

## Using integrated census microdata for evidence-based policy making: the IPUMS-International global initiative<sup>1</sup>

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**Abstract.** Integrated census microdata constitute a new resource for social science research and policy making. The IPUMS-International project ([www.ipums.org/international](http://www.ipums.org/international)) is a global initiative in cooperation with national statistical authorities world-wide to anonymize, integrate and disseminate samples of census microdata. Extracts adapted to the specific research needs of each user are distributed as ASCII textfiles along with the corresponding metadata without charge via the Internet. Researchers analyze the data using their own software and hardware. This paper offers a brief over-view of the project and invites official statistical agencies in Africa to obtain additional information about participating in the IPUMS initiative by emailing the principal author of this paper. To illustrate one possible application for evidence-based policy making with respect to the Millennium Development Goals, microdata from the 2000 census of Mexico are used to measure progress toward the attainment of universal primary education and the elimination of gender inequities in access to primary education.

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## **1. Recovering and Democratizing Access to Census microdata: the IPUMS-International integration initiative.**

Census microdata are the individual responses to census questionnaires recorded in computerized form as numeric or alphabetic codes. The data include such mundane characteristics as age, sex, marital condition, relationship to head, migration, education, occupation, etc. Often the datasets include records for families, households and dwellings as well as for individuals. Over the past half century most of the major statistical agencies have prepared census microdata files for analysis by staff and, in many cases, by external researchers. Before the microcomputer revolution of recent years, the computational resources to analyze census microdata were the exclusive preserve of only the official statistical authorities, large universities or well endowed research institutes. Now, with the ever-expanding power of microcomputers, analysis of large census microdata files is readily performed by ordinary researchers and, increasingly, even by their students.

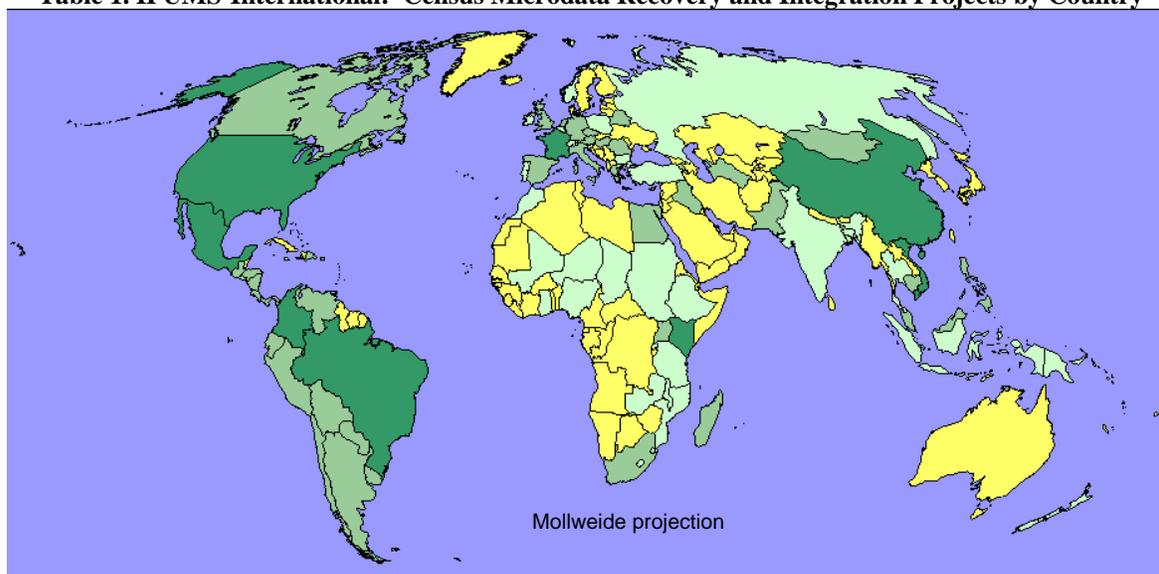
Today, census microdata are widely used by researchers and policy makers in the developed countries, but are relatively little used elsewhere, and not at all in India. This gap is about to shrink, thanks, on the one hand, to the IPUMS-International global initiative led by the University of Minnesota Population Center (<https://www.ipums.org/international>) and, on the other, to a policy revolution by statistical authorities around the world, which are increasingly recognizing census microdata as statistical products to be disseminated along with conventional publications. A good example of this revolution is the new dissemination policy of the Office of the Registrar General of India, which is preparing a microdata sample of the Indian census of 2001 for distribution to researchers by means of a compact disc.

In the case of India, microdata exist for the censuses of 1971, 1981 and 1991, but if the data are to be made useful, particularly for the earlier censuses, skilled recovery using the most advanced technologies will be required. The IPUMS-International project has financed the recovery of many censuses worldwide using almost exclusively the services of a data recovery firm in the United States and the United Nations Demographic Center for Latin America and the Caribbean (CELADE). The project arranges for the recovery work, pays the costs, and assists with the permanent archiving of recovered data and documentation.

Thanks to the cooperation of 50 national statistical authorities accounting for more than half the world's population, as of March 2006, IPUMS has become the largest repository of census microdata in the world with a total of 149 censuses entrusted to the Minnesota Population Center (Table 1). This success is due in part to the increasing recognition among official statisticians that anonymized census microdata constitute statistical data products. As such, they do not violate even the most stringent laws on statistical confidentiality, or privacy. In country-after-country, close study of the legislation on statistical privacy reveals that the dissemination of anonymized microdata, with names and detailed geographical identifiers suppressed, is not prohibited by law. In the rare instance where laws are interpreted to the contrary, this is often based on a misreading of the statutes and a misunderstanding of the statistical nature of anonymized census microdata. The General Data Dissemination System (GDSS) of the International Monetary Fund is widely recognized as the gold standard with respect to issues of privacy and statistical confidentiality. Our analysis completed in 2001 revealed that census microdata samples were disseminated by 37 of the 52 member states of the GDSS (McCaa and Ruggles 2002). This change in legal interpretation as well as the understanding of the

importance of making better use of the enormous amount of census data collected, coupled with both the recognition that qualified academic researchers have a need to access census microdata and the enormous advances in desktop computing power—all have led to a breakthrough in making these valuable resources available for scientific and policy research.

**Table 1. IPUMS-International: Census Microdata Recovery and Integration Projects by Country**



Color key: **darkest green** = disseminating; **medium green** = data entrusted to MPC; **lightest green** = negotiating  
**bold country** = Memorandum of Understanding signed with Regents of the University of Minnesota

Year = census conducted; **Bold year** = microdata survive; \* = 100% microdata entrusted, where extant; m = microcensus

datasets entrusted	Country	2000s	1990s	1980s	1970s	1960s
<b>Phase I, 1999-2004 (30 datasets)</b>						
<b>5</b>	<b>Brazil ('60 recovered)</b>	<b>2001</b>	<b>1991</b>	<b>1980</b>	<b>1970</b>	<b>1960</b>
<b>1</b>	<b>China (only '82 'til now)</b>	<b>2000</b>	<b>1990</b>	<b>1982</b>		1964
<b>4*</b>	<b>Colombia ('64/'73 recovered)</b>		<b>1993</b>	<b>1985</b>	<b>1973</b>	<b>1964</b>
<b>6</b>	<b>France</b>	<b>1999</b>	<b>1990</b>	<b>1982</b>	<b>1975</b>	<b>1968, 62</b>
<b>3</b>	<b>Kenya ('79 recovered)</b>	<b>1999</b>	<b>1989</b>	<b>1979</b>	<b>1969</b>	
<b>4</b>	<b>Mexico ('80 in recovery)</b>	<b>2000</b>	<b>1990</b>	1980	<b>1970</b>	<b>1960</b>
<b>5</b>	<b>United States</b>	<b>2000</b>	<b>1990</b>	<b>1980</b>	<b>1970</b>	<b>1960</b>
<b>2</b>	<b>Vietnam ('89! recovered)</b>		<b>1999</b>	<b>1989</b>	1979	
<b>Europe (25 datasets)</b>						
<b>4</b>	<b>Austria</b>	<b>2001</b>	<b>1991</b>	<b>1981</b>	<b>1971</b>	1961
<b>1</b>	<b>Belarus</b>		<b>1999</b>	1989	1979	1970
<b>0</b>	<b>Bulgaria</b>	<b>2001</b>	<b>1992</b>	<b>1985</b>	1975	1965
<b>0</b>	<b>Czech Republic ('70recovered)</b>	<b>2001</b>	<b>1991</b>	<b>1980</b>	<b>1970</b>	1961
<b>0</b>	<b>Germany (FR and DR)</b>	<b>2001m</b>	<b>1991m</b>	<b>1987, 81</b>	<b>1970, 71</b>	1961
<b>4</b>	<b>Greece ('71 recovered)</b>	<b>2001</b>	<b>1991</b>	<b>1981</b>	<b>1971</b>	1961
<b>4</b>	<b>Hungary ('70 recovered)</b>	<b>2001</b>	<b>1990</b>	<b>1980</b>	<b>1970</b>	
<b>0</b>	<b>Ireland</b>	<b>2001</b>	<b>1991</b>	1981	1971	1961
<b>2</b>	<b>Italy ('81 recovered)</b>	<b>2001</b>	<b>1991</b>	<b>1981</b>	1971	1961
<b>3</b>	<b>Netherlands ('60 recovered)</b>	<b>2001m</b>			<b>1971</b>	<b>1960</b>
<b>0</b>	<b>Norway</b>	<b>2001</b>	<b>1991</b>	<b>1981</b>	<b>1971</b>	1961
<b>0</b>	<b>Poland</b>	<b>2001</b>		<b>1988</b>	<b>1978, 70</b>	1960

0	Portugal	2001	1991	1981	1970	1960
3	Romania ('77 recovered)	2001	1992		1977	1965
0	Russia (-1989 USSR)	2002	1994m	1989	1979	1970
0	Slovenia	2001	1991	1981		
3	Spain	2001	1991	1981	1970	1960
0	Switzerland	2000	1990	1980	1970	1960
0	Turkey	2000	1990	1980, 85	1970, 75	1960, 65
1	United Kingdom	2001	1991	1981	1971	1961
<b>North America and the Caribbean (18 datasets)</b>						
3	Canada	2001	1991, 96	1981, 86	1971, 76	1961, 66
4*	Costa Rica	2000		1984	1973	1963
0	Dominican Republic	2003	1993	1981	1970	1960
2*	El Salvador		1992		1971	1961
0	Guatemala	2003	1994	1981	1973	1964
0	Honduras	2000		1988	1974	1961
0	Jamaica	2001	1991	1982	1970	1960
0	Nicaragua	2005	1995		1971	1963
5*	Panama	2000	1990	1980	1970	1960
4	Puerto Rico	2000	1990	1980	1970	1960
<b>South America (29 datasets)</b>						
1	Argentina	2001	1991	1980	1970	1960
3*	Bolivia	2001	1992		1976	
5*	Chile	2002	1992	1982	1970	1960
5*	Ecuador	2001	1990	1982	1974	1962
5*	Paraguay	2002	1992	1982	1972	1962
1*	Peru ('81 in recovery)		1993	1981	1972	1961
4*	Uruguay ('63 recovered)		1996	1985	1975	1963
5	Venezuela	2001	1990	1981	1971	1961
<b>Africa (18 datasets; many agencies are finalizing preparations to join following Addis Ababa meeting, Feb. 2006)</b>						
0	Angola			1984	1970	1960
0	Burkina Faso		1996	1985	1975	
0	Cameroon			1987	1976	
0	Chad		1993			
0	Comoros	2003	1991	1980		1966
2	Egypt		1996	1986, 81	1976	1964
2	Ethiopia		1994	1981		
0	Gambia, The	2003	1993	1983	1973	1963
1*	Ghana	2000		1984	1970	
0	Guinea, Conakry		1996	1983		1960
0	Lesotho		1996	1986	1976	1966
1*	Madagascar		1993			
3	Malawi		1997	1987	1977	1967
3	Mali		1998	1987	1976	
0	Mauritania	2000		1988	1977	1967
0	Mauritius	2000	1990	1983	1972?	1962
0	Morocco	2004	1994	1982	1971	1960
0	Mozambique	2007	1997	1980	1970	1960
2	Niger	2001		1988	1977	

0	Nigeria	<b>2006</b>	<b>1991</b>			
0	Rwanda	<b>2001</b>	<b>1991</b>			
0	Senegal	<b>2002</b>		<b>1988</b>	<b>1976</b>	
0	Seychelles	<b>2002</b>	<b>1994</b>	1987	1971 & 77	1960
0	Sierra Leone	<b>2004</b>		<b>1985</b>	1974	1963
<b>2</b>	<b>South Africa</b>	<b>2001</b>	<b>1996, 91</b>	1985, 80	1970	1960
<b>2*</b>	<b>Sudan ('73 recovery underway)</b>		<b>1993</b>	<b>1983</b>	<b>1973</b>	
0	Swaziland	<b>2007</b>	<b>1997</b>	<b>1986</b>	<b>1976</b>	1966
<b>2</b>	<b>Uganda ('80 is incomplete)</b>	<b>2002</b>	<b>1991</b>	1980		1969
0	Zambia	<b>2000</b>	<b>1990</b>	<b>1980</b>		1969
0	Zimbabwe	<b>2002</b>	<b>1992</b>	<b>1982</b>		1969

IPUMS-International initiatives are undertaken only in countries where authorization is provided by means a memorandum of understanding signed with the official statistical agency (OSA). No work is begun without prior signed authorization from the corresponding OSA. The IPUMS-International memorandum of understanding is entirely general in nature, yet it provides a legal framework for the project to proceed (Table 2). Its clauses spell out: 1) rights of ownership, 2) rights of use, 3) conditions of access, 4) restrictions of use, 5) protection of confidentiality, 6) security of data, 7) citation of publications, 8) the enforcement of violations, 9) sharing of integrated data, 10) arbitration procedures for resolving disagreements, and 11) order of precedence of documents (letter of understanding, contract, purchase order, invoice, etc.). There are no secret clauses or special considerations. All members of the consortium are treated equally. Nonetheless, the protocols are revised, indeed expanded, as modifications are suggested and approved. They do not, however, apply retroactively until ratified by the OSA.

Many statistical agencies cooperate in the project because little commitment of human resources is required and the project pays a standard fee to compensate for the marginal costs of preparing the microdata and documentation. Upon receipt of official invoice, the National Science Foundation of the United States authorizes the Minnesota Population Center (MPC) to pay US\$5,000 per census for microdata, documentation and non-exclusive rights to dissemination.

The IPUMS has two goals: first, to preserve census microdata and, second, to make anonymized, integrated sample extracts available to researchers and policy analysts free of charge. Data recovery is required for all but the most recent datasets. The recovery of data from old tapes is a challenging undertaking for even the most technically skilled cyber sleuths. The MPC does not recover data. Instead the project pays costs of data recovery, relying on the technical skills and widely recognized talents of CELADE or, where more convenient, a specialized data recovery firm. Most of the datasets for censuses from the 1960s or 1970s listed in table 1 were recovered in this way. For example, in the case of the 1979 census microdata of Kenya, in addition to the five percent national sample held by ACAP, approximately two-thirds of the person records (9,781,690) were recovered by a commercial firm at a cost of less than \$1,000. The project's most recent success was the 1977 census of Romania, where 97.2% of the person records were recovered by the same firm. Last month, a test tape from the 1973 census of Sudan was successfully recovered, notwithstanding the fact that the tape had lain untouched, exposed to the elements for more than two decades.

To make census microdata useful for research they must be thoroughly documented and integrated. Integrating census data is not a new idea. First proposed in 1872 at the International Statistics

Congress held in St. Petersburg, little progress was made until the last half of the twentieth century. One of the signal achievements of the United Nations Statistics Division has been in the international harmonization of census concepts from the enumeration form to the publication of final tables. While incomplete, the effort has enjoyed widespread support by statistical agencies around the globe. Beginning in 1991, the IPUMS-USA project has worked to harmonize census data for the United States for the period since 1850 (Ruggles and Sobek 1997), and IPUMS-International has capitalized on this experience (Esteve and Sobek 2003).

The IPUMS-International project adopts uniform coding schemes, nomenclatures and classifications, based where possible on the United Nations Statistics Division's *Principles and Recommendations for Population and Housing Censuses* (1998) and other international standards such as:

- UNESCO (1997) *The International Standard Classification of Education (ISCED 1997)*.
- International Labor Office (1990) *International Standard Classification of Occupations (ISCO-88)*.
- United Nations Statistics Division (1990) *International Standard Industrial Classification of All Economic Activities (ISIC-88)*.
- United Nations Economic Commission for Europe (1999). *Recommendations for the 2000 Censuses of Population and Housing in the ECE Region* (Statistical Standards and Studies No. 49)

International census samples employ differing numeric classification systems and reconciliation of these codes is a major effort. Variables must be easy to use for comparisons across time and space. This requires that we provide the lowest common denominator of detail that is fully comparable. On the other hand, we must retain all meaningful detail in each sample, even when it is unique to a single dataset (Ruggles et. Al. 2003).

For most variables, it is impossible to construct a single uniform classification without losing information. Some samples provide far more detail than others, so the lowest common denominator of all samples inevitably loses important information. Composite coding schemes offer a solution. Similar to those used by the International Labor Organization for occupations and industries, we apply composite coding to each variable to retain all original detail, and at the same time provide comparable codes across countries and censuses. The first one or two digits of each code provides information available across all samples. The next one or two digits provide additional information available in a broad subset of samples. Finally, trailing digits provide detail only rarely available. Where a concept is not present, a zero place-holder is assigned to that digit.

Consider marital status, for example. In the IPUMS-International system, the first digit of this variable with four categories is comparable across all samples: single, married, widowed, and separated/divorced. The second digit delineates consensual unions from other forms of marriage (where possible) and distinguishes among the categories separated, divorced, and married with spouse absent. The final digit provides additional detail with the married and married-spouse-absent categories, such as polygamous marriages in Kenya (Esteve and Sobek 2003).

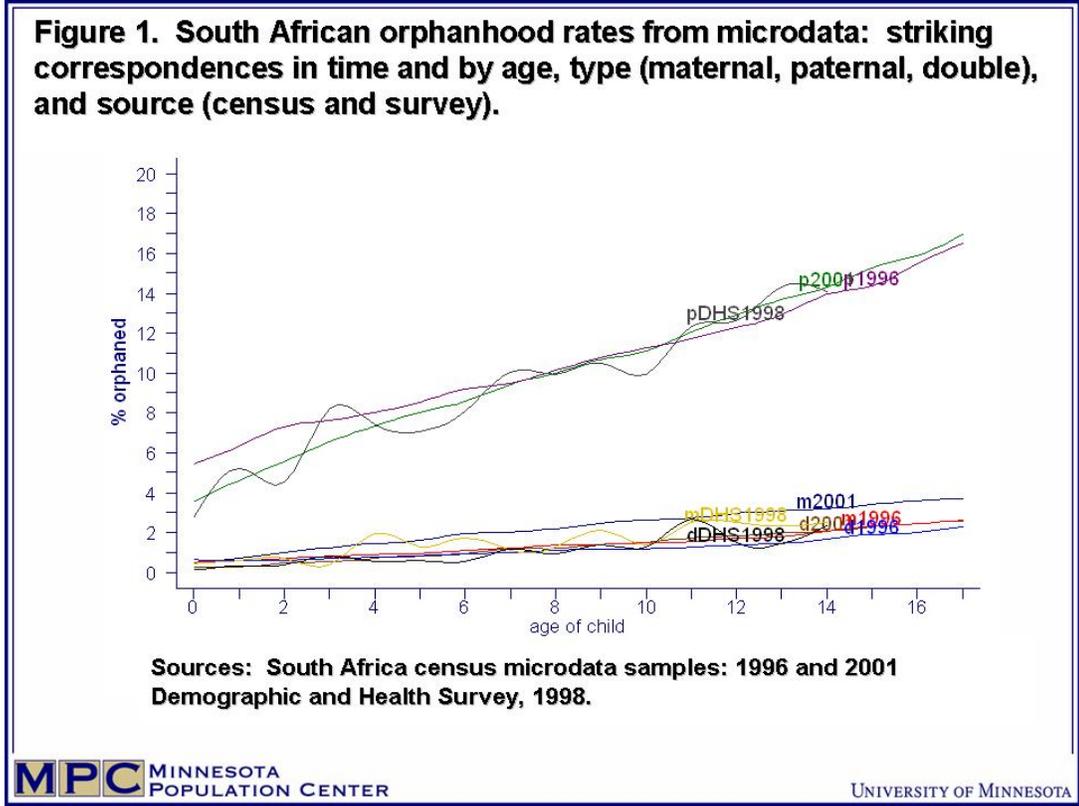
The basic goal of our harmonization efforts is to simplify use of the data while losing no meaningful information. The IPUMS harmonization strategy has proven flexible enough to accommodate the

integration of data across broad spans of time (the United States for 1850-2000) and space (Brazil, China, Colombia, France, Kenya, Mexico, the United States, and Vietnam; Sobek et. al. 2002).

## **2. Orphanhood in Africa: an example of using evidenced-based census microdata**

Before describing how to use the IPUMS, consider a practical case for disseminating microdata by examining the evidence on orphanhood. Orphans are generally defined in censuses and surveys, as individuals who, due to death, have lost one or more of their biological parents. This is operationalized in most questionnaires by requesting whether each biological parent is alive, dead, or unknown, with a distinct datum for mother and father. Answers to this question may be used not only to estimate the frequency of orphans by age, sex and a variety of other characteristics, as well as to estimate adult mortality. Unfortunately, most census publications offer only rudimentary tables in this regard, and many CD products often do not offer greater detail. With the availability of microdata ordered by households, it is possible to study the rate of orphanhood by age, sex and type (paternal, maternal or double) as well as the social and economic conditions of the households or institutions in which orphans live.

Do the census data on orphanhood make sense? It is striking that in the case of South Africa, orphanhood rates by type and age for the censuses of 1996 and 2001 compare favorably with rates from the Demographic and Health Survey of 1998 (Figure 1). The overlapping lines in Figure 1 leave little doubt that the sources are telling a similar story. Four features stand out. First, orphanhood rates at any age differ dramatically by type, with maternal orphans typically twice as frequent as double, and paternal orphans four to five times more frequent than maternal. Clearly a goodly proportion of so-called paternal orphans is due to “social” factors and not due to the death of the father. It is striking, however, that the highly-trained, well remunerated interviewers of the Demographic and Health Surveys are little better at enticing this distinction from interviewees than poorly paid, hastily trained census enumerators. The second finding which confirms the validity of the census microdata is that orphanhood rates increase monotonically by age. Third, the wavy lines characteristic of the survey reflect its small sample size, which is measured in tens of thousands compared with millions in the census. The wavy lines portray the greater effect of sampling variability in the survey as opposed to the census. Finally, there is the effect of time. It is no surprise that orphanhood rates in 1996 are lower than those for 1998, which are lower still than those for 2001. The fact that this appears in the microdata is further confirmation of their robustness. It is however notable that the rate of paternal orphanhood below age 7 according to the 1996 census is higher than for either 1998 or 2001. Further research in the microdata may reveal whether this is artificial or artifact (McCaa, Accrombessy and Diallo 2005). Meanwhile the data on orphanhood illustrate the strengths of census microdata and their coherence with such gold standards as the Demographic and Health Surveys.



**3. Using the IPUMS-International extract system to gain access to census microdata free of cost.**

The IPUMS extraction system permits the researcher to use a series of selection menus to tailor a specific dataset, from the entire database of many countries, census samples, and available variables. Since the entire database is too huge for all but the biggest computer installations, the researcher constructs an “extract”, selecting only the countries, census years, sub-populations and variables that are required.

First, though, the researcher must be approved to gain access to the data. Access to the IPUMS-International database is restricted to researchers and policy makers who are qualified to use the data, have a specific research need for accessing the data, and who agree to abide by the conditions of use. Access is restricted so that the highest quality data may be made available with a minimum of confidentiality protections imposed on the data.

Application is made electronically by clicking the “Apply for Access” button, and completing the application form. The user must agree to the following conditions: that the data will:

1. not be re-distributed to others,
2. only be used for scholarly purposes,
3. not be used for commercial purposes (commercial users must contact the national statistical authorities for permission),
4. not be used to identify individuals, households or other entities (iee., that confidentiality will be respected

5. be safely secured (such as password or encrypted);
6. and be appropriately cited if publication results from the use of the data

Finally, the user and the user's institution must agree to be bound by these restrictions and may be punished if a violation occurs either deliberately or through carelessness.

The application is submitted electronically and a decision on access is usually granted within a week or less. About one-third of applicants are denied access, usually because the description of the research project does not indicate that access to the microdata is needed. If approved, the researcher uses a password to gain access to the extraction system, by clicking the "Create an Extract" button. If the project involves a group, each individual researcher must apply for access and agree to the conditions of use. If a class is involved, each student must apply for access. Unlike the access system used by the Australian Bureau of Statistics and that of the SARs system in the United Kingdom, approval is not granted to institutions. Instead, the IPUMS-International method is to entrust each individual with the responsibility for the proper use of the data. At the same time each individual's institution may be held responsible if misuse occurs.

Once approved, a data extract is designed by clicking "create an extract" from the IPUMS-International home page, entering the user name and password, and completing the extract selections on a series of screen. As a guest, it is possible to explore the entire site, but no extract will be constructed, even if the user completes all the necessary screens. Only registered users may obtain data, and the necessary password must be entered to do so.

Currently four selection screens encompass the construction of an extract:

1. sample selection (including countries and census years);
2. variable selection;
3. case selection (subpopulations, such as females aged 15-19 years in the workforce who are also heads of households); and
4. request summary.

**Sample selection.** The first selection screen is used to specify record structure type (flat or hierarchical) and the format of the metadata required for the statistical package to be used to analyze the data (SPSS, SAS, or Stata or any package that will read ascii text files, such as CSPro, ReDATAM, etc.). Note that the researcher uses his or her own software to analyze the microdata. The project does not distribute software nor does it provide statistical tools for analysis. Researchers do not need to learn any specific statistical package to analyze the integrated microdata.

**Variable selection.** The second screen is used to select the variables that are the object of study. The screen lists only those variables that are available for the countries and census years chosen on the sample selection screen. Variables that are present in a specific census are signified by an "X". From this screen (or from the "Variable Availability" bar on the home page, the researcher may examine the metadata for a specific variable. By clicking the variable name a window appears describing the variable and discussing comparability issues between censuses and countries. Clicking "Codes" displays a screen with metadata for the integrated codes and the corresponding labels available in specific censuses. Source documentation, including the original census questionnaires and enumerator instructions are readily available in English and the official language

so that researchers may examine the exact wording and definitions. Users are urged to study the documentation carefully to make the best possible use of the data.

**Case selection (optional).** The IPUMS data extract system already contains over 100 million person records. Therefore a means of selecting specific cases or subpopulations is very handy to avoid transferring data that the user has no interest in analyzing. The case selection feature makes it possible to select only cases that satisfy very specific criteria, such as male heads of households aged 20-35 years, who are not in the workforce. The case selection screen makes it possible to select specific individuals or all individuals co-residing with an individual with selected characteristics. One of the most valuable enhancements of the database is the “SUBSAMPLE” feature. With SUBSAMPLE, the research may request any of 100 subsamples each of which is nationally representative and preserves any stratification of the larger sample from which it was drawn. This tool may be used to test procedures, economize resources, where the research does not require large samples, or estimate variances through the replicate method.

**Request summary.** The last screen permits the user to confirm that the selections are correct. If not, the researcher may return to any one of the previous screens to make any desired corrections or adjustments. Once the selection criteria are correct, the request is submitted. At this point the session is over and the researcher is free to engage in other activities.

**Download or Revise an extract.** Meanwhile, behind the scene, the extract engine queues in the request, and then proceeds to fulfill the order. Usually in a matter of minutes, an email is sent to researcher notifying that the request is complete and that the extract is available. A link is provided to a password-protected page for downloading the specific extract using SSL (Secure Sockets Layer) protocol. The data are encrypted during transmission using a 128-bit encryption standard, matching the level used today by the banking and other industries where security and confidentiality is essential. The researcher may then securely download the file, decompress it and proceed with the analysis using the supplied integrated metadata consisting of variable names and labels. The metadata are in ASCII format so that a researcher may readily adapt them for use by any statistical software.

The user may also revise a prior extract, retrieving the selections, making some adjustments and re-submitting the request. For example, a researcher might prepare a test dataset extracting, by means of the SUBSAMPLE case selection feature, a 1% sample from the database with selected specifications. Then once the researcher has tested and confirmed various trials, the extract specifications may be retrieved, the SUBSAMPLE case selection feature clicked off, the specifications re-submitted and be rewarded with a complete dataset with all other specifications intact.

#### **4. Who uses IPUMS-International microdata and what do they use the data for?**

The succinct answer is university professors, policy researchers and students use the data to investigate economic, demographic and social issues in comparative perspective.

In a very brief period, IPUMS-International has become an indispensable component of social science infrastructure. Hundreds of projects by scholars in more than thirty-four countries are already underway. The United States accounts for the largest number of applicants (72%), followed by Canada (4%). Switzerland, thanks to the presence of a large number of international

organizations, ranks third (3%). Every continent is represented. Over 5% of researchers are working in Europe. African users, at less than 3% of the total, are under-represented at present, but this is because only 2 samples are from the region (Kenya 1989 and 1999), constituting less than 3% of the total person records in the database. With the inclusion in 2006 of two integrated census samples for South Africa followed by two for Uganda in 2007, a sharp increase in usage by African experts is to be expected.

The application does not inquire as to country of origin, citizenship or identity. Nevertheless, it is apparent from names and project descriptions, that a considerable fraction of researchers at US and Canadian universities are nationals using the IPUMS-International database to study their country of origin, including not only Brazil, Mexico, China, Colombia, Kenya and Vietnam but also France.

<b>Table 3. 446 Research topics classified in 26 categories</b>			
<b>ordered by frequency</b>			
Migration	64	Marriage	12
Schooling	57	Aging	12
Gender	30	Equality/inequality	12
Data management/development	26	Mortality	12
Teaching	37	Development	10
Health	21	Statistics	9
Fertility	21	Sampling	9
Methods	17	Demography	7
Wages	17	Brain drain/gain	6
Urbanization	15	Religion	4
Family	15	Population projection	3
Children	13	Disability	3
Poverty	12	Vital statistics evaluation	2

**Research topics.** Applicants are required to submit a succinct description of the proposed research to justify access to the database. I have classified the first 446 successful applications, somewhat arbitrarily, into 26 categories (Table 3). They demonstrate the wide range of research uses for which census microdata may be used.

Research topics include the living arrangements of the aged, female labor-force participation and educational attainment, regional inequality differentials, patterns of age hypergamy, international migration, relationship between divorce and family composition, between disease factors and education, and between marriage and socio-economic conditions. Most of these studies incorporate both cross-national and cross-temporal comparisons. For example, a National Academy of Sciences panel on “Transitions to Adulthood in Developing Countries” is using the data from Colombia, Kenya, Mexico, and Vietnam to analyze changing outcomes such as schooling, work, fertility, and marriage as a function of age, gender, and household characteristics. A scattering of studies propose to analyze various needs at the level of minor administrative districts for various institutions or professions, such as schools, teachers, clinics, health professionals, etc. While one might expect that these studies would be better served by access to 100% microdata, the high-density harmonized

samples available from the IPUMS website make the results of such studies suggestive if not conclusive.

The following abridged and edited project description is a detailed example of a policy study which couples economic data from an official source with census microdata over four decades:

[This project proposes to] analyze the impact of public investment in [Country N] on a number of social and economic indicators over the last 40 years at the [major administrative district, MADs] level. There is evidence that despite high periods of overall growth in [Country N] very little economic convergence across [MADs] has occurred. This phenomenon has raised questions about the lack of ability (or willingness) of the central government to reduce disparities using national resources. This study tries to estimate the impact of different kinds of national investment and the role they have played over four decades of development in [Country N].

## **5. How census microdata may be used for local planning to attain Millennium Development Goals: schooling and literacy in Mexico.**

The United Nations has an ambitious campaign, *The Millennium Development Goals*, which lays out a total of 8 development objectives to attain by the year 2015 (see Table 4). The 191 member countries of the United Nations have endorsed objectives to eradicate extreme poverty and hunger, achieve universal primary education, promote gender equality and female autonomy, reduce infant mortality, improve maternal health, combat HIV/AIDS, malaria and other diseases, guarantee the sustainability of the environment, and foment a world association for development.

For each objective, the United Nations has developed a battery of indicators to evaluate the situation and to measure improvements in each region and country of the world. Nevertheless, region or nation is not always the most appropriate scale for this type of analysis, because, often, statistics for an entire country are not representative of the situation in small areas or localities, above all in those countries where great inequalities are observed at the local level. For this reason, analysis at the local level can identify the most disadvantaged areas to organize a better distribution of assistance and resources devoted to solving the problems.

Confronted with this challenge, local statistics are called upon to play a more important role in measuring results. Population censuses, and by extension the corresponding microdata, are also a most important source for this type of analysis because they guarantee a more or less homogeneous treatment and complete territorial coverage.

To illustrate the use of census microdata, we analyze a 10% sample from the Population Census of Mexico for year 2000 obtained from the IPUMS-International web-site. We address the second and third objectives of the Millennium Development Goals: to achieve universal primary education and promote gender equity. The analysis focuses on municipalities, of which there are 2,443 identified in the data for Mexico. For each municipality the index proposed by the United Nations is computed. The results are presented as a series of maps (Figure 2), although only the municipalities with the worst conditions are depicted. Finally we carry out a simple cluster analysis to identify which municipalities should receive priority attention.

**TABLE 4: Millennium Development Goals  
Generally Assessable through Population and Housing Census Questionnaires**

<p><b>Goal 1. Eradicate extreme poverty and hunger</b></p> <p><b>Target 1.</b> Halve, between 1990 and 2015, the proportion of people whose income is less than one dollar a day</p> <p><b>Target 2.</b> Halve, between 1990 and 2015, the proportion of people who suffer from hunger</p>	<p><b>Indicators: Goal 1</b></p> <ol style="list-style-type: none"> <li>1. Proportion of population below \$1 per day</li> <li>2. Poverty gap ratio (incidence x depth of poverty)</li> <li>3. Share of poorest quintile in national consumption</li> <li>4. Prevalence of underweight children (under five years of age)</li> <li>5. Proportion of population below minimum level of dietary energy consumption</li> </ol>
<p><b>Goal 2. Achieve universal primary education</b></p> <p><b>Target 3.</b> Ensure that, by 2015, children everywhere, boys and girls alike, will be able to complete a full course of primary schooling</p>	<p><b>Indicators: Goal 2</b></p> <ol style="list-style-type: none"> <li>6. Net enrolment ratio in primary education</li> <li>7. Proportion of pupils starting Grade 1 who reach Grade 5</li> <li>8. Literacy rate of 15-24 year-olds</li> </ol>
<p><b>Goal 3. Promote gender equality and empower women</b></p> <p><b>Target 4.</b> Eliminate gender disparity in primary and secondary education, preferably by 2005, and to all levels of education no later than 2015</p>	<p><b>Indicators: Goal 3</b></p> <ol style="list-style-type: none"> <li>9. Ratio of girls to boys in primary, secondary and tertiary education</li> <li>10. Ratio of literate females to males of 15-24 year-olds</li> <li>11. Share of women in wage employment in the non-agricultural sector</li> <li>12. Proportion of seats held by women in national parliament</li> </ol>
<p><b>Goal 4. Reduce child mortality</b></p> <p><b>Target 5.</b> Reduce by two thirds, between 1990 and 2015, the under-five mortality rate</p>	<p><b>Indicators: Goal 4</b></p> <ol style="list-style-type: none"> <li>13. Under-five mortality rate</li> <li>14. Infant mortality rate</li> <li>15. Proportion of 1-year old children immunised against measles</li> </ol>
<p><b>Goal 5. Improve maternal health</b></p> <p><b>Target 6.</b> Reduce by three-quarters, between 1990 and 2015, the maternal mortality ratio</p>	<p><b>Indicators: Goal 5</b></p> <ol style="list-style-type: none"> <li>16. Maternal mortality ratio</li> <li>17. Proportion of births attended by skilled health personnel</li> </ol>
<p><b>Goal 6. Combat HIV/AIDS, malaria and other diseases</b></p> <p><b>Target 7.</b> Have halted by 2015 and begun to reverse the spread of HIV/AIDS</p> <p><b>Target 8.</b> Have halted by 2015 and begun to reverse the incidence of malaria and other major diseases</p>	<p><b>Indicators: Goal 6</b></p> <ol style="list-style-type: none"> <li>18. HIV prevalence among 15-24 year-old pregnant women</li> <li>19. Contraceptive prevalence rate</li> <li>20. Number of children orphaned by HIV/AIDS</li> <li>21. Prevalence and death rates associated with malaria</li> <li>22. Proportion of population in malaria risk areas using effective malaria prevention and treatment measures</li> <li>23. Prevalence and death rates associated with tuberculosis</li> <li>24. Proportion of tuberculosis cases detected and cured under directly observed treatment short course</li> </ol>

Is primary education universal in Mexico? To respond to this question we much use three distinct indicators, following UN recommendations. First is the net rate of primary schooling. Calculation of this indicator requires three variables: age, school attendance, and level of education attained. All these variables are available in the microdata for the 2000 census of Mexico. The rate is the result of obtaining the percentage of persons attending primary school divided by the total children of primary school age. To compute this indicator, we have taken into account children aged 6-11 years old. We find that 85.8% of boys and girls of primary school age are declared as attending school. Nevertheless about 16% of the municipalities (n=394) show school enrollment rates of less than 80%. In these municipalities, at a minimum of one-in-five of primary school aged children, approximately 1,350,000, are not attending school.

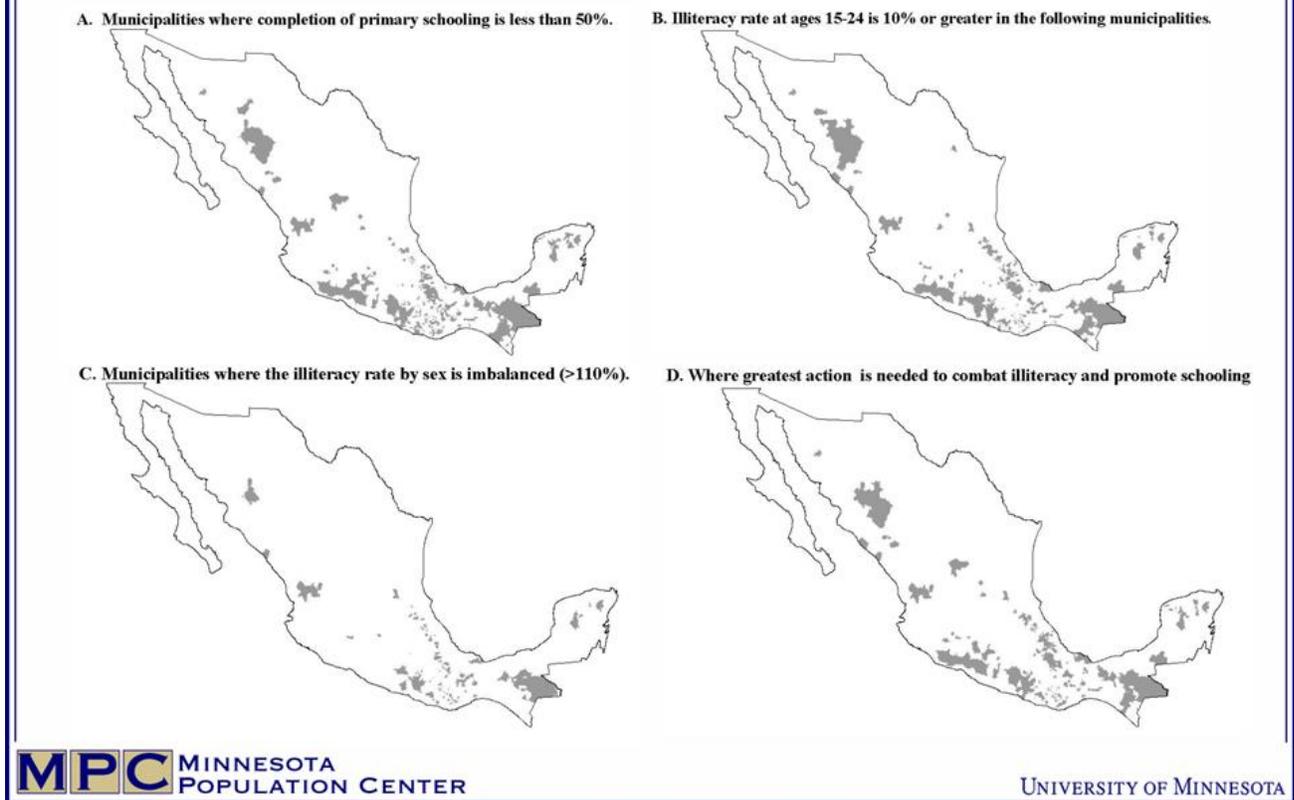
Six years of schooling are required to complete primary education in Mexico. To compute this indicator, the percentage of children completing primary school must be measured. Since longitudinal data, which would permit tracing the evolution of educational attainment of each cohort of students, are not available, we have opted to compute, as an approximation, the percentage of persons between age 12 and 14, which had completed their primary studies. Age and level of educational attainment are required to compute this indicator.

The national average indicates that 70.7% of Mexican children between the ages of 12 and 14 years have completed their primary schooling. This figure is significantly distant from the MDG objective of 100%. Nevertheless, at these ages, this figure should be read in terms of a shortfall and not a failure, since a significant fraction of children will complete their primary studies at older ages. For this reason, at the moment of establishing a threshold to discriminate between those municipalities that require more attention, we have reduced slightly the figure, to 50%. In this case, we are selecting only those municipalities where less than half of the population aged 12-14 years have completed their primary schooling (see Figure 2, panel A). Some 17% of the municipalities (420) do not attain the 50% threshold, account for some 7.3% of children for the nation as a whole. Note that for presentation purposes we map the municipalities, but they could also be listed by name for purposes of focussing resources.

Illiteracy can be computed for specific ages with little difficulty. The literacy rate for the Mexican population as a whole aged six years or more is 96.5%. Of the six indicators this one comes closest to the Millennium Goal target. For this reason a 90% threshold for the population aged 15-24 years is chosen. Some 15% of the municipalities (376) fall below the threshold and account for 6% of the population at these ages (see Figure 2, panel B).

Gender equity is considered here only partially, since we treat only those aspects related to educational attainment and literacy, taking as our point of departure the statistics calculated above. In terms of schooling attained, as a matter of fact there is little difference between the sexes, and only slightly greater differences in terms of illiteracy. The proportion of municipalities with at least 10% more literate males than females aged 15-24 is 7.8% (192), and as a fraction of the national population is only 2.5% (Figure 2, panel C). In recent decades Mexico has made substantial progress in providing gender equity in primary schooling and literacy.

**Figure 2. Using census microdata for local planning to meet millennium development goals with respect to schooling and literacy: Mexico, 2000.**



From the indicators presented above, cluster analysis can be used to identify the municipalities with the most unfavorable conditions and that require priority attention. To simplify the analysis we present a classification scheme based on only two categories—above and below the threshold—for each variable (Table 5). Taken as a whole the first cluster contains the municipalities that are at the greatest distance from achieving the second and third development objectives. The least problematic is gender inequalities in literacy and schooling, where the difference in scores between those above and below the thresholds is minimal. In contrast, the differences observed in the three indicators with the second development objective are markedly different and strongly significant. The gravest problem then is in the absence of educational opportunities rather than in inequalities of access by gender. The first cluster groups 15% of the municipalities of Mexico (369), characterized by unfavorable rankings in four of five indicators. This result reveals a certain correlation among the indicators that is also evident when the maps in Figure 2 are considered as a group.

**Table 5. Cluster analysis of Municipalities based on Z scores**

Indicator	Mean scores	
	below	above
1. Net rate of primary school attendance*	-1.33	.24
2. School children that complete 6 years of primary school*	-1.66	.30

3. Literacy rate, ages 15- 24 years*	-1.73	.31
4. Sex ratio of primary school children (1.0 = equality)	1.01	1.00
5. Literacy sex ratio, ages 15-24 years (1.0 = equality)	1.13	1.00
<hr/> Number of municipalities	<hr/> 369	<hr/> 2073

\*The values of these indicators have been converted to z scores for the cluster analysis; mean threshold = 0.0.

## 6. Conclusions.

Julia Lane (2003) highlights six types of benefits which accrue from broader access to microdata: address more complex questions, calculate marginal effects, replicate findings, assess data quality, build confidence in data quality and build new constituencies or stakeholders. Replication is extremely important because there is an overwhelming temptation for scientists to misrepresent results when the data are unlikely to be available to others. The IPUMS system facilitates replication by providing access to microdata to all approved academic users on an equal basis.

Census microdata are exceedingly useful for analyzing populations. Because they are microdata they register the characteristics of individuals and thus can be studied by taking into account any or all of the characteristics present in the record. Because they come from a census, this is a source without paragon for demographic and social analysis due to its high density, complete national coverage, and near simultaneous execution. Moreover, if the microdata are integrated with censuses from several decades and different countries, comparative analysis in time and space opens additional avenues for research. In sum, integrated census microdata are destined to play an important role in social science research and policy making, as has been demonstrated here with the example of the Millennium Development Goals. Without doubt, the use of census microdata will have a significant, positive impact on the understanding of the social and demographic dynamics of individuals, families, and nations.

The IPUMS-International initiative is conscious of this potential, and it is for this reason that the National Science Foundation is providing sustained funding to develop a global collaboratory with national statistical authorities, universities, and research institutes. Indian Institutions and researchers interested in working on this initiative to add more samples for more countries are invited to contact the authors of this paper. Researchers interested in using the microdata are invited to apply for access and use the microdata as research needs require.

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