute-care facilities.

Design: The cohort included adult acute-care facility stays of ≥3 days between April 2003 and March 2016. We measured 3 facility-level metrics of patient sharing: general patient importation, incidence-weighted patient importation, and *C. difficile* case importation. Each of the 3 patient-sharing metrics were examined against the incidence of *C. difficile* infection in the facility per 1,000 stays, using Poisson regression models.

Results: The analyzed cohort included 6.70 million stays at risk of *C. difficile* infection across 120 facilities. Over the 13-year period, we included 62,189 new cases of healthcare-associated CDI (incidence, 9.3 per 1,000 stays). After adjustment for facility characteristics, general importation was not strongly associated with *C. difficile* infection incidence (risk ratio [RR] per doubling, 1.10; 95% confidence interval [CI], 0.97–1.24; proportional change in variance [PCV], −2.0%). Incidence-weighted (RR per doubling, 1.18; 95% CI, 1.06–1.30; PCV, −8.4%) and *C. difficile* case importation (RR per doubling, 1.43; 95% CI, 1.29–1.58; PCV, −30.1%) were strongly associated with *C. difficile* infection incidence.

Conclusions: In this 13-year study of acute-care facilities in Ontario, interfacility variation in *C. difficile* infection incidence was associated with importation of patients from other high-incidence acute-care facilities or specifically of patients with a recent history of *C. difficile* infection. Regional infection control strategies should consider the potential impact of importation of patients at high risk of *C. difficile* shedding from outside facilities.

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More predictive patient sharing measures could be used for better risk adjustment, to enable fair interhospital comparisons, or to design optimal strategies to slow the interfacility spread of emergent strains of *C. difficile* or of other antimicrobial resistant organisms.

As such, we evaluated 3 different measures of interfacility patient sharing, including general patient importation, CDI incidence-weighted patient importation, and *C. difficile* case importation, and their association with CDI incidence in acute-care facilities in Ontario. We hypothesized that each measure of importation would be positively associated with facility CDI incidence.

**Methods**

**Data**

This study relied on comprehensive medico-administrative data covering all inpatients in Ontario, Canada, housed at ICES, a not-for-profit research institute based in Toronto. Ontario has a universal publicly funded healthcare system and ICES databases include virtually the entire population (excluding recent migrants within 3 months, those residing on aboriginal reserves, and military personnel). To identify hospital stays, we used the Canadian Institute for Health Information Discharge Abstract Database (CIHI-DAD) and the National Ambulatory Care Reporting System (NACRS), which together include information on all hospital stays in Ontario (whether inpatient admissions, same day surgery, or emergency department visits), in addition to diagnoses coded using the *International Classification of Diseases Tenth edition* (ICD-10) discharge codes. In addition, we used the Registered Persons Database (RPDB) to identify patient age, sex, and deaths, and an ICES-maintained healthcare institutions dataset (INST) that provides information on facility teaching status.

**Population**

We defined a full cohort of hospital stays between April 1, 2003, and March 31, 2016. A hospital stay was defined as the contiguous days spent at an emergency department, in day surgery, or as an inpatient in the same facility. We refer to hospital corporations as facilities because most hospital corporations consisted of stand-alone facilities. The full cohort was used to define hospital characteristics and patient-sharing metrics.

To measure hospital incidence of *C. difficile* infection, we also defined a subset of the full cohort at risk of hospital onset infection. These patients had stays of ≥3 days, did not have a history of CDI in the prior 90 days, and were ≥18 years of age. We excluded stays of ≤2 days, and patients with a history of CDI in the prior 90 days because they were not at risk of incident healthcare-facility onset CDI. We excluded patients <18 years of age because these patients were at lower risk of CDI. We included only larger facilities with at least 5,000 at-risk stays and ≥10 incident *C. difficile* cases, to ensure reliable measurement of *C. difficile* incidence rates.

**Outcomes**

Case patients with a first diagnosis of hospital-associated CDI in the prior 90 days were identified from the at-risk cohort of hospitalized patients using the ICD-10 discharge code A04.7. The ICD code for CDI has both a high sensitivity (88%) and a high specificity (99.7%). The primary outcome was the facility incidence of CDI per 1,000 at-risk stays during the study period.

**Patient-sharing metrics**

We measured 3 facility-level metrics of patient sharing that could be associated with facility CDI incidence (Table 1).

First, general patient importation (ie, the number of patient stays with a discharge from any external facility in the prior 90 days) was taken as a proportion of the total number of stays in the facility. This measure includes both directly transferred patients and patients with intervening nonhospital stays. General patient importation is a basic measure of interfacility patient movement and can be associated with facility CDI incidence because healthcare exposure is associated with increased risk of CDI and colonization. A conservative 90-day retrospective window was chosen because most studies show that CDI and colonization risk is elevated for extended periods after the time of discharge.

Second, incidence-weighted patient importation (ie, the weighted sum of general importation from an origin facility multiplied by the incidence of CDI in that facility) was taken across all origin facilities. This measure would better reflect the risk of importing either patients asymptomatically shedding *C. difficile* or identified *C. difficile* cases.

Third, *C. difficile* case importation (ie, the proportion of patient stays in a facility with a history of *C. difficile* identified based on the A04.7 discharge code), in any external facility in the prior 90 days. This represents the importation of the subset of patients with perhaps the highest risk of shedding *C. difficile* spores; patients who have been recently diagnosed with CDI are known to shed spores for at least 6 weeks after the end of treatment. Once again, a conservative 90-day retrospective window was chosen to ensure complete capture of the posttreatment shedding period.

For the calculation of these 3 patient-sharing metrics, the full cohort, which included all stays in the study period, was used because all patients visiting a hospital could have contributed to transmission and, hence, to a facility’s CDI incidence.

**Covariates**

We measured the following 7 facility-level adjustment covariates: (1) mean age, (2) proportion female, (3) mean Charlson comorbidity index based on hospital admissions in the prior year, (4) mean length of stay (CIHI-DAD), (5) the percentage of admissions to medical-surgical, psychiatry, and other services (CIHI-DAD), (6) mean daily number of patients admitted (ie, 1–5, 6–25, or ≥26 admissions per day), (7) teaching status of the facility (defined as facilities that give instruction to medical students or that give postgraduate education leading to certification or fellowship). As for the patient-sharing metrics, the full cohort that included all stays in the study period was used for calculating each covariate.

We also measured the hospital administrative region (N = 14) as a variable in descriptive analyses of patient sharing between and within regions.

**Statistical analysis**

We described interfacility variation with the interdecile range, which is equal to the ninetieth percentile divided by the tenth percentile. To depict linkages between specific origin and destination facilities geographically, we broke down general importation for a given destination facility into the components from each origin facility. We then visually displayed linkages between facilities where the number of patients in a given destination facility with
a discharge from an origin facility in the prior 90 days amounted to at least 1% of total stays to the destination facility.

Poisson regression models with the outcome equal to the count of CDI cases in the facility and an offset corresponding to the number of stays were used to model the incidence rate of CDI in each hospital. Facility-level random effects were used to account for overdispersion. For each patient-sharing measure, an unadjusted and adjusted model was developed, for a total of 6 models. Unadjusted models for each patient-sharing measure included no additional covariates, whereas adjusted models included all 7 covariates.

We communicated the impact of each covariate using risk ratios (RR) and 95% confidence intervals (CI). To make the estimated RRs comparable, all 3 patient-sharing metrics were log2 transformed before being entered into models, so the RRs represented risk increases associated with a doubling in the patient-sharing metrics. The 3 metrics were not included in a single model to guard against multicollinearity, which may have arisen due to the strong correlation between the 3 metrics.

We also measured covariate impact using the proportional change in variance (PCV). The PCV is similar to an R² statistic in that it can be interpreted as the percent of the facility-level variance that is explained by the covariate.

Results

The initial cohort hospital consisted of 29.86 million hospital stays in 168 hospitals over the 13-year period. After removal of small facilities with very few stays of patients at-risk of C. difficile infection (n = 48), 29.32 million stays in 120 facilities were included. This was the full cohort, which was used for the purposes of measuring facility-level patient sharing metrics and hospital covariates.

Because not all stays were at risk of incident C. difficile infection, we applied certain exclusions to the initial cohort to measure facility-level C. difficile infection incidence. These included stays of <3 days (19.35 million), age ≤18 years (3.61 million), and a history of C. difficile in the prior 90 days (N = 0.03 million). The at-risk cohort included 6.70 million stays across the same 120 facilities (Fig. 1).

Facility covariates

The median length of stay was 3.3 days (Table 2), and 16 (13.4%) of the included facilities had teaching status.
CDI incidence

Over the 13-year period, we observed 62,189 new cases of healthcare-associated CDI (incidence = 9.3 per 1,000 stays). CDI incidence varied substantially across facilities (median, 8.5 per 1,000 stays; tenth percentile [p10], 4.6; p90, 34.6; IDR, 2.4-fold). This measure included both directly transferred patients and patients with intervening nonhospital stays.

When we examined importation from specific facilities (Fig. 2), on average, 63% of general importation originated from facilities within the same healthcare region (N = 14) as a given destination facility.

When general importation was weighted by incidence of CDI in the facility, the overall variation was slightly larger (median, 18.6 per 10,000; p10, 11.4; p90, 34.6; IDR, 2.8-fold), and this measure was strongly correlated with general importation (r = 0.93).

Importation of patients with a history of CDI was much less common (median, 5.5 per 10,000), and variation was substantially greater between facilities (p10, 3.0; p90, 12.7; IDR, 4.2-fold) compared to general patient importation (4.2 of 2.4, 1.75). Importation of patients with C. difficile was only moderately correlated with general patient importation (r = 0.51) and with incidence-weighted importation (r = 0.52).

Prediction of facility CDI incidence

Levels of admission to medical-surgical services were positively associated with CDI incidence, whereas admissions to psychiatry were negatively associated with incidence. Increasing average length of stay was positively associated with the incidence of CDI. Facility size and facility teaching status were not associated with CDI incidence.

In unadjusted models, the 3 importation measures were related to CDI incidence (Fig. 3, Table 3). Each doubling of general patient importation was associated with a 24% increase in CDI incidence (95% CI, 1.12–1.37) and explained 14.1% of variation in CDI incidence. Each doubling of C. difficile case importation was associated with a 24% increase in incidence (95% CI, 1.15–1.34) and explained 22.4% of variation in CDI incidence (PCV, −22.4%). This PCV value for C. difficile case importation was larger than for the 7 other adjustment covariates examined.

After adjustment for 7 facility covariates, the strength of the association, in terms of both the RR per doubling and in terms of the PCV, for general patient importation and weighted patient importation, were reduced. Specifically, each doubling of general importation was associated with a 10% increase in CDI incidence (95% CI, 0.97–1.24). Each doubling of weighted patient importation was associated with an 18% increase in CDI incidence (95% CI, 1.06–1.30) and explained 8.4% of variation in CDI incidence. However, the association for CDI case importation was not reduced. For CDI case importation, each doubling was associated with a 43% increase in CDI incidence (95% CI, 1.29–1.58) and this variable explained 30.1% of variation in CDI incidence.

Discussion

In this 13-year study of CDI in Ontario, we observed substantial variation in incidence that was associated with patient sharing with other acute-care facilities. Measures that were made specific to C. difficile, whether by weighting origin facilities by CDI incidence or by counting only the importation of patients with a history of C. difficile, were more strongly associated with incidence.
We examined 3 alternative measures of patient sharing: general patient importation, incidence-weighted patient importation, and *C. difficile* case importation. Nekkab et al.\(^\text{13}\) examined interfacility patient movement in the French hospital system and found that both disease-agnostic and disease-specific patient-sharing networks for hospital-acquired infection reflected the French administrative structure. Similarly, we found that importation networks in Ontario did reflect health administrative regions, with most importation originating from facilities within the same administrative region. However, in our study *C. difficile* case importation was not strongly associated with general patient importation and varied 75% more than general importation.

In this study, importation was associated with CDI incidence, and this association was particularly strong for disease-specific importation measures that incorporated information on CDI incidence in origin facilities or CDI among the imported patients. Prior studies have shown that importation measures are important for CDI incidence. Specifically, Simmering et al. showed that disease-agnostic measures of patient inflow (which they termed ‘hospital indegree’ and ‘hospital weighted indegree’)\(^6\) were associated with infection incidence in California. Previously, we showed that disease-specific measures are associated in both nursing homes\(^20\) and in acute-care facilities\(^3\) in the Veteran’s Health Administration of the United States. These studies examined the
relative performance of such measures of importation, suggesting that disease-specific importation metrics are more predictive of incidence than disease-agnostic importation metrics. These findings may be important in the design of interventions aiming to identify C. difficile colonization at admission. Further decision analysis models will be needed to explore the cost-effectiveness of screening programs for patients with recent hospital admissions versus more targeted screening focusing on patients from high-incidence hospitals or patients with a recent history of C. difficile infection.

Our study has a number of limitations. First, we had no measurement of testing practices including the frequency and method of C. difficile testing at the facility, which may have been associated with rates of over- and underdiagnosis of infection. Second, we did not measure potentially important covariates including facility antibiotic utilization within facilities or infection control practices, though past studies considering these factors have shown no association with CDI incidence among acute-care facilities. Third, our study examined the cross-sectional association between importation and CDI incidence across a 13-year period. Because disease-specific importation for a specific hospital is likely highly variable over time, we would expect the predictiveness of disease-specific importation to be higher in a longitudinal study design. Fourth, we did not consider importation from nursing homes to acute-care facilities, especially of patients with a recent history of CDI in another facility. These findings complement recent findings from other jurisdictions, and they suggest that regional infection control strategies should consider the potential impact of importation of patients at high risk of C. difficile shedding from outside facilities.

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