The spatial epidemiology of trauma: the potential of geographic information science to organize data and reveal patterns of injury and services

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Despite important advances in the prevention and treatment of trauma, preventable injuries continue to impact the lives of millions of people. Motor vehicle collisions and violence claim close to 3 million lives each year worldwide. Public health agencies have promoted the need for systematic and ongoing surveillance as a foundation for successful injury control. Surveillance has been used to quantify the incidence of injury for the prioritization of further research, monitor trends over time, identify new injury patterns, and plan and evaluate prevention and intervention efforts. Advances in capability to handle spatial data and substantial increases in computing power have positioned geographic information science (GIS) as a potentially important tool for health surveillance and the spatial organization of health care, and for informing prevention and acute care interventions. Two themes emerge in the trauma literature with respect to GIS theory and techniques: identifying determinants associated with the risk of trauma to guide injury prevention efforts and evaluating the spatial organization and accessibility of acute trauma care systems. We review the current literature on trauma and GIS research and provide examples of the importance of accounting for spatial scale when using spatial analysis for surveillance. The examples illustrate the effect of scale on incident analysis, the geographic variation of major injury across British Columbia's health service delivery areas (HSDAs) and the rates of variation of injury within individual HSDAs.

En dépit des progrès importants réalisés en prévention et en traitement des traumatismes, des millions de personnes souffrent toujours des répercussions de blessures évitables. Les accidents de la circulation et la violence font presque 3 millions de victimes par année dans le monde. Les agences de santé publique préconisent la surveillance systématique et continue comme base du contrôle réussi des blessures. On a utilisé la surveillance pour quantifier l'incidence des traumatismes afin d'établir des priorités pour la recherche à venir, de suivre les tendances, de dégager de nouvelles tendances des traumatismes et de planifier et d'évaluer les efforts de prévention et d'intervention. Les progrès de la capacité de traitement des données spatiales et les augmentations importantes de la capacité de calcul ont fait des sciences de l'information géographique (SIG), ou géomatique, un outil qui pourrait se révéler important pour la surveillance de la santé et l'organisation spatiale des soins de santé, ainsi que pour éclairer les mesures de prévention et de soins actifs. Deux thèmes se dégagent des publications sur la traumatologie en ce qui a trait à la théorie et aux techniques des SIG : l'identification des déterminants associés au risque de traumatisme pour guider les efforts de prévention des blessures et l'évaluation de l'organisation spatiale et de l'accessibilité des systèmes de soins actifs en traumatologie. Nous passons en revue les publications courantes relatives à la recherche sur les traumatismes et la SIG et nous montrons pourquoi il importe de tenir compte de l'échelle spatiale dans l'utilisation de l'analyse spatiale pour la surveillance. Les exemples illustrent l'effet d'échelle sur l'analyse d'incidence, la variation géographique des principaux traumatismes dans les régions de prestation de services de santé (RPSS) et les taux de variation des blessures selon les RPSS.

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espite important advances in trauma prevention and treatment, preventable injuries continue to impact the lives of millions of people. Worldwide, motor vehicle collisions and violence claim close to 3 million lives each year.^{1,2} Although the United States and Canada have highly developed public health programs and trauma systems, trauma is still responsible for more than 150 000 deaths and 3 million hospital admissions annually in those countries. About 30% of all years of productive life lost before age 65 are attributed to unintentional injuries and violence; this surpasses the combined losses from heart disease, cancer and stroke.3,4 Societal costs of injury-related morbidity in these countries are estimated to exceed \$275 billion dollars each year.^{5,6}

Further advances in injury control are urgently needed. Public health agencies, including the World Health Organization, the US Centers for Disease Control and Prevention, the Institute of Medicine and the Canadian Public Health Association, have promoted the need for systematic and ongoing surveillance as a foundation for successful injury control. Surveillance has been used to quantify the incidence of injury for the prioritization of further research, monitor trends over time, identify new injury patterns, and plan and evaluate prevention and intervention efforts. Refinements in injury surveillance that can discern specific risk factors amenable to intervention may represent the next important frontier in injury control.

Advances in the capability to handle spatial data, along with substantial increases in computing power, have positioned geographic information science (GIS) as a potentially important tool for understanding population health and the spatial organization of health care^{7,8} and for informing prevention and acute care interventions. GIS facilitates the integration of data from multiple sources; provides collection, storage and ma-

nipulation capabilities; and offers an array of tools for spatial analysis, allowing valuable insights into health data. We provide a review of the current literature on trauma and GIS research. In addition, we provide examples of the importance of accounting for spatial scale when using spatial analysis for surveillance — a unique methodologic issue associated with GIS analysis.

GIS in trauma research

The use of GIS in population health is widespread, and GIS and health has become a distinct research area.9 However, the capabilities of GIS have not been extensively applied in the trauma literature. A few studies examining the social or spatial aspects of trauma have employed some GIS methods for data management, geocoding, data linkage and mapping, but they have not explicitly identified themselves as GIS-based and have not fully taken advantage of the analytical capabilities of GIS. These studies link trauma data to socioeconomic information (e.g., census data) and examine the relations between family or household characteristics, socioeconomic conditions and injury. However, they only pay cursory attention to the spatial articulation of injury. 10-13

Two sometimes overlapping themes consistently emerge in the trauma literature where GIS theory or techniques are relevant: identifying determinants of the risk of trauma to guide injury-prevention efforts and evaluating the spatial organization and accessibility of acute trauma care systems. The former studies assess the contributions of human and environmental factors (e.g., income, social status, education, race, employment and working conditions, social support networks, social environments, physical environments) to the risk of injury. The latter studies often draw on location-allocation approaches to examine the efficacy of existing acute care trauma systems or assess the spatial accessibility of trauma care, paying close attention to inequitable access across geographic space.

The contributions of GIS to our current understanding of the determinants associated with the risk of trauma and the delivery of acute trauma care are summarized in the next section. We also outline with examples the methodologic concerns associated with spatial analysis.

Determinants of the risk of trauma

Geography

Epidemiologic studies have examined the geographic dimensions of trauma in relation to specific population subgroups and the type of injury. Childhood injury in particular is well represented among trauma studies. Joly and colleagues14 examined the geography of injuries among pedestrians and cyclists in the pediatric population in Montréal, Quebec, that involved motor vehicles. The authors found that few high-injury census tracts were spatially concentrated. Braddock and colleagues¹⁵ studied the geographic distribution of trauma among youth aged 20 years and younger in Hartford, Connecticut. This study used the mapping capabilities of GIS to visualize the location of trauma injuries and identify 2 high-risk areas that represented 70% of all trauma events within the study region. Both studies, although effective, used very simple analytical approaches — statistical analysis of spatially aggregated data on trauma and point mapping. The study by Braddock and colleagues¹⁵ also suggested site-specific interventions, including environmental modifications and educational programs.

Societal determinants

The GIS methods can go beyond the demonstration of the associations between risk of injury and geography.

They can discern specific societal factors that place subpopulations at risk. Socieoeconomic status, for instance, was found to be an important determinant of the risk of injury among Canadian children in a study that linked injury mortality data to socioeconomic status derived from census data on urban areas.16 This study confirmed a known link between socioeconomic status and injury rates and demonstrated that a 20-year trend toward decreased injury rates among more deprived populations in urban areas has recently been reversed. Although the study carefully differentiated between urban and rural areas, it did not differentiate between spatial locations and contexts. Are there, for instance, more injuries among children in families with a low socioeconomic status in northern Canadian cities? Do fewer injuries occur in families with low socioeconomic status residing in neighbourhoods with a statistically higher socioeconomic status? These are nuances that can potentially be addressed by the incorporation of spatial analysis.

Composite indicators of geography and societal factors have also been developed. Cockings and Martin¹⁷ developed a conceptual model of health events and associated outcomes in which health effects are the product of vulnerability and exposure to individual and arealevel factors. Vulnerability is conceptualized as a combination of individual predisposing and behavioural factors, while exposure is a function of both environmental factors (natural, built and social contexts) and behavioural factors. Predisposing factors are individual attributes such as age, sex, race and genetics that are not modifiable, whereas behavioural factors such as lifestyle, occupation, education and income can be altered by personal choice.) The complex relation between individual and arealevel determinants of injury poses an analytic challenge to trauma studies, but also illustrates the important role

of the capability of GIS to handle spatial data in trauma research.

Understanding exposure and vulnerability in the context of the risk of trauma and outcome requires various individual and area-level data sources to be linked and combined. Data linkage allows researchers to better leverage existing data resources, thereby increasing their analytical possibilities.18 A number of tools and methods for data linkage are provided within GIS software packages. Geocoding, the most fundamental method, allows spatial files to be generated from nonspatial attributes based on location information such as an address or postal code.19 Geocoded data on trauma can be used to map locations where injuries occur and to then spatially link this information to other data describing the natural, built and social environments in which injuries occur.

The spatial organization of trauma care

Kivell and Mason²⁰ suggest that timely access to trauma care can, along with accident prevention strategies, act as a means of reducing trauma-related mortality. As they point out, Trunkey²¹ found that when mortality from trauma is plotted by time after injury, a trimodal distribution emerges. The first peak represents deaths that occur on or immediately after injury, the second peak represents deaths that occur within the first few hours after injury, and the third peak represents deaths that occur days or weeks after injury. Kivell and Mason²⁰ argue that the second peak includes potentially preventable deaths. They suggest immediate prehospital treatment and timely transfer (within the first couple of hours after injury) to a trauma care facility would reduce mortality in the second peak. Using a location-allocation approach in a GIS environment, the authors propose that 30 trauma systems, each with 1 trauma centre and multiple supporting hospitals, would provide optimal trauma care coverage for the United Kingdom.

Peters and Hall²² present a GIS framework for assessing ambulance response times. They draw on the capability of GIS to handle spatial data to geocode ambulance call data and link it to service territories. They analyze spatiotemporal response time to determine how well the existing ambulance services serve their catchment populations. The GIS framework presented was intended to assist planners to identify areas where response time was unsatisfactory and provide the means to investigate the possible causes of poor performance (e.g., poor spatial coverage, insufficient resources, inefficient dispatch).

The 2 emerging themes of GIS and trauma — the determinants associated with the risk of trauma and the spatial organization of trauma care systems — remain underdeveloped.

Important research on access to trauma facilities and the relative cost-benefit of trauma facilities has been conducted in the United States. MacKenzie and colleagues23 reported that in-hospital mortality is substantially lower at trauma centres than at hospitals without full trauma services. Their research indicated that the risk of death was much lower among patients who received treatment in trauma centres than among patients who did not, implying that regionalization of services continues to be important. Nathens and colleagues²⁴ found inconsistency in the availability of trauma resources across the United States, Likewise, Branas and colleagues²⁵ found that about 16% of the population in the United States was not located within 1 hour of a trauma facility. However, their study was based on the assumption that air transport was always available. If road travel time was used, they likely would have found a greater number of people without access to a trauma facility within 1 hour.

These studies are characterized by their use of statistical techniques rather than GIS to calculate access. In a previous study,²⁶ we used GIS to calculate road travel times to rural hospitals. This method may prove more effective in terms of accurately estimating travel time and access.

Methodologic considerations

Examining the geographic variation of injury rates within a study region must address a number of methodologic considerations, especially when mapping rates in small areas or at the neighbourhood level.^{27,28} Mapping trauma events requires deciding between vector- and raster-based representation. Vector-based representation (i.e., point, line and area maps) typically use data that are already associated with predefined administrative units such as census tracts or postal codes. Vector-based GIS tends to aggregate such areal units to create incidence rate maps, while raster-based representation

(grid cell maps) generally uses neighbourhood functions to create a continuous surface that shows health event density.²⁹ Vector-based representation is commonly used in epidemiology because it allows for easy linkage and spatial aggregation of trauma events to the same areal units as census-based population data. This allows the relation between trauma and the socioeconomic, cultural and demographic characteristics of an area to be examined either visually or statistically.^{12-14,30-34}

When mapping trauma rates using administrative or statistical areal units, one must be aware of the potential unreliability of rates derived from small numbers, as well as the impact of the modifiable areal unit problem (MAUP) on statistical results and spatial patterns. ^{17,29,35} Unreliable incidence rates can be mitigated in trauma studies through the use of sophisticated statistical techniques such

as empirical Bayesian smoothing or probability mapping. 9,36 Because of the relative infrequency of trauma events, especially specific or major injury, recent trauma studies have used Bayesian analysis to stabilize mapped injury rates. 37,38

The MAUP is an unresolved problem inherent to mapping and statistical analysis that uses areal data.39 Statistical results or mapped patterns derived from these data are affected by the scale (i.e., the number of areal units) and spatial configuration of the units used.40 Although, as yet, no solution to the MAUP has been developed, the awareness of its impact on analytical results, the importance of areal unit choice and improved zone design are consistently identified as possible means to reduce the negative impacts of the problem.^{17,41} The following example illustrates the importance of accounting for spatial scale when mapping trauma.

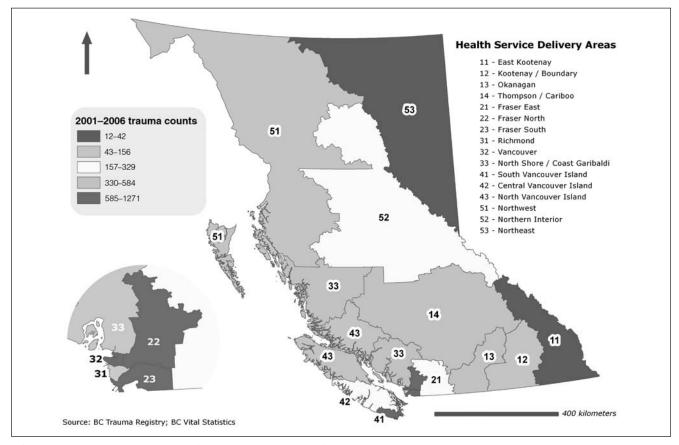


FIG. 1. Trauma incidence by Health Service Delivery Area (HSDA). The general pattern varies based on the geographic unit used (e.g., an area within a specific HSDA may have a higher trauma count).

Spatial epidemiology at work: a preliminary assessment of scale and injury in British Columbia

The spatial dimensions of severe trauma injury in British Columbia

In a mountainous jurisdiction such as British Columbia, the location of geographic barriers (and transportation routes) have heavily influenced settlement patterns.42 Slightly more than half of the province's population lives within the Vancouver Census Metropolitan Area, as defined by Statistics Canada. Outside the Vancouver area, there are substantial population concentrations in Abbotsford and the Fraser Valley, in southern Victoria and in Kelowna and the Okanagan Valley. The remaining population is dispersed across the rest of the province in

communities that are best characterized as rural and remote, and that are typically linked to resource extraction.

The sociospatial dimensions of trauma in British Columbia can be broadly illustrated by examining distribution at a range of geographical scales including health service delivery areas (HSDAs), census subdivisions (CSDs), urban area census tracts and dissemination areas. Figure 1 illustrates the incidence of trauma for the HSDAs in British Columbia. The HSDAs are intermediate administrative units containing multiple health care facilities that are spatially organized to function as an integrated system, with higher-level services provided by a regional hospital. The HSDAs serve wide range of catchment populations (and population sizes); the largest serves more than a

half-million people and the smallest serves slightly more than 60 000. Although useful for the analysis of rare and airborne diseases, injury rates calculated for large administrative areas are problematic because these areas are often poorly representative of the underlying sociodemographic environment.

The CSDs are equivalent in size to a municipality. On average, each HSDA contains more than 40 municipalities, although these numbers are substantially higher in the HSDAs surrounding the Vancouver Census Metropolitain Area and considerably lower for urban and rural centres throughout the interior of the province. The populations of CSDs range from more than 100 000 people in municipalities within British Columbia's Lower Mainland and the capital district to

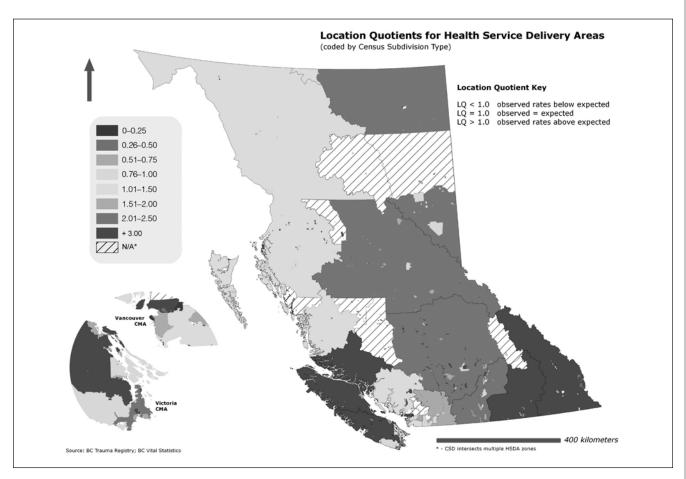


FIG. 2. Location quotients for Health Service Delivery Areas in the province of British Columbia. Note that more rural areas tend to be associated with higher location quotients.

1000 people or less in remote regions. Using an approach analogous to a location quotient, Figure 2 reveals the geographic variation of major injury within the HSDAs based on the degree to which the CSD rates differ from the HSDA-wide rate. A number of areas are clearly identified as high-injury areas in which the actual rates of major injury are more than double the HSDA-wide rate.

Figure 3 underscores the variation between Figure 1 and Figure 2 by revealing the effect of scale on trauma rates. Use of a larger scale (i.e., smaller area) illustrates more nuanced patterns within HSDAs. As discussed previously, the MAUP is a persistent problem, but not one that should deter analysts from examining trauma in a spatial context. In British Columbia, there is no logical spatial

relation between health authority boundaries and census spatial units. The latter, however, frequently encompass too broad an area to be meaningful for spatial analysis. Census spatial units permit a higher-resolution portrayal of rates and are therefore useful for understanding patterns of spatial injury. The examples presented are not designed to be a comprehensive spatial analysis of trauma; rather, they illustrate the potential of GIS as a means to enhance understanding of spatial patterns in trauma.

Discussion and Conclusion

The techniques and theory of GIS offer trauma studies a number of clear benefits, especially in the area of injury surveillance. Here, GIS capabilities could be leveraged to

assist researchers and health practitioners to develop a more comprehensive understanding of the risk of trauma and outcome, allowing them to improve access to trauma care, better allocate scarce resources and develop more effective prevention strategies.43,44 We reviewed the current use and promise of GIS techniques in injury control. In addition, we identified a key methodologic concern: the extent to which scale can influence the interpretation of results. Examples from British Columbia illustrate the potential utility of mapping and analyzing trauma at a range of spatial scales.

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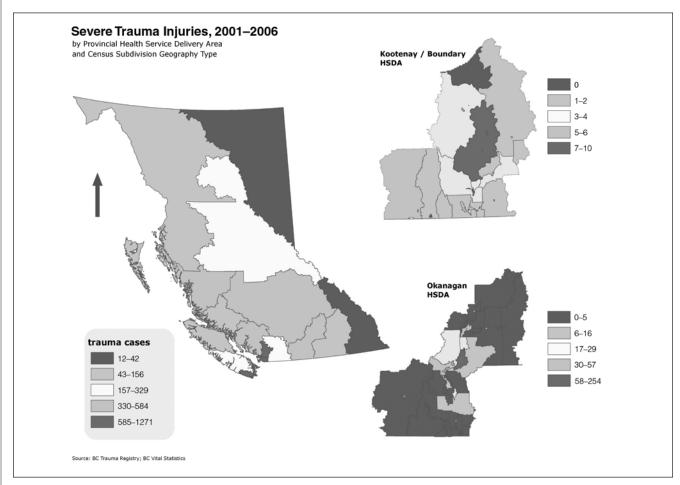


FIG. 3. Incidence of severe injury by Health Service Delivery Area (HSDA) and within the Kootenay/Boundary and Okanagan HSDAs. Trauma rates vary widely within HSDAs, thus scale matters — especially when interpreting mapped results.

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References

- Krug EG, Dahlberg LL, Mercy JA, et al., editors. World report on violence and health. Geneva: World Health Organization: 2002.
- Peden M, Scurfield R, Sleet D, et al., editors. World report on road traffic injury prevention. Geneva: World Health Organization; 2004.
- Centers for Disease Control and Prevention (CDC). Update: years of potential life lost before age 65 United States, 1988 and 1989. MMWR Morb Mortal Wkly Rep 1991;40:60-2.
- Waller JA. Reflections on a half century of injury control. Am J Public Health 1994;84:664-70.
- Bonnie RJ, Fulco CE, Liverman CT, editors; Committee on Injury Prevention and Control, Institute of Medicine. Reducing the burden of injury: advancing prevention and treatment. Washington: National Academy Press; 1999.
- Angus DE, Cloutier E, Albert T, et al. The economic burden of unintentional injury in Canada. Toronto: SMARTRISK; 1998. Available: www.smartrisk.ca/Listing Contributions.aspx?sd=77&dd=3 (accessed 2007 Jan 19).
- 7. McLafferty SL. GIS and health care. Annu Rev Public Health 2003;24:25-42.
- Rushton G. Public health, GIS, and spatial analytic tools. Annu Rev Public Health 2003;24:43-56.
- Cromley EK, McLafferty SL. GIS and public health. New York: Guilford Press; 2002.
- Faelker T, Pickett W, Brison RJ. Socioeconomic differences in childhood injury: a population based epidemiologic study in Ontario, Canada. *Inj Prev* 2000;6:203-8.
- Soubhi H, Raina P, Kohen DE. Neighborhood, family, and child predictors of childhood injury in Canada. Am J Health Behav 2004;28:397-409.
- Haynes R, Reading R, Gale S. Household and neighbourhood risks for injury to 5-14 year old children. Soc Sci Med 2003; 57:625-36.
- Shenassa ED, Stubbendick A, Brown MJ. Social disparities in housing and related pediatric injury: a multilevel study. Am J

- Public Health 2004;94:633-9.
- 14. Joly M-F, Foggin PM, Pless IB. Geographical and socio-ecological variations of traffic accidents among children. *Soc Sci Med* 1991;33:765-9.
- Braddock M, Lapidus G, Cromley E, et al. Using a geographic information system to understand child pedestrian injury. Am J Public Health 1994;84:1158-61.
- Birken CS, Parkin PC, To T, et al. Trends in rates of death from unintentional injury among Canadian children in urban areas: influence of socioeconomic status. CMAJ 2006;175:867-8.
- Cockings S, Martin D. Zone design for environment and health studies using preaggregated data. Soc Sci Med 2005;60: 2729-42.
- 18. Black C, Roos LL. Linking and combining data to develop statistics for understanding the population's health. In: Friedman DJ, Hunter EL, Parrish RG, editors. Health statistics: shaping policy and practice to improve the population's health. Oxford: Oxford University Press; 2005. p. 214-40.
- Yang D-H, Bilaver LM, Hayes O, et al. Improving geocoding practices: evaluation of geocoding tools. *J Med Syst* 2004;28: 361-70.
- Kivell P, Mason K. Trauma systems and major injury centres for the 21st century: an option. *Health Place* 1999;5:99-110.
- 21. Trunkey DD. Trauma. *Sci Am* 1983;249: 28-35.
- Peters J, Hall GB. Assessment of ambulance response performance using a geographic information system. Soc Sci Med 1999;49:1551-66.
- MacKenzie EJ, Rivara FP, Jurkovich GJ, et al. A national evaluation of the effect of trauma-center care on mortality. N Engl J Med 2006;354:366-78.
- Nathens AB, Jurkovich GJ, MacKenzie EJ, et al. Resource-based assessment of trauma care in the United States. *J Trauma* 2004; 56:173-8.
- Branas CC, MacKenzie EJ, Williams JC, et al. Access to trauma centers in the United States. *JAMA* 2005;293:2626-33.
- Schuurman N, Fiedler R, Grzybowski S, et al. Defining rational hospital catchments for non-urban areas based on travel-time. *Int J Health Geogr* 2006;5:43.
- Breckenridge MB, Tallia AF, Like RC. Display of small-area variation in healthrelated data: a methodology using resistant statistics. Soc Sci Med 1988;26:141-51.
- Wakefield J, Elliott P. Issues in the statistical analysis of small area health data. *Stat Med* 1999;18:2377-99.
- 29. Brabyn L, Wilkins D. Mapping health

- events a comparison of approaches. *Health Informatics J* 2001;7:207-13.
- Braddock M, Lapidus G, Gregorio D, et al. Population, income, and ecological correlates of child pedestrian injury. *Pediatrics* 1991;88:1242-7.
- Kendrick D, Mulvaney C, Burton P, et al. Relationships between child, family and neighbourhood characteristics and childhood injury: a cohort study. Soc Sci Med 2005;61:1905-15.
- Noland RB, Quddus MA. A spatially disaggregate analysis of road casualties in England. Accid Anal Prev 2004;36:973-84.
- Pomerantz WJ, Dowd MD, Buncher CR. Relationship between socioeconomic factors and severe childhood injuries. *J Urban Health* 2001;78:141-51.
- Reading R, Langford IH, Haynes R, et al. Accidents to preschool children: comparing family and neighbourhood risk factors. Soc Sci Med 1999;48:321-9.
- Nakaya T. An informational statistical approach to the modifiable areal unit problem in incidence rate maps. *Environ Plan A* 2000;32:91-109.
- 36. Bailey TC, Gatrell A. *Interactive spatial data analysis*. Essex: Pearson Education (Longman); 1995.
- MacNab YC. Bayesian spatial and ecological models for small-area accident and injury analysis. *Accid Anal Prev* 2004;36: 1019-28.
- Williams KG, Schootman M, Quayle KS, et al. Geographic variation of pediatric burn injuries. *Acad Emerg Med* 2003;10: 743-52.
- Fotheringham AS, Brundsdon C, Charlton M. Quantitative geography: perspectives on spatial data analysis. London: Sage; 2000.
- 40. Openshaw S. The modifiable areal unit problem. Concepts and techniques in modern geography. Norwich: GeoBooks; 1984.
- 41. Openshaw S. Ecological fallacies and the analysis of areal census data. *Environ Plan A* 1984a;16:17-31.
- 42. Watson DE, Krueger H, Mooney D, et al. Planning for renewal: mapping primary health care in British Columbia. Vancouver: Centre for Health Services and Policy Research (CHSPR); 2005.
- 43. Hameed SM, Popkin CA, Johnson EW, et al. The epidemic of pediatric traffic injuries in south Florida: a review of the problem and initial results of a prospective surveillance strategy. Am J Public Health 2004;94:554-6.
- 44. Pierce JA, Ray LU, Wood S, et al. Creating and using a geographic information system for motor vehicle-related injury surveillance in San Diego County. *Top Emerg Med* 1999;21:26-31.