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# Microsimulation Model Projecting Small Area Populations Using Contextual Variables: An Application to the Montreal Metropolitan Area, 2006-2031

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**ABSTRACT:** A common difficulty faced when projecting small area populations has to do with the implementation of local factors which highly influence local population growth. This problem is particularly important when simulating events that have a strong geographic component, such as internal migration, and destination choice of external migrants. This paper is part of a larger research program that aims at developing a dynamic time-based microsimulation projection model of the population of the Montreal metropolitan area and its 79 municipalities, by age, sex, and language. It presents an innovative treatment of migration by taking into consideration previous changes in local conditions when determining mobility and destination choices. Municipalities are first divided into two categories, suburban and the central city, to compute location-specific probabilities of moving by age, language and place of birth. Then, the destination choice of movers is based on a utility function that accounts for five important determinants of residential choice: (1) the distance from the central city, (2) the current size of the population of each municipality, (3) the municipality development potential, (4) the linguistic composition of its population, and (5) the geographical location. A similar function is estimated to allocate a place of residence to external migrants. Parameters are estimated using conditional logistic regressions and are implemented into the microsimulation model. The model is validated over the 2006-2011 period and results of the reference scenario presented for 2031.

**KEYWORDS**: Small Area Population Projections, Microsimulation, Urban and Regional Planning, Montreal Canada

JEL classification: R58, C63

## 1. INTRODUCTION

Most demographic projections are realized at the national or regional levels and are mainly used for planning of public policies at this broader level. Using cohort-component or multi-state approaches these models are not adequate for planning of local services and needs, such as places in childcare or services for the elderly because they are unable to account for all the spatial interactions (Harding, Vidyattama *et al.* 2011). Yet, local and municipal governments also need tools for planning, in particular to ensure public services under their responsibility (aqueducts, parks, waste collection, etc.) and urban planning (Isserman 1984, Foss 2002, Swanson and Pol 2008). Small area population projections have unquestionable value: they can be used for planning purposes, but also in a prospective approach such as measuring the impact of a change in public policy, such as zoning, on the spatial distribution of the population (Ballas, Clarke *et al.* 2005a, Wilson 2011).

In addition, population projections at the local and municipal level have to account for the dynamic of residential segregation (Yin 2009). While in many North American cities residential segregation is related to ethnic or racial groups, Montreal differs from other North American cities by the presence of two main linguistic groups: the francophone majority, descendants of the first colonists who came from France and founders of the city, and a wealthier English-speaking minority which gradually developed after the British conquest of New France (Brunet 1955, Vaillancourt 1985, Séguin 1987). Montreal is also the port of entry of a large majority of immigrants landing in the province of Québec and recent high levels of increasingly diverse immigration has favored the emergence of another, more heterogeneous, linguistic group: the allophones, a term which in Canada defines those who speak another language than French or English at home. While racial or ethnical spatial segregation doesn't appear to be important in the Montreal area, a spatial pattern is clearly apparent in the residential choice of linguistic groups (Marois and Bélanger 2014, Forthcoming).

The aim of this paper is to present the small area population projection model that we developed to project the population of municipalities of the Montreal Metropolitan Community (MMC). The model is innovative in its treatment of migration, the most technically and conceptually difficult component of change to model in small area population projections. To meet these challenges, we build a dynamic time-based microsimulation projection model in which the choice of municipality of residence is determined by a utility function that considers municipality-specific contextual factors. The time horizon of the projection is from 2006 to 2031. This model

has an additional objective: assess the evolution of linguistic groups at a local level.

## 2. SPECIFIC CHALLENGES OF SMALL AREA POPULATION PROJECTIONS

Small area population projection models are subject to specific methodological challenges that are less important for national population projections. Given the small size of the population, it is more difficult to accurately estimate the component of changes for small areas (Keyfitz 1972, Ballas, Rossiter *et al.* 2005b, Lutz 2009, Cameron and Poot 2011). This problem is particularly important for events that have a strong geographic dimension, such as internal migration and destination choice of external migrants (Ballas, Rossiter *et al.* 2005b). Furthermore, because for several origin-destination flows, the number of migrants is small to non-existent, a robust origindestination matrix to determine the migration pattern can hardly be built.

Given the importance of migration on population growth and change at the local level and given the instability of migration patterns over time, the accuracy of the projection can be greatly affected by mobility assumptions (Sanderson, Dal et al. 2010, Cameron and Poot 2011). At this level, individual decisions regarding choice of a place of residence depends on the changes over time in each potential location relative to all other alternatives. Thus, another difficulty faced when projecting small area populations is related to the implementation of contextual factors which may highly influence individual decision-making and local population growth. A rigorous small area population projections model must also take into account those contextual variables that can be determining factors in the migrants' decision-making, such as the distance from a central point, the socio-demographic composition or physical characteristics of the territory (Murdock, Hamm et al. 1991; Chi, Zhou et al. 2011). Similarly, urban planning can sometimes affect the projection since it has a major role in housing supply (Murdock, Hamm et al. 1991, Dittgen 2008, Bergouignan 2010). Geographical and contextual variables should thus be implemented as parameters to avoid the self-fulfilling effect of projections (e.g., when the urban plan is modified to integrate previous projection results). However, most small area projection models ignore contextual and environmental factors. Accordingly, traditional demographic methods such as the Hamilton-Perry method, the top-down method or the iterative proportional fitting method are generally used (Hamilton and Perry 1962, Birkin and Clarke 1989, Rees 1994, Rees, Norman et al. 2004, Simpson and Tranmer 2005, Ballas, Clarke et al. 2005a, Institut de la statistique du Québec 2010, Menthonnex 2010, Swanson, Schlottmann et al. 2010).

#### 3. MODELING INTERNAL MIGRATION AND RESIDENTIAL LOCATION

The method proposed in this paper to model internal migration and residential-choice combines elements from the life cycle approach and the random utility model. Most studies seeking to explain individual decisions regarding residential mobility are based on the life cycle approach (Glick 1947, Rossi 1955, Landale and Guest 1985, South and Crowder 1997, Kim, Horner *et al.* 2005, Æro 2006, Marois and Bélanger 2014). This approach suggests that events that mark the life cycle, such as union formations and dissolutions, births of children, or the departures of children from parental house, are determinants of residential mobility, because the residential needs of the family are changing after the occurrences of these events. Since they are generally correlated with age, this variable is therefore a key determinant of residential mobility.

The literature distinguishes two main urban forms in North American metropolitan areas: the inner city, which for conceptual and methodological reasons is often defined as the central municipality, and the suburb. The inner city can be seen as a place of transition, especially for young people who study or are in search for a first job and a partner (Kasarda, Appold *et al.* 1997, Glaeser, Kolko *et al.* 2001, Fréchette, Desmarais *et al.* 2004, Turcotte and Vézina 2010, Marois and Bélanger 2013). According to the life cycle perspective, when they will be professionally stable and will be ready to have children, their preferences will be for larger housing and a quieter environment rather than for employment accessibility. They will therefore leave for the suburbs, if they can. (Frey and Kobrin 1982, Feijten and Mulder 2002, Karsten 2007, Marois and Bélanger 2014).

Because of the large number of municipalities in the Montreal metropolitan area, it is not possible to estimate an origin-destination matrix, especially when the population is disaggregated by age and language groups. But, if the determinants of the decision to move from the central city to the suburb differ from those of a reciprocal move from suburbs' residents, we can assume that they are similar for residents of all suburban municipalities. Thus, we propose, as a first step in the modeling of internal migration, to stratify migrants according to the type of move rather than by municipality of origin. In the Montreal metropolitan area, the inner city consists of only one municipality (the municipality of Montreal, which is the central city). Residential moves within the central municipality are therefore not considered as a migration event. We can therefore define three types of internal mobility:

1. From a suburb to the central municipality;

- 2. From the central municipality to a suburb;
- 3. From a suburb to another suburb.

In a second step, a new municipality of residence has to be assigned to those internal migrants. In addition, a large number of external migrants also arrive each year in the metropolitan area, some from abroad (international immigrants), some from elsewhere in Canada (interprovincial migrants) and others from other regions of Quebec (intraprovincial migrants) and a municipality has to be assigned to these newcomers too. To account for the various profiles and preferences of these migrants in their location-decision, we regroup them into three additional groups of migrants:

- 4. International immigrants;
- 5. Interprovincial migrants;
- 6. Intraprovincial migrants.

For those who move from a suburb to the central municipality, the model does not need to be more complex, since there is only one possible destination by definition. For the other five groups of migrants, the model must assign a municipality of residence and this is done using the following random utility approach.

Assuming that migrants want to maximize the utility of attributes of the municipality they choose as destination, this approach can be defined as follow. Let  $U'_j$  be a utility function for each possible alternative j for individual of type t, where t is the type of migrants (from the central municipality, from another suburb, from another country, from another province and from the rest of Quebec) and j the number of municipalities which has a set of  $z_n$  characteristics. Thus, we have:

$$U_{j}^{t} = e^{\beta_{1}z_{1j} + \beta_{2}z_{2j} + \dots + \beta_{n}z_{nj}}$$

where

 $U_{j}^{t}$  = Utility of a municipality j for a migrant type t, j=1...J; t=1...n

 $z_{kj}$  = Value of the independent variable k for the municipality j, j=1...J; k=1...n

MAROIS, BÉLANGER Microsimulation Model Projecting Small Area Populations Using Contextual Variables: An Application to the Montreal Metropolitan Area, 2006-2031.  $\beta_k$  = Parameter of the independent variable k, k=1...n

Parameters  $\beta_k$  are estimated by a maximum likelihood method and are constant for each alternative. They estimate the net impact of municipalities' characteristics. We seek to estimate the probability that an individual i of type t chooses the municipality j with  $U'_j$  utility function. Thus, we have:

$$P_j^t = \frac{U_j^t}{\sum_{h=1}^J U_h^t}$$

In this way, contextual variables can be included as explanatory variables of migrants' decision for a municipality of destination. In the context of Montreal, previous analysis has shown the importance of the municipality's accessibility and housing offer, as well as of the linguistic composition of the municipality (Marois and Bélanger 2014, Forthcoming). Additional variables such as the average value of housing and the socio-economic composition of the municipality also became apparent from the analysis, but since reliable long-term assumptions for them are not available, they are not included in the population projection. Therefore, five municipalityspecific variables are included in the model:

- 1. Distance from the downtown area;
- 2. Population size;
- 3. Number of new housings;
- 4. Linguistic composition;
- 5. Geographical position.

#### 4. MODEL DEFINITION, ASSUMPTIONS AND DATA SOURCES

The proposed method for residential location modeling focuses on individual preferences which vary according to personal characteristics. The projection model must therefore use a micro approach and microsimulation is the preferred method. Microsimulation simulates processes and life events (e.g., mortality, fertility, residential mobility, etc.) of individuals following behavioral assumptions which parameters are derived from empirical data (Orcutt 1957). The probability that each type of events occurs is calculated for each individual and the occurrence of a particular event is determined using a Monte Carlo process. Following the event, characteristics of the

simulated individual may change (life status is changed to dead, number of births is incremented, place of residence changes, etc.). Statistical indicators, such as population size, age structure, socio-demographic composition, etc. can then be computed from the aggregation of individual data. Post and Van Imhoff (1998) argue that microsimulation is particularly appropriate when "the problem requires a large state space" (p.107). The possibility of including a large number of individual attributes is another major advantage of microsimulation compared to a component-cohort method. This method is then appropriate for local projections because of the large number of municipalities and individual characteristics that are simultaneously projected.

Montreal is the second most populous metropolitan area of Canada after Toronto. The *Montreal Metropolitan Community* (MMC)<sup>1</sup> regroups 82 municipalities into a supra-municipal entity<sup>2</sup>. The population of the MMC is estimated to 3.7 million residents in 2010. The MMC is active in land use planning and economic development, public transit and metropolitan arterial road network developments, waste management planning and social housing. With more than 1.6 million people, the municipalities). Map 1 spatially illustrates the municipalities under study and shows their grouping into regional county municipality (RCM)<sup>3</sup>, a spatial aggregation used for some variables in the analysis.



Figure 1 The central municipality of the MMC and municipalities included in the suburb

Our dynamic time-based microsimulation model is called LDS (*Local Demographic Simulations*) and is built using SAS Software. The starting population is extracted from the 2006 Census and the projection's horizon is 2031. The 20% microdata file of the 2006 Canadian Census<sup>4</sup> provides a large database (682 000 respondents in the MMC territory) with all the individual characteristics necessary for our model. It makes up our starting population. Its large sample size is useful to ensure robust estimates of relatively rare events and to reduce the Monte Carlo error inherent to microsimulation. The following characteristics are extracted from the database:

- 1. Age (0 to 119);
- 2. Sex (male or female);
- 3. Municipality of residence (79 municipalities of the Montreal Metropolitan Community);
- 4. Place of birth (in Canada, foreign-born);
- 5. Year of arrival in Canada (specific to foreign-born);
- 6. Language spoken at home (English, French or other).

From these variables, we derive four other variables that will be used in different modules:

- 7. Age at immigration (specific to foreign-born);
- 8. Number of years since arrival (specific to foreign-born);
- 9. Regional county municipality of residence;
- 10. Type of municipality (central municipality or suburb).

To account for the net census undercount (2.07% in Quebec), we reweighted the population using the 2006 population estimate by age groups and municipalities (Institut de la statistique du Québec 2013). Each individual weight is corrected using an age group-municipality-specific factor.

Modeled events are represented schematically in Table 1, with the independent variables where appropriate:

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#### Table 1Summary of events

Events	Population at risk	Outcome				Inde	pendent var	iables			
			Age	Sex	Place of birth	Number of years since arrival	Age at immigra- tion	RCM	Munici- pality	Type of municipality	Language spoken at home
Death	Everyone	If the event occurs, the individual is removed from the simulation. Otherwise, time variables (age, duration of residence for immigrants) are incremented by one	x	x	x	x					
Fertility	Women aged between 15 and 49 years old	A new individual is added to the simulation. Child characteristics are determined in the birth module	x					x	x	x	x
International emigration	Everyone, except births of the year	The individual is removed from the simulation	x		x						
Interprovincial out- migration	Everyone, except births of the year	The individual is removed from the simulation	x		x	x		x			x
Intraprovincial out- migration	Everyone, except births of the year	The individual is removed from the simulation	x		x			x			x
Migration from the central municipality to the suburb	People living in the centra municipality, except births of the year	l The individual is identified as a migrant from the s central municipality to the suburb. The municipality of residence is determined in the residential location module	x								x
Migration from the suburb to the central municipality	People living in the v suburb, except births of the year	The municipality of residence becomes the central municipality (Montreal)	x		x			x			
Migration within the suburb	People living in the suburb, except births of the year	The individual is identified as a migrant within the suburb. The municipality of residence is determined in the residential location module	x		x			x			x
Language shift toward French	Allophones	The language spoken at home is changed to French	x		x	x	x				
Language shift toward English	Allophones	The language spoken at home is changed to English	x		x	x	x				



Characteristics at the beginning of the period are used to estimate the likelihood of each event. For example, a 20 year old woman living in a given municipality at the beginning of the year who migrates to another municipality during the year has the probability of giving birth of women aged 20 living in the initial municipality for all the period. Only in the following year, when she will be 21 at the beginning of the year, will her probability of giving birth change.

# 4.1. Death event

Mortality has less impact on projected local population counts than other demographic components and varies less between regions (Termote, Payeur *et al.* 2011). Therefore, we assume that probabilities of dying do not vary by municipality of residence. Provincial age and sex prospective probabilities of dying from the reference scenario of the population projections published by the provincial statistical agency (Institut de la statistique du Québec 2009) are used as input. Life expectancy at birth increases from 78.3 years in 2006 to 82.9 years in 2031 and from 83.0 years to 86.6 years for males and females, respectively. To take into account the healthy immigrant effect (Chen, Ng *et al.* 1996, Bourbeau 2002, McDonald and Kennedy 2004), we adjust the probabilities of dying using relative risks of mortality for Canadian-born, established immigrants (admitted 10 years earlier or more) and recent immigrants (admitted in last 10 years) estimated in a previous study (Bélanger and Malenfant 2005). These relative risks are 0.354 for recent immigrants, 0.96 for established immigrants and 1.029 for Canadian-born.

# 4.2. Fertility and birth modules

The fertility module is applied to women aged 15 to 49. Fertility rates are estimated in two steps. First, we estimated fertility rates by age, language spoken at home and type of municipality (central municipality or suburb) using the own children method applied to 2006 Census data. As expected, our results show that fertility is lower among women living in the central city than those living in the suburbs for francophones (1.33 vs 1.66) and anglophones (1.47 vs 1.75), but not for allophones (2.35 vs 1.87). One reason that can explain this last finding is that fertility tends to be higher among recent immigrants (Bélanger and Gilbert 2002) who are more likely to be allophones. Since most immigrants first settle in the central municipality, it can inflate the

estimate. As the duration of residence in Canada increases, immigrants' fertility converges towards the level of the native-born population and at the same time immigrants tend also to move to other areas of the metropolitan area. Using these rates as input, we performed a first simulation from 2006 to 2011 and we compared the projected number of births by municipality with the observed numbers. We then calibrated municipality's fertility rates so that the total number of simulated births for each municipality matches the recorded data while the relative differences between population groups were maintained<sup>5</sup>.

When a birth occurs, a new individual is added to the simulation and the birth module assigns characteristics to newborns. Age is set to 0, the sex ratio at birth is used to randomly allocate the sex of the newborn, the place of residence is set equal to the residence of the mother at the end of the projected year and a probability of surviving to the end of the year is applied to the newborn. The language group of the child can be different from the language of the mother due to the possibility of intergenerational language shifts and is randomly allocated following rules described in the next section.

#### 4.3. Linguistic mobility events

They are two types of language shifts. Language shifts over the life course concern change in the language used at home by the individual over his own life and intergenerational language shifts concerns the non-transmission of the mother's mother tongue to the child at birth. Although Canada is rich of linguistic questions in censuses and surveys, there is no data set that can provide direct estimates of linguistic mobility. It is therefore necessary to use alternative methods to estimate language shifts over the lifetime. From analysis comparing cohort data from two censuses, we know that linguistic mobility is very low for both anglophones and francophones (Termote, Payeur et al. 2011). In Quebec, language changes over the life course mainly concern allophones and even among them such transitions are rare past a given age. We adapted the census based cross-sectional method developed by Sabourin and Bélanger (2011) to estimate these transitions. First, those who answered speaking more than one language at home are randomly recoded into the three main categories: francophones, anglophones and allophones. Allophones are then stratified into four groups to take into account specific experiences that may affect their linguistic behavior: Canadian-born allophones, foreign-born allophones arrived at age 15 or younger, foreign-born allophones arrived between age 16 and 35 and foreign-born allophones arrived after the age of 35. Using the number of respondents declaring a non-official language as mother tongue as denominators and the number of those speaking English or French at home as numerators, we computed age-specific (in the case of Canadian-born) or durationspecific (in the case of immigrants) lifetime linguistic shift rates for each group of allophones.

Language shifts over the lifetime were rare among foreign-born allophones who arrived at an age older than 16 and, for simplicity, language shifts over the lifetime are assumed to be null for allophone immigrants who landed in Canada at age16 and over. For the other two groups, the following equations, where y is the shift rate and x is the age or the duration (in years) since immigration, provided the best fit to the observed data:

- Canadian-born allophones to French:  $y = -0.0003x^2 + 0.0135x + 0.1334$ , x = 0 to 14;
- Foreign-born allophones arrived at age 15 or less to French:  $y = -0.0002x^2 + 0.0129x + 0.2188$ , x = 0 to 29;
- Canadian-born allophones to English: y = 0.0155x + 0.084, x = 0 to 34;
- Foreign-born allophones arrived at age 15 or less to English: y = 0.0055x + 0.0438, x = 0 to 29;

These equations yield estimates of the probability of language shift toward French and English by age (duration). We have limited the length to 35 years for the Canadian-born allophones transition to English, not only because the event is rare after that age, but also because of a cohort effect due to the linguistic policy<sup>6</sup>.

In addition to lifetime language shifts, there is another kind of language shift called intergenerational language shift. Previous estimates show that a certain proportion of allophones already have another language spoken at home at age 0. Since we don't have more specific data on this event, we assume that this represents intergenerational shifts. From the regressions' intercepts, intergenerational language shift are estimated to 13.3% and 8.4% for French and English respectively. These rates are used to allocate a language characteristic to children from allophone mothers in the birth module.

#### 4.4. International emigration event

In Canada, international migration is estimated from linked tax files. Although there exist scarce data on this component of population change, we know that it is a rare event and that it concerns mostly recent immigrants. In fact, the number of returning Canadians compensates for the number of Canadian-born emigrants (Michalowski and Tran 2008, Termote, Payeur *et al.* 2011). Thus, assuming that the net emigration of Canadian-born is null, emigration depends only on the propensity of recent immigrants to leave the country. We thus apply to each cohort of

immigrants the emigration rate estimated by Termote, Payeur *et al.* (2011) (Table 2). Emigration rates are further calibrated using the observed number of international emigrants between 2006 and 2011.

Number of years since arrival	Emigration rate
1	4.40%
2	4.40%
3	2.95%
4	1.50%
5	1.50%
6	1.50%
7	1.50%
8	1.40%
9	1.30%
10	1.30%
11	1.30%
12	1.30%
13	0.65%

Table 2 Estimated emigration rates of immigrants by years since arrival

Source: Termote, Payeur *et al*. 2011. Annualized by authors

#### 4.5. Interprovincial and intraprovincial out-migration events

Probabilities for interprovincial and intraprovincial out-migration are calculated from parameters estimated by logistic regressions using the question on place of residence one year ago in the 2001 and 2006 censuses. The event is thus conditional to survive and to stay in Canada. Therefore, this module occurs after death and emigration modules in the model LDS. Results of the regressions are presented in table 3.

	Interprovincial out-migration (n=1,292,224)	Intraprovincial out-migration (n=1,292,224)
Intercept	-5.796*	-3.652***
Age groups (ref=30-34)		
0-4	-0.00	-0.173***
5-9	-0.268*	-0.632***
10-14	-0.718*	-0.955***
15-19	-0.696*	-0.707***
20-24	0.322*	0.263***
25-29	0.419*	0.305***
35-39	-0.338*	-0.387***
40-44	-0.619*	-0.688***
45-49	-0.812*	-0.789***
50-54	-0.956*	-0.651***
55-59	-0.993*	-0.534***
60-64	-0.874*	-0.638***
65-69	-1.285*	-0.896***
70-74	-1.461*	-1.357***
75+	-1.024*	-1.381***
Language spoken at home (ref = French)		
English	2.206*	-1.680***
Other(s)	1.421*	-1.856***
Place of birth (ref = born in Canada)		
Foreign-born		-0.883***
Number of years since arrival (ref = Born in Canada)		
0-4	1.074*	**
5-9	0.602*	**
10-14	0.189	**
15+	-0.291*	**
RCM of residence (ref = RCM66)		
RCM55 and RCM57	-0.581*	0.326***
RCM58	-0.420*	-0.067*
RCM59	-0.22	0.086
RCM60	-1.113*	0.163***
RCM64	-0.817*	-0.009
RCM65	-0.870*	-0.252***
RCM67 and RCM70	-0.393*	.0.060
RCM71	-0.205	** 0.388***
RCM72	-0.698*	-0.199**
RCM73 and RCM74	-0.546*	

# Table 3Parameters of interprovincial and intraprovincial outmigration,<br/>Montreal Metropolitan Community, 2001 and 2006 Census

\* p<0.05. \*\* p<0.01; \*\*\* p<0.0001.

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To validate the model, we compared the number of out-migrants observed by municipality in the 2001 and 2006 Census separately with the number resulting from the average of five probabilistic simulations using the estimated parameters. The projected numbers are usually close to the observed numbers for both interprovincial and intraprovincial out-migrants. Relative differences can be important for small municipalities with few observed out-migrants, but expected numbers are in the same range.

In a first step, we use these parameters in a simulation for the period 2006-2011. Probabilities were then calibrated to ensure that the number of out-migrants simulated for the MMC corresponds to the observed numbers. The calibration factor is 0.761 and 1.162 for interprovincial and intraprovincial out-migrants, respectively. Those factors are then maintained for the rest of the projection.

#### 4.6. Internal migration events

Probabilities to move from the central municipality to a suburban municipality, between suburbs or from a suburban municipality to the central municipality are estimated using logistic regressions on pooled data of the 2001 and 2006 censuses. Table 4 presents the estimated parameters from these models.

	From the central municipality to the suburb (n=586,151)	From the suburb to the central municipality (n=682,659)	Within the suburb (n=682,659)
Intercept	-3.024 **	* -3.741 *	-3.004 ***
Age groups (ref=30-34)			
0-4	-0.089	* -0.836 *	-0.199 ***
5-9	-0.501 **	* -1.092 *	-0.558 ***
10-14	-0.753 **	* -1.479 *	-0.935 ***
15-19	-1.065 **	* -0.518 *	-0.892 ***
20-24	-0.490 **	* 0.787 *	
25-29	0.05	8 0.711 *	.485 ***
35-39	-0.321 **	* -0.502 *	-0.443 ***
40-44	-0.743 **	* -0.804 *	-0.810 ***
45-49	-1.030 **	* -0.871 *	-1.095 ***
50-54	-1.253 **	·* -0.976 *	·** -1.184 ***
55-59	-1.281 **	* -1.263``*	-1.264 ***
60-64	-1.397 **	* -1.521 *	·** -1.412 ***
65-69	-1.517 **	* -1.512 *	·** -1.518 ***
70-74	-1.748 **	* -1.469 *	·** -1.529 ***
75+	-1.658 **	* -1.226 *	-1.308 ***
Language spoken at home (ref = French)			
English	-0.353 **	*	-0.361 ***
Other(s)	-0.631 **	*	-0.662 ***
Place of birth (ref = born in Canada)			
Foreign-born		0.170 *	-0.200 ***
RCM of residence (ref = RCM66)			
RCM55 and RCM57		-0.477 *	.386 ***
RCM58		-0.127	** 0.126 **
RCM59		-0.456 *	.** 0.091
RCM60		0.120	)* -0.278 ***
RCM64		-0.288 *	.0.083 *
RCM65		-0.133	** -0.208 ***
RCM67 and RCM70		-0.295 *	.224 ***
RCM71		-0.277 *	.** 0.232 ***
RCM72		-0.429 *	.** 0.593 ***
RCM73 and RCM74		-0.556 *	.** 0.430 ***

Table 4	Parameters of logistic regressions modeling internal outmigration between municipalities
	of the Montreal Metropolitan Community, 2001 and 2006

\* p<0.05. \*\* p<0.01; \*\*\* p<0.0001.

Estimated parameters are consistent with previous theoretical and empirical studies on intrametropolitain mobility (Glick 1947, Rossi 1955, Landale and Guest 1985, South and Crowder 1997, Kim, Horner *et al.* 2005, Æro 2006, Turcotte and Vézina 2010, Marois and Bélanger 2013, Marois and Bélanger 2014). They highlight the importance of age and ethnocultural variables as determinants of intrametropolitain mobility. The variable about the

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RCM of residence shows that, even when controlling for population composition, some differences still remain between regions, meaning that a specific geographical component exists. As we did for modeling interprovincial and intraprovincial out-migrations, we also validated our model for internal migration by comparing the number of migrants observed by municipality in the 2001 and 2006 Census separately with the average number resulting from five probabilistic simulations for the same years using those parameters. Simulated numbers are in most cases in the same range as the observed and when the relative differences are large, it is for small municipalities with few migrants.

In the microsimulation, internal migration occurs after the events "death", "interprovincial and intraprovincial out-migration" and "emigration". Eventual co-occurrence of events "migration to the central municipality" and "migration to another suburb" are dealt with randomly. The municipality of residence for those who move to or within the suburb is subsequently determined by the residential location module.

#### 4.7. External migrants modules

External migrants, meaning international immigrants, interprovincial in-migrants and intraprovincial in-migrants are not modeled as events because the population at risk is not simulated. For each of these types of in-migrants, a separate database of potential newcomers with their characteristics was created. Assumptions on the annual number for each of these types of in-migrants comes from the official population projection from the *Institut de la statistique du Québec*, themselves determined from observations for 2006 to 2011 and from recent trends for the following years (Institut de la statistique du Québec 2009). The assumption is that the number of new entries in the model is about 96,500 per year which is about 40,000 international immigrants, 10,500 interprovincial in-migrants and 46,000 intraprovincial in-migrants moving on the MMC territory. Characteristics of these in-migrants created from the population living in the MMC at the 2006 Census, but elsewhere five years before. Assuming that external migrants arrive in the middle of the period, they are subject to half the risks of experiencing the other events during the year of their arrival. Finally, the residential location module (described below) assigns their municipality of residence.

#### 4.8. Residential location modules

Residential location modules are used to assign a municipality of residence to internal migrants

settling in the suburb and to external migrants settling in the whole metropolitan area. Since migrants have different preferences according to their origin, five separate modules are required, one for each of the categories of individuals to relocate: (1) people moving from the central municipality (2) people moving from another suburb (3) international immigrants (4) interprovincial in-migrants and (5) intraprovincial in-migrants. These modules are a practical application of the random utility approach that we applied in a previous study of residential location in the Montreal metropolitan area (Marois and Bélanger 2014, Forthcoming), which includes contextual variables as determinants of the choice of the municipality of residence. For each of the municipality's characteristics, parameters are estimated using conditional logistic regressions. The municipality of destination is then probabilistically allocated as a function of these parameters.

We estimate the regression parameters using data from the question on the place of residence one year ago of the 2001 and 2006 censuses. Independent variables of the regression model are: the distance between the municipality and the downtown, the population size, the type of municipality (either village, town or city), the annual number of new housings<sup>7</sup>, the main linguistic group defined as a binary variable (either francophone or not) and the regional county municipality (RCM) of the municipality. This last variable is used to take into account certain individual choices, such as the preference of international immigrants to first locate on the Montreal island. Table 5 shows parameters resulting from our regressions.

	Intraprovincial in-migrants (n=14528)	Interprovincial in-migrants (n=4613)	International immigrants (n=14993)	Migrants from the central municipality (n=12565)	Migrants from another suburb (n=18080)
Distance to downtown (km)			-0.014 ***	-0.007 **	
Population size	1.894E-06 ***	2.301E-06 ***	2.444E-06 ***	8.848E-06 ***	7.864E-06 ***
Kind of municipality (ref = City)					
Village	-2.159 ***	-1.966 ***	-2.148 ***	-2.220 ***	-1.757 ***
Town	-1.233 ***	-0.997 ***	-0.971 ***	-1.155 ***	-0.831 ***
New housings		5.230E-05 **		2.900E-04 ***	2.097E-04 ***
Majority of Francophones	3.224 ***	0.937 ***	1.490 ***	0.544 ***	0.754 ***
* anglophone migrant	-3.034 ***	-1.412 ***	-1.914 ***	-2.550 ***	-3.518 ***
* allophone migrant	-2.258 ***	-0.713 ***	-0.815 ***	-1.433 ***	-2.740 ***
RCM of residence (ref = RCM65 and RCM66)					
RCM55 and RCM57	-0.773 ***	-1.438 ***	-2.455 ***	-0.007	1.527 ***
RCM58	-0.117 *	-0.102	-0.170 **	0.655 ***	1.525 ***
RCM59	-1.093 ***	-1.554 ***	-2.681 ***	0.007	1.199 ***
RCM60	-0.493***	-1.475 ***	-2.459 ***	1.115 ***	1.315 ***
RCM64	-0.386 ***	-0.927 ***	-2.363 ***	1.057 ***	1.994 ***
RCM67 and RCM70	-0.988 ***	-1.855 ***	-2.995 ***	0.530 ***	1.324***
RCM 71	-0.893 ***	-0.282 *	-1.587 ***	0.966 ***	1.274 ***
RCM72	-0.988 ***	-1.600 ***	-2.257 ***	0.473 ***	1.777 ***
RCM73 and RCM74	-0.474 ***	-0.967 ***	-2.113 ***	0.325 ***	1.867 ***

Table 5	Parameters of conditional logistic regressions modeling the municipality of destination
	for internal and external migrants, Montreal Metropolitan Community,
	2001 and 2006 Censuses

\* p<0.05. \*\* p<0.01; \*\*\* p<0.0001.

Results show the importance of accessibility, housing supply and linguistic composition of the municipality in the choice of the municipality of residence. For each in-migrants category, we compared the expected number of in-migrants using these parameters with the observed number in the 2001 and 2006 censuses. In most cases, expected numbers are in the same range than observed numbers, meaning that our regression models are good predictors of the migrants' municipality of destination. Accordingly, we use these parameters as projection assumption. However, for some municipalities, the difference between the expected and observed in-migrants can be important, probably because some unobserved variables can influence municipalities' attractiveness. In these particular cases, we added an adjustment factor to calibrate the model, which highlights the difficulty of conceiving a model that can be applied in all contexts.

The residential location modules take into account municipality's characteristic that can change over time, therefore LDS updates at the end of each projection year the population size and percentage of francophones which will then be used in the following annual step. Concerning the number of new housings, we use the observed annual number of new housings for the 2006-2011 period (occupied or not) as reported in the 2006 and 2011 censuses. For the years beyond 2011, the projected number of new housings is taken from the 2005 development plan of the MMC which provides estimates of housing development potential for each municipality until 2031.

# 5. USING THE 2006-2011 PERIOD TO VALIDATE AND CALIBRATE THE MODEL

Our projection starts with the 2006 population, but we have age-municipality specific population estimates for 2011. Therefore, we are using the period 2006-2011 to validate and calibrate the parameters of the model prior to the 2011-2031 projection.

#### 5.1. Completion of assumptions

Out-migration probabilities and municipality-specific fertility rates have to be adjusted from a set of simulations for the period 2006-2011. The population resulting from the first simulation, without any correction, is presented in column 3 of annex 1. The second simulation calibrated the out-migrations probabilities and results are shown in column 4. At the third simulation, we calibrated for the municipality-specific fertility rates. Results are presented in column 5.

#### 5.2. Validation of the model

The last simulation is based on our final and complete assumptions (column 5 of annex 1) and serves to validate our projection model by comparing the projected population with the 2011 population estimates (column 2). Table 6 presents the distribution of municipalities according to the absolute percent error.

<b>[10%,</b> ∞ <b>[</b>	4
[5%, 10%[	15
[2.5%, 5%[	21
[0, 2.5%[	39

Table 6 Distribution of municipalities according to the absolute percent error

The absolute percent error for the whole population is quite low for most municipalities, 39 of the 79 municipalities have an error below 2.5% and 21 have an error between 2.5% and 5%.

Overall, the mean absolute percent error is 3.4% and it varies from 0% to 20%. Four municipalities have an error above 10%, but the most populous of them has a population of about 10,000 inhabitants.

	Total population	Population by age groups (16) <sup>a</sup>
Overall <sup>b</sup>	3.4%	12.3%
Population size		
<b>[50,000, ∞[</b>	1.2%	5.6%
[15,000, 50,000[	2.3%	9.3%
[5,000, 15,000[	4.0%	12.5%
[0, 5,000[	5.7%	21.4%
Population growth rate 2006-2011		
<b>[10%,</b> ∞ <b>[</b>	4.3%	10.7%
[5%, 10%[	2.9%	10.7%
[0%, 5%[	3.0%	13.1%
]-∞, 0%[	4.1%	15.1%

Table 7	Mean absolute percent error between population estimates in 2011 and the simulation by
	population size and growth rate of the municipality

a: This is the arithmetic mean of the MAPE of 16 age groups; b: This is the arithmetic mean of the MAPE of the 79 municipalities.

As revealed in table 7, the absolute percent error decreases according to the population size, but there is no clear relation between error and population growth rate. The mean absolute percent error appears satisfying since Smith and Shahidullah (1995) found an absolute error range between 17% and 20% for projections over a 10 years period of Florida's census tracts using different extrapolation technics.

Table 7 also revealed that the absolute percent error is higher when the population is detailed by age groups. Overall, the mean absolute percent error by age groups is 12.3%. Again, it is lower for largest municipalities, but higher than average for the smallest municipalities. Those with a population below 5,000 have a mean absolute percent error of 21.4%, but it concerns very small population groups.

#### 5.3. Calibration of the population

The only database available detailing the population by age, sex, language, immigrant status and municipality of residence is the 2006 Census. The 2011 Census is not yet available to researchers and, moreover, methodological changes make the data less reliable<sup>8</sup> and not comparable with 2006 data for statistics related to language (Statistique Canada 2012) or other characteristics. We must therefore exclude this source for calibration. Population estimates from the *Institut de la* 

*statistique du Québec* used to correct the net undercount of the initial census population of 2006 may still serve here, this time taking the 2011 estimates. It provides a complete and reliable source of population estimates by age groups and municipalities which we use to reweight the 2011 resulting population. The average of this weighting variable is 1.02, meaning that the model underestimates the population of the MMC by about 2% before this correction.

#### 6. SIMULATION 2011-2031

Once the 2011 population resulting from the simulation is calibrated with the 2011 population estimates, we can run the 2011-2031 population projection. Results from this simulation are presented in the column 6 of annex 1. Map 2 presents population growth rates by municipality and Table 8 presents a synthesis of the results.



#### Figure 2 Projected population growth rates by municipality, MMC, 2006 to 2031

Distribution of municipalities by population growth between 2006-2031	
<b>[50%</b> , ∞ <b>[</b>	10
[25%, 50%[	23
[10% , 25%[	28
[0%, 10%[	13
]-∞, 0%[	5
Mean relative growth by initial municipality's population size	
<b>[50,000,</b> ∞ <b>[</b>	33.4%
[15,000, 50,000[	25.9%
[5,000, 15,000[	23.5%
[0, 5,000[	26.2%

Table 8 Synthesis of population projection results, MMC, 2006-2031

The projected growth between 2006 and 2031 for the whole MMC is 27.5%, which is consistent with the official population projection (Institut de la statistique du Québec 2010). The projected growth varies widely between municipalities from -38.1% to 82.9%. Municipalities that will have the fastest expected relative growth are located on the North Shore, mostly those which are at the limit of the MMC. These municipalities are new suburbs where the development potential is the largest according to urban plans. Our model predicts low growth for most municipalities on the island of Montreal (RCM66, see Map 1) and in oldest suburbs (RCM58, RCM72 and RCM73), where housing potential development are much lower because the land is already occupied. This shows the importance of this variable in small area population projections. Urban sprawl, however, could be limited by protecting agricultural land and increasing residential density in other parts of the MMC to absorb projected population growth, but this would necessitate major policy changes, which are clearly not in the assumptions of the authors of the urban plans.

As for the rest of the country, an important population aging is expected in the MMC. Our results show that the proportion of people aged 65 and over will grow from 13.2% in 2006 to 19.2% in 2031. Overall, this age group will increase from about 475,000 people to 893,000 people, or by 88.1%. However, population aging won't affect all municipalities in the same way. Map 3 displays the projected growth of the population aged 65 and over by municipality and clearly shows rapid population aging in several suburban municipalities. Actually, municipalities that currently or in the near future show fast population growth and are attractive to young families, will see faster population aging. In the future, parents of these families will age in place, while their children will more likely migrate to the central municipalities or elsewhere. As a result, the population aged 65 and over can quadruple in some of them between 2006 and 2031. At the opposite end, because this process of aging-in-place and migration of the youths is already much

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completed in the central municipality and in the oldest suburbs of the inner ring, the future growth of the elderly population will be relatively much smaller.



Figure 3 Projected growth of the population aged 65 and over by municipality, MMC, 2006 to 2031

The main advantage of microsimulation is that it can generate results along several dimensions, such as linguistic characteristics in this case. In the Montreal context, where the spatial distribution of population by language groups is the subject of constant debates (Termote, Payeur *et al.* 2011), it should be of interest to look at projected results by language.

Table 9 presents the distribution of municipalities according to the relative rate of change in the proportion of francophones from 2006 to 2031. Overall, for the whole MMC, the proportion of francophones declines from 69.7% in 2006 to 63.8% in 2031, a loss of 6 percentage points, which is consistent with a similar projection for the Montreal metropolitan area (Termote, Payeur *et al.* 2011). The range of the variation varies from -28.3 to 17.1 percentage points. Our results show that the proportion of francophones will decline in 65 of the 79 municipalities. This is mainly caused by the low fertility of Canadian-born population and high immigration of non-francophones. At the opposite, our projection predicts an increase of the proportion of

francophones in 14 municipalities.

Distribution of municipalities according to the relative rate (percentage points), 2006 to 2031	change in the proportion of francophones	
[0, ∞[	14	
[-5, 0[	12	
[-10, -5[	11	
[-15, -10[	33	
]-∞, -15[	9	

# Table 9Distribution of municipalities according to the relative rate change in the<br/>proportion of francophones (percentage points), 2006 to 2031

#### 7. CONCLUSION

Small area population projections are subject to particular challenges. One of them is to take into account local conditions that may affect future population growth, particularly through residential moblity. In this study, we present a dynamic time-based microsimulation model, called LDS, that includes, among others variables, the planned number of new houses and the distance from downtown as determinants of residential location for internal and external migrants to project the population of the Montreal Metropolitan Community's municipalities. Furthermore, it takes into account the particular context of Montreal as the only metropolis in North America that is the home of a large francophone community and is receiving a large influx of immigrants from diverse origins and languages. We thus add to our model differential behaviors according to linguistic groups for mobility, residential location and reproduction, so the model can also project population at a local level by language groups.

Many small area projection models exist, but the one developed in this paper innovates in its treatment of mobility. We used conditional logistic regressions to estimate parameters used as assumptions of the residential location module. The method allowed for the implementation of the effect of contextual variables such as planned new housings from urban development plans, socio-demographic composition and of geographical location as determinants of future residential location process. Moreover, concerning the socio-demographic composition of the population, we develop LDS with a specific interest to linguistic variable which is an important issue in the Montreal metropolitan area context, but its methodology could be transposed to other variables, such as family composition, race or ethnicity which are also parameters that determinate mobility.

Like all models, our model has some limits. The parameters used to model residential location performs generally well, but for some municipalities, the discrepancy can be important and parameters were subject to some calibration. Another limit concerns the geographic scale. For a large city like Montreal, projections at the neighbourhood level might be useful, but the Census question on place of residence one year ago does not allow the analysis of mobility at a finer geographical scale than the municipality.

This small area population projection model reveals some trends that could challenge public policies. One of them is the continuous urban sprawl implied mostly by the urban development plans used as assumptions. Municipalities with the fastest expected growth are located far from the core, where farm and forest lands still exist. The second challenge concerns the investment in local infrastructure to face the aging of the population. Municipalities where the elderly population is expected to grow the fastest are those that nowadays attract young families. In the next decades, their infrastructure might need to be adapted for this changing population. Another result from our projections which can be of concern to policy-makers is the relative decline of the French community, which will be generalized in most of the MMC. As the language most commonly spoken in the neighbourhood is an important determinant of linguistic integration of allophones (Carpentier 2004), the relative decline of French in most municipalities could therefore be an obstacle to the adoption of French by the fast-growing foreign-born population.

# ANNEX 1

	Population estimates		Results from 2006-2011 pre-simulations			
	2006	2011	No adjustment	Out-migration assumption	Fertility assumption	Results from 2011-2031 simulation
	(1)	(2)	(3)	adjusted (4)	adjusted (5)	(6)
Montréal	3 570 100	3 791 100	3 758 132	3 781 745	3 783 223	4 553 217
Baie-D'Urfé	3 900	3 930	3 878	3 620	3 850	4 151
Beaconsfield	19,255	20.330	19,557	20,269	20,332	24.016
Beauharnois	12.000	12.235	11,117	11.145	11.186	12.523
Beloeil	19,135	20,465	20,944	20,852	20,581	25,210
Blainville	47,025	53,165	52,059	51,757	51,568	63,538
Boisbriand	26,700	26,485	26,791	26,823	26,855	29,541
Bois-des-Filion	8,455	9,450	9,591	9,540	9,321	12,165
Boucherville	39,275	41,570	41,073	41,176	41,254	46,811
Brossard	71,765	80,235	79,763	80,580	79,432	95,579
Candiac	16,145	19,575	18,691	18,739	19,259	28,188
Carignan	7,545	8,020	7,989	7,637	8,009	9,414
Chambly	22,880	25,440	23,549	23,677	23,673	27,527
Charlemagne	5,670	5,775	5,621	5,697	5,965	6,480
Châteauguay	43,140	46,330	45,417	46,167	45,391	55,330
Contrecoeur	5,740	6,290	6,081	6,190	6,050	7,531
Côte-Saint-Luc	31,450	33,550	31,945	32,539	32,228	36,989
Delson	7,410	7,555	7,591	7,828	7,942	9,348
Deux-Montagnes	17,615	17,545	18,025	17,946	17,902	19,191
Dollard-Des Ormeaux	49,240	50,825	47,372	48,929	49,166	50,313
Dorval and L'Île-Dorval	18,185	19,250	19,197	19,253	18,999	23,112
Hampstead	6,995	7,500	7,382	7,179	7,531	8,585
Hudson	5,120	4,890	4,532	4,882	5,411	3,169
Kirkland	20,575	21,215	21,043	21,251	20,973	23,788
La Prairie	22,040	23,975	23,569	23,364	23,098	28,357
L'Assomption	16,940	19,755	19,531	20,132	19,993	29,545
Laval	372,415	404,110	403,016	400,079	401,717	521,664
Léry	2,420	2,325	2,622	2,456	2,793	3,265
Les Cèdres	5,810	5,960	5,959	6,009	5,546	6,765
L'Île-Perrot	10,105	10,595	10,774	10,460	10,708	13,003
Longueuil	231,585	236,755	236,858	235,889	235,395	249,684
Lorraine	9,685	9,420	9,437	9,461	9,439	9,780
Mascouche	34,305	40,960	41,288	40,776	41,969	59,383
McMasterville	5,290	5,520	5,459	5,784	5,429	6,656
Mercier	10,250	11,585	10,346	10,309	10,201	13,789
Mirabel	35,310	41,165	41,083	40,087	41,053	56,790
Montréal	1,638,870	1,723,940	1,704,182	1,734,634	1,733,374	2,070,328

#### Table Results from simulations and population estimates

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Montréal-Est	3,865	4,010	3,963	3,910	3,903	4,088
Montréal-Ouest	5,225	5,395	5,095	5,171	5,250	6,143
Mont-Royal	18,995	20,225	20,156	20,462	19,720	21,950
Mont-Saint-Hilaire	15,865	17,410	18,671	18,438	18,194	23,341
Notre-Dame-de-l'Île-Perrot	10,030	10,430	9,826	10,153	10,099	10,910
Oka	3,310	3,700	3,373	3,510	3,252	4,031
Otterburn Park	8,580	8,470	8,613	8,502	8,260	9,527
Pincourt	11,375	13,690	12,928	12,456	12,793	13,812
Pointe-Calumet	6,645	6,455	7,148	6,425	6,754	7,386
Pointe-Claire	30,275	31,875	30,383	30,974	29,832	34,251
Pointe-des-Cascades	1,045	1,195	1,204	1,200	1,240	1,745
Repentigny	77,035	81,275	82,040	80,413	80,882	88,566
Richelieu	5,240	5,335	5,477	5,359	5,617	6,336
Rosemère	14,290	14,070	14,244	13,741	13,989	13,993
Saint-Amable	8,510	10,620	9,799	9,531	9,968	14,756
Saint-Basile-le-Grand	15,825	16,550	17,025	16,027	16,511	19,267
Saint-Bruno-de-Montarville	24,515	25,965	25,842	25,518	24,908	27,933
Saint-Constant	24,250	24,990	25,173	24,929	25,065	27,644
Sainte-Anne-de-Bellevue	5,235	5,425	5,415	5,743	5,408	7,110
Sainte-Anne-des-Plaines	13,165	13,730	12,769	12,909	12,888	13,204
Sainte-Catherine	16,405	16,885	17,435	17,620	17,383	22,110
Sainte-Julie	29,380	29,095	28,180	28,296	28,318	27,663
Sainte-Marthe-sur-le-Lac	11,485	14,840	13,341	12,841	13,595	12,816
Sainte-Thérèse	25,490	26,140	27,346	27,774	27,067	34,930
Saint-Eustache	42,610	43,525	44,060	42,886	43,773	48,375
Saint-Isidore	2,520	2,640	2,765	2,662	2,821	3,332
Saint-Jean-Baptiste	3,060	3,090	3,017	3,127	3,047	3,286
Saint-Joseph-du-Lac	5,035	6,245	6,437	6,730	6,490	9,209
Saint-Lambert	21,660	22,015	23,242	23,040	22,953	22,794
Saint-Lazare	17,260	18,980	19,040	19,279	19,452	24,881
Saint-Mathias-sur-Richelieu	4,570	4,465	4,376	4,579	4,523	4,691
Saint-Mathieu	1,890	1,990	1,929	1,823	1,827	2,173
Saint-Mathieu-de-Beloeil	2,315	2,545	2,398	2,524	2,763	3,327
Saint-Philippe	5,180	5,630	6,015	6,073	5,921	8,717
Saint-Sulpice	3,355	3,290	3,441	3,414	3,244	3,818
Senneville	980	985	897	1,107	974	967
Terrasse-Vaudreuil	2,000	1,925	2,034	1,895	1,958	2,031
Terrebonne	96,175	106,310	106,699	104,761	106,534	171,084
Varennes	21,175	20,680	22,028	21,518	21,476	23,841
Vaudreuil-Dorion	26,195	32,555	32,178	32,107	32,080	47,454
Vaudreuil-sur-le-Lac and L'Île-Cadieux	1,425	1,490	1,551	1,630	1,426	1,768
Verchères and Calixa- Lavallée	5,835	5,995	6,161	6,332	6,313	8,022
Westmount	20,580	21,280	21,136	21,240	21,159	18,427
Courses Institut de la statistique	du Québec (2006	and 2011 namula	tion actimates). Aut	have calculation (a	inculations)	

Source: Institut de la statistique du Québec (2006 and 2011 population estimates); Authors calculation (simulations).

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<sup>&</sup>lt;sup>1</sup> We used MMC rather than the census metropolitan area (CMA) defined by Statistics Canada because urban planning is developed at the MMC level and some important variables used in this study come from this planning exercise. However, municipalities common to both cover 97% of the CMA population and 98% of the MMC.

<sup>&</sup>lt;sup>2</sup> Three municipalities were aggregated to an adjacent municipality because of their small population size: Calixa-Lavallée with Verchères; l'Île-Dorval with Dorval; l'Île-Cadieux with Vaudreuil-sur-le-Lac.

<sup>&</sup>lt;sup>3</sup> County-like political entities.

<sup>4</sup> Confidential microdata files from Statistics Canada surveys, including censuses, are made available in Statistics Canada's Research Data Centers.

<sup>5</sup> The correction factors vary from 0.528 to 1.888.

<sup>&</sup>lt;sup>6</sup> The Charter of the French Language has been adopted in 1977 and the province of Quebec can select its

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immigrants since 1978. Under the Charter, most immigrants' children have to go into a French public school and Quebec's immigrant selection criteria favor French speaking immigrants. These two factors have drastically changed the language shift patterns of immigrants over time.

- 7 We took the difference in the total number of housings (occupied or not) between the two censuses divide by 5.
- 8 The long form of the Canadian Census has been replaced the National Household Survey which was not mandatory. Non-response rates vary between population groups, in consequence, the non-response bias is likely to be much larger than for the traditional mandatory census and perhaps larger than the error of the projection model.