Does location matter? A proposed methodology to evaluate neighbourhood effects on cardiac arrest survival and bystander CPR

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ABSTRACT

Background: Traditional variables used to explain survival following out-of-hospital cardiac arrest (OHCA) account for only 72% of survival, suggesting that other unknown factors may influence outcomes. Research on other diseases suggests that neighbourhood factors may partly determine health outcomes. Yet, this approach has rarely been used for OHCA. This work outlines a methodology to investigate multiple neighbourhood factors as determinants of OHCA outcomes.

Methods: A retrospective, observational cohort study design will be used. All adult non-emergency medical service witnessed OHCA of cardiac etiology within the city of Toronto between 2006 and 2010 will be included. Event details will be extracted from the Toronto site of the Resuscitation Outcomes Consortium Epistry—Cardiac Arrest, an existing population-based dataset of consecutive OHCA patients. Geographic information systems technology will be used to assign patients to census tracts. Neighbourhood variables to be explored include the Ontario Marginalization Index (deprivation, dependency, ethnicity, and instability), crime rate, and density of family physicians. Hierarchical logistic regression analysis will be used to explore the association between neighbourhood characteristics and 1) survival-to-hospital discharge, 2) return-of-spontaneous circulation at hospital arrival, and 3) provision of bystander cardiopulmonary resuscitation (CPR). Receiver operating characteristics curves will evaluate each model's ability to discriminate between those with and without each outcome.

Discussion: This study will determine the role of neighbourhood characteristics in OHCA and their association with clinical outcomes. The results can be used as the basis to focus on specific neighbourhoods for facilitating educational interventions, CPR awareness programs, and higher utilization of automatic defibrillation devices.

Contexte: Les variables classiques ne permettent d’expliquer que 72 % de la survie des malades à la suite d’un arrêt cardiaque extrahospitalier (ACEH), ce qui donne à penser que d’autres facteurs inconnus peuvent influer sur les résultats. Des recherches sur d’autres maladies semblent indiquer que des facteurs relatifs aux quartiers peuvent déterminer en partie les résultats cliniques. Pourtant, ce type de recherche a rarement été appliqué au contexte des ACEH. Sera exposée ici une méthode visant à étudier différents facteurs relatifs aux quartiers et à les considérer comme des déterminants de résultats cliniques après un ACEH.

Méthode: Pour ce faire, nous avons mené une étude de cohortes, rétrospective et observationnelle. Ont été retenus tous les adultes non rattachés à des services médicaux d’urgence, témoins d’un ACEH d’origine cardiaque, survenu dans la ville de Toronto entre 2006 et 2010. Les renseignements sur les faits ont été tirés du site Resuscitation Outcomes Consortium Epistry – Cardiac Arrest, une base de données déjà existante, située à Toronto, fondée sur une population composée de malades consécutifs ayant subi un ACEH. Pour ce qui est de la localisation, des systèmes d’information géographique ont été utilisés pour lier les malades à des secteurs de recensement. Les variables relatives aux quartiers devant être examinées comprenaient l’Ontario Marginalization Index (indice de marginalisation de l’Ontario; privations, dépendance, origine ethnique et instabilité), le taux de criminalité et la densité des omnipraticiens. Une analyse de régression logistique hiérarchique a servi à étudier l’association entre les caractéristiques des quartiers et 1) la survie jusqu’au congé de l’hôpital; 2) le rétablissement spontané de la circulation sanguine à l’arrivée à l’hôpital; et 3) les manoeuvres de réanimation cardiorespiratoire (RCR) appliquées par les passants. Des courbes caractéristiques de la performance des tests ont permis d’évaluer la capacité du
INTRODUCTION

Out-of-hospital cardiac arrest (OHCA) is a life-threatening condition. Each year more than an estimated 300,000 people suffer an OHCA in North America.1 Despite recent advancements in prehospital and emergency care, the prognosis in North America remains poor, with an average of less than 10% surviving.2,3 An unfortunate trend that has remained relatively stable over the past 30 years.4

Although early cardiopulmonary resuscitation (CPR) and rapid successful defibrillation can improve survival rates to almost 40%,4 it is highly dependent on numerous factors as represented by the links in the cardiac chain of survival, including immediate recognition of the event and activation of emergency medical services (EMS), early CPR, rapid defibrillation, effective advanced life support, and integrated post-cardiac arrest care.5

The Utstein variables were formulated as a template for cardiac arrest research and as a way to report the contribution of individual links in the chain.6 This template also highlights core data elements necessary for OHCA studies with the appropriate definitions (e.g., cardiac arrest witness status, EMS response time, bystander CPR, etiology).6 Researchers believed that these variables would account for most, if not all, aspects of survival.

In 2010, Rea et al. demonstrated that the Utstein variables accounted for only 72% of the nontraumatic EMS-treated survival (c-statistic = 0.86), which suggests that other unknown factors may influence outcomes.7 Despite the vast amount of evidence implicating the Utstein variables as the main predictors of survival, few studies to date have investigated non-Utstein variables as predictors of survival and their influence on outcome variability.5,7

In OHCA, socioeconomic status (SES)8–14 and race/ethnicity14–24 have been studied in relation to survival-to-hospital discharge and bystander CPR. These results are often contradictory and inconclusive, and these studies were limited in scope, only including one or two non-Utstein variables.

More recently, studies investigated the role of multiple factors on OHCA outcomes by expanding research from other disciplines, demonstrating that location can influence health outcomes.25 Ahn et al. used the Carstairs index as a composite measure to relate neighbourhood deprivation to cardiac arrest outcome in South Korea. They created deprivation indices for each census tract by averaging the z-standardized score across four census-derived indicators (overcrowding, unemployment among economically active men, percent in manual occupations, and lack of car ownership). Districts were then categorized into five quintiles based on level of deprivation. After adjusting for the Utstein variables, survival was significantly lower in the most deprived neighbourhood as compared to the least deprived.26 Sasson et al. evaluated collectively the influence of neighbourhood median household income and racial composition on the probability of receiving bystander CPR.13 They found that when compared to high-income Caucasian neighbourhoods, bystander CPR was less likely to occur in all neighbourhoods except those racially integrated with high median household incomes.13

Aside from a few prior studies, the majority of the literature has explored SES as a single variable (i.e., median household income or property tax value) with widely differing results. No study has been conducted in a Canadian setting, and none has collectively evaluated geographic, environmental, social, and cultural factors. Despite numerous examples within the social science and epidemiology literature where SES is treated as a complex, multidimensional construct encompassing varied socioeconomic and demographic factors, OHCA studies continue to use single SES descriptors in their analyses. This limitation might lead to inaccurate conclusions or mask potential differences in health-related outcomes.27 Furthermore, no previous study has investigated whether non-Utstein factors account for the remaining 28% of survival.

Given the previous limitations in the existing knowledge base, this study will investigate nontraditional
determinants of OHCA outcomes in Toronto, Canada. In particular, neighbourhood factors will be used to investigate and potentially improve the understanding of what influences cardiac arrest outcomes.

**OBJECTIVES**

The objective of this study is to describe the methodology that will be used to investigate the role of neighbourhood factors as determinants of out-of-hospital cardiac arrest outcomes. The specific research questions are the following:

1. In OHCA patients, are patient home neighbourhood factors associated with either survival-to-hospital discharge or a return of spontaneous circulation (ROSC) at emergency department (ED) arrival? Does the addition of patient home neighbourhood factors to the Utstein variables improve the overall discrimination of those variables?

2. In OHCA patients, are arrest location neighbourhood factors associated with bystander CPR? Does the addition of arrest location neighbourhood factors to the Utstein variables improve the overall discrimination of those variables?

**METHODS**

**Study design**

A retrospective, observational cohort study design will be used to investigate the relationship between neighbourhood factors and cardiac arrest outcomes.

**Setting and study participants**

All patients who experience an OHCA within the catchment area of the University of Toronto’s regional coordinating centre are entered into the Resuscitation Outcomes Consortium (ROC) Epistry–Cardiac Arrest registry, whose methodology has been previously described. An extensive quality assurance program is in place to verify the accuracy of the study data.

Primary care paramedics provide prehospital care in all regions and can perform CPR and semiautomated defibrillation. First responders from local fire departments and advanced care paramedics are tiered to all OHCA patients if and when available. Fire services in Ontario are equipped with automated external defibrillators and can perform basic life-support skills, while advanced care paramedics are able to gain intravenous access, provide advanced airway manoeuvres, and administer advanced life support (ALS) medications.

Inclusion and exclusion criteria for this study are in accordance with the Utstein template. All adult patients within the city of Toronto, age 20+ years, who sustained a nontraumatic OHCA will be eligible for enrolment. A minimum age of 20 years will be used to be consistent with other literature and the Canadian census age category definitions. Any patient who met the criteria for obvious death (i.e., rigor mortis, lividity, decapitation, hemisection, or decomposition), who had a valid do-not-resuscitate-advanced directive, or whose OHCA was witnessed by paramedics will be excluded. Any patient who is missing adequate information for geocoding will also be excluded.

**Geocoding**

The patient’s individual postal code will be used to determine his or her neighbourhood. Unfortunately, in health research, the use of the term *neighbourhoods* (or *community* or *area*) is problematic because it has been broadly used to determine health, yet rarely has been consistently defined. Although there is no standard definition of *neighbourhood* within the ROC Epistry–Cardiac Arrest, census tracts will be used in this project to define neighbourhoods. Census tracts consist of relatively small homogeneous subsets of the population with about 2,500–6,000 people (Figure 1) and have been used previously when studying the role of location in OHCA outcomes.

The patient’s home address will be used in the analysis for survival-to-hospital discharge (and a ROSC at ED arrival) under the premise that survival is dependent on both the event and patient characteristics. The patient’s home neighbourhood will be used as a surrogate for patient characteristics, because previous literature shows an association between home neighbourhood and cardiac risk factors, unhealthy behaviours,
and overall health. The neighbourhood factors of the arrest location (i.e., the pickup address) will be used to study the effects on bystander CPR, because the emergency response (i.e., bystanders and EMS/paramedics) is contingent on the arrest location.

A patient’s home address is recorded as mailing address with street name, street number, and postal code, whereas the pickup address is recorded as a mailing address, with latitude and longitude coordinates and a Universal Transverse Mercator (UTM) value. Postal codes will be the preferred source for identifying addresses. Missing postal codes will be determined from the street address, the latitude/longitude, or UTM values in a hierarchical fashion.

Postal codes will be linked to one of 531 nine-digit census tracts through a Postal Code Conversion File. Postal code conversion involves assigning each postal code to a census tract based on “best fit” dissemination area provided by Statistics Canada. In this approach, the postal code is assigned to the census tract that best covers the given postal code area. Each cardiac arrest patient will be assigned the characteristics of the associated census tract based on either the patient’s home address or pickup address using geographic information system (GIS) mapping technology.

Neighbourhood variables

Neighbourhood variables to be included in the analysis include 1) the Ontario Marginalization Index (ON-Marg), 2) the crime rate, and 3) the density of family physicians. Each neighbourhood variable is expressed at the census tract level.

The ON-Marg is a geographically derived index used to study marginalization and highlight inequalities in various measures of health and social well being. Its dimensions include 1) residential instability, 2) dependency, 3) material deprivation, and 4) ethnic concentration. Crime rate is collected by the Centre for Research on Inner City Health at St. Michael’s Hospital and is expressed as a number of violent crimes per 100,000 people at risk. This variable will be used to describe neighbourhood safety. The density of family physicians is collected by the Institute of Clinical and Evaluative Sciences and is expressed as a number of family physicians per 100,000 people. This will be
used as a surrogate measure of an individual’s access to health care.53

Each of the six neighbourhood variables will be converted from its continuous form into quintiles, where quintile one will represent a disadvantaged neighbourhood and quintile five will represent an advantaged neighbourhood, to be consistent with previous literature that separates variables of interest by quintiles.12,26,51 An analysis of variance (ANOVA) test will be used to ensure that each quintile is significantly different from one another across all variables.

**Statistical analysis**

Descriptive statistics will be used to assess the distribution of all variables. Continuous variables will be summarized as means and standard deviations, whereas categorical variables will be summarized as counts and percentages. The distribution of each continuous variable will be assessed for normality using graphical interpretation and the Shapiro-Wilk test.

Unadjusted bivariate analyses will be performed to assess for differences between the dependent and independent variables, using either a $t$-test for all continuous variables or an $\chi^2$ test for categorical variables. Model diagnostics will be performed on all models, and multicollinearity will be assessed using either the tolerance statistics or variance inflation factor (VIF). A tolerance of <0.4 or a VIF statistics of >2.5 would indicate multicollinearity.

Logistic regression analysis will determine relationships between the neighbourhood factors (in addition to the traditional Utstein variables) and the outcome measures. The regression model will adopt a hierarchical modelling approach using generalized estimating equations to capture variation within neighbourhoods as a random effect. Patients will be clustered based on census tract. This hierarchical approach also accounts for the lack of independence between variables, an assumption that would be violated if a single level modelling approach was used. Eight models will be analysed. One model (#1) will contain only the Utstein (or individual variables). Six models (#2–7) will include the Utstein variables and one neighbourhood factor. The final model (#8) will include the Utstein variables and all neighbourhood factors (Table 2). Odds ratios (ORs)

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**Table 1. Dimensions and census variables that make up the Ontario Marginalization Index.**

<table>
<thead>
<tr>
<th>Dimensions and Indicators</th>
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<tbody>
<tr>
<td><strong>Residential Instability</strong></td>
</tr>
<tr>
<td>Proportion of the population living alone</td>
</tr>
<tr>
<td>Proportion of the population who are not youth (aged 16+)</td>
</tr>
<tr>
<td>Average number of persons per dwelling</td>
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<tr>
<td>Proportion of dwellings that are apartment buildings</td>
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<tr>
<td>Proportion of the population who are single/divorced/widowed</td>
</tr>
<tr>
<td>Proportion of dwellings that are not owned</td>
</tr>
<tr>
<td>Proportion of the population who has moved during the past 5 years</td>
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<tr>
<td><strong>Dependency</strong></td>
</tr>
<tr>
<td>Proportion of the population who are aged 65 and older</td>
</tr>
<tr>
<td>Dependency ratio (total population 15-64 / total population 0-14 and 65+)</td>
</tr>
<tr>
<td>Proportion of the population not participating in the labour force (aged 15+)</td>
</tr>
<tr>
<td><strong>Material Deprivation</strong></td>
</tr>
<tr>
<td>Proportion of the population aged 20+ without a high-school diploma†</td>
</tr>
<tr>
<td>Proportion of families who are lone parent families</td>
</tr>
<tr>
<td>Proportion of the population receiving government transfer payments</td>
</tr>
<tr>
<td>Proportion of the population aged 15+ who are unemployed</td>
</tr>
<tr>
<td>Proportion of the population considered low-income‡</td>
</tr>
<tr>
<td>Proportion of households living in dwellings that are in need of major repair</td>
</tr>
<tr>
<td><strong>Ethnic Concentration</strong></td>
</tr>
<tr>
<td>Proportion of the population who are recent immigrants (arrived in the 5 years prior to the 2006 Canadian census)</td>
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<tr>
<td>Proportion of the population who self-identify as a visible minority</td>
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</table>

*Aboriginal indicators did not load on any of the factors

†For the 2006 index, the indicator is the proportion of the population ages 25+ without a certificate, diploma or degree. This is due to a change in the Statistics Canada definition

‡“Low income” is defined as below the low income cutoff (LICO), a Statistics Canada measure that is adjusted for community size, family size, and inflation

Adapted from Matheson (Can J Public Health, 2012)51

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Discrimination will be calculated as $(AUC - 0.5)/0.5$. The area under the curve (AUC) will be determined as a measure of the model’s ability to discriminate between those with and without the outcome of interest (either survival-to-hospital discharge, a ROSC at ED arrival, or bystander CPR). The area under the curve (AUC) will be used to determine the probability that a patient will be correctly classified based on the outcome. Discrimination will be calculated as $([AUC - 0.5]/0.5)$. 

**Research ethics**

Individual research ethics boards (REB) at all 37 destination hospitals within the catchment area approved the design and implementation of ROC Epistry–Cardiac Arrest. An institutional REB at St. Michael’s Hospital provided approval for all retrospective studies using the ROC Epistry–Cardiac Arrest database. This study was also approved by the University of Toronto REB, which governs research performed by graduate students at academic hospitals associated with the University of Toronto.

**DISCUSSION**

To our knowledge, this will be the first Canadian study to investigate both traditional and nontraditional factors for OHCA outcomes. Although this study will not directly change clinical practice, it will help advance the understanding of a public health concern that kills over 90% of Canadians who experience an OHCA. Provided that differences are observed, this study will also highlight the role of neighbourhood inequalities in explaining differences in survival. The results of this study will be of interest to resuscitation researchers, physicians, city planners, and policymakers because it may lead to the implementation of policy and procedures to optimize the delivery of care for specific neighbourhoods. It will also help decision makers plan future bystander CPR education programs and community-based intervention programs for areas with

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**Table 2. The variables that will be included in the model.**

<table>
<thead>
<tr>
<th>Variables</th>
<th>#1</th>
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<th>#3</th>
<th>#4</th>
<th>#5</th>
<th>#6</th>
<th>#7</th>
<th>#8</th>
</tr>
</thead>
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<tr>
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<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
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<tr>
<td>Instability</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
</tr>
<tr>
<td>Instability</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
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<tr>
<td>Material Deprivation</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
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<tr>
<td>Ethnic Concentration</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
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<tr>
<td>Crime Rate</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
<td>✓</td>
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<tr>
<td>Density of Family Physicians</td>
<td>✓</td>
<td>✓</td>
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</table>

✓ indicates variables included in logistic regression model

The Utstein variables include: age, gender, location of arrest, bystander witness status, bystander CPR, bystander AED, EMS response time interval, initial rhythm, advanced life support skill, and ROSC at ED arrival.
low rates of bystander CPR. Knowledge of neighbourhood risk factors for cardiac arrests and their association with population demographics could be helpful for treating and counseling individual patients, but also for planning EMS system response and community-wide health programs that will aid the largest number of citizens. It will also contribute to the existing health care system by identifying neighbourhoods that could potentially benefit from targeted policy and public health interventions. With collaboration between scientists, clinicians, policymakers, and elected city and health officials, there is the potential for improving individual and population health.

This study has many strengths. First, data will be extracted from a reputable, research quality registry of OHCA patients assessed by prehospital care providers. This registry has been used to answer OHCA-related questions, which have been incorporated into the current American Heart Association guidelines. The large sample size provides adequate power to detect small differences in outcomes. Second, the rigorous proposed analytic approach uses hierarchical modelling to account for patient and neighbourhood variables, and for patient clustering within neighbourhoods. Without the risk of multicollinearity, selecting a composite score will take into account the complex and multidimensional aspect of neighbourhood variables. Third, previous research almost exclusively reported ORs, which is useful for highlighting associations between predictor variables and outcomes, but is limited for identifying the discriminative ability of the independent variables. Although identifying causal relationships are not possible with this current design, this study will be the first to use receiver operating characteristics curves as a quantitative measure of a variable’s discriminative ability for cardiac arrest outcomes. Furthermore, this study will demonstrate how GIS mapping technology could be adapted to explore a life-threatening public health concern. Its detailed methods section provides a step-by-step approach for using and adapting GIS technology to prehospital care. Combining cardiac arrest data with this technology provides a unique perspective about the association between locations and OHCA.

This study has some limitations. It relies on postal codes, UTM, or latitude/longitude to link patients with the neighbourhood factors. Location errors could result in misclassification, and then the patient would be linked to the incorrect census tract, which could introduce selection bias. An estimated 5% of cases will be excluded due to incomplete geographic information, which is consistent with previous literature that has excluded between 3% and 15% of eligible cases. There are limitations associated with using census data. Neighbourhood characteristics may not be generalizable to individuals within a given census tract. Missing or incorrect data and low frequency counts could also alter conclusions. Although census data have their own limitations, they are one of the only population level datasets available to researchers. To prevent bias, Census Canada does follow up with any incomplete or unanswered questionnaires and adjusts the data for households who do not return a questionnaire.

**CONCLUSIONS**

This paper highlights the methodology that will be used to evaluate the role of the neighbourhood as determinants of cardiac arrest outcomes, and whether those factors improve the discriminative ability of the Utstein variables.

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**Competing interests:** JEB holds a Jumpstart Resuscitation Master’s Studentship from the Canadian Heart and Stroke Foundation. LJMc is a U.S. National Institute of Health, Canadian Institute of Health Research, and Heart and Stroke Canada funded investigator within the Resuscitation Outcomes Consortium. She is a past chair and current member of the Science Subcommitte of Emergency Cardiac Care Committee of the American Heart Association and on the editorial board of the 2010 guidelines in resuscitation as the co-chair of the International Liaison Committee of Resuscitation Advance Life...
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Support Taskforce in 2010 and current past chair of the ALS Taskforce for ILCOR 2015. She is the past chair of the Research and Policy Planning Advisory Committee and past board of directors member for Heart and Stroke Canada. The remaining authors have no competing interests relevant to this topic.

**Authors’ contributions:** JEB conceived and designed the study under guidance from KSA, JGR, AK, PG, PD, and LJM. LJM oversaw data collection. JEB and LJM obtained ethics approval. JEB will be responsible for analysis and interpretation of the data under guidance from JGR, AK, and LJM. JEB and KSA drafted the manuscript, and all authors revised it for critically important intellectual content and approved the final version.

**REFERENCES**


