Articles



Socioeconomic determinants of leprosy new case detection in the 100 Million Brazilian Cohort: a population-based linkage study

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Summary

Background Although leprosy is recognised as a disease of poverty, there is little evidence on the specific socioeconomic factors associated with disease risk. To inform targeted strategies for disease elimination, we investigated socioeconomic markers of leprosy risk in Brazil.

Methods Socioeconomic data from the 100 Million Brazilian Cohort were linked to the Brazilian national disease registry (Sistema de Informação de Agravos de Notificação) for leprosy from Jan 1, 2007, to Dec 31, 2014. Using Poisson regression, we assessed the association of socioeconomic factors with risk of incident leprosy in the full cohort and in children (aged 0–15 years), by leprosy subtype and region of residence.

Findings In an analysis of 23 899 942 individuals including 18 518 patients with leprosy, increased levels of deprivation were associated with an increased risk of leprosy in Brazil. Directions of effect were consistent in children younger than 15 years and across disease subtypes. Individuals residing in regions with the highest poverty in the country (central-west, north, and northeast regions) had a risk of leprosy incidence five-to-eight times greater than did other individuals. Decreased levels of income and education and factors reflecting unfavourable living conditions were associated with an up to two-times increase in leprosy incidence (incidence rate ratio 1.46, 95% CI 1.32-1.62, for lowest *vs* highest quartile of income per capita; 2.09, 95% CI 1.62-2.72, for lowest *vs* highest level of education).

Interpretation Within the poorest half of the Brazilian population, the most deprived individuals have the greatest risk of leprosy. Strategies focusing on early detection and treatment in the poorest populations could contribute substantially to global disease control.

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Introduction

Leprosy, also known as Hansen's disease, is a chronic infectious disease of the peripheral nervous system, skin, eyes, and upper respiratory tract. Although caused by a non-lethal and curable mycobacterial infection, late diagnosis and treatment of leprosy cases can result in permanent disabilities associated with social stigma and economic hardship.^{1,2} Following introduction of multidrug therapy in 1981, global rates of detection of new cases of leprosy declined, but subsequently stabilised, with approximately 200000 new cases recorded annually since 2005.34 Efforts to interrupt disease transmission, which are the focus of the WHO Global Leprosy Strategy 2016–2020,5 are hindered by the pathogen's long incubation period (2-12 years) and gaps in knowledge regarding individual susceptibility to infection and disease development.1

Although leprosy is commonly recognised as a disease of poverty predominately affecting vulnerable and

marginalised populations, its specific social determinants remain inadequately evaluated.⁶ As reported by Pescarini and colleagues in a 2018 systematic review,⁷ most investigations into the association between social conditions and leprosy in high-burden countries have used ecological study designs. This review⁷ also highlighted the insufficient longitudinal evidence on socioeconomic determinants of leprosy incidence.⁸⁻¹⁴ To achieve the goal of halting leprosy transmission, a better understanding of the risk markers of leprosy incidence will be crucial for informing targeted strategies for early case detection and treatment in high-risk populations.

The current study aims to meet this need by investigating the associations between social indicators and new leprosy case detection in Brazil, a country with active transmission and the second highest burden of cases worldwide.¹⁵ Using data collected routinely between 2007 and 2014 and linked as part of the 100 Million Brazilian Cohort, this study used a hierarchical framework to



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Research in context

Evidence before this study

The existing evidence on the social determinants of leprosy was recently summarised in a 2018 systematic review and meta-analysis. The review identified 39 studies reporting on the association of socioeconomic determinants with prevalence or incidence of leprosy across eight high-burden leprosy countries (Brazil, India, Bangladesh, Indonesia, Myanmar, Egypt, the Philippines, and Sri Lanka). Findings from 13 ecological and 27 individual-level studies (including seven prospective studies) highlighted an increased risk of leprosy with increased levels of poverty. Socioeconomic factors associated with increased leprosy risk after meta-analysis included household exposure to leprosy cases, crowded living conditions, manual labour, and food insecurity. Male sex was also associated with an increased risk of leprosy. Additional factors, which were not included in the meta-analyses but were associated with increased risk of leprosy in multiple studies, were increasing age, lack of appropriate sanitary conditions, and low levels of education. This review also highlighted the small numbers of leprosy cases available in most studies and the fact that other potentially relevant sociodemographic factors, such as race or ethnicity, were not assessed

Added value of this study

We have performed the largest study of socioeconomic determinants of leprosy risk in over 33 million Brazilian individuals, which includes over 23 000 cases. This study both confirms previous findings and provides a more robust assessment of the contribution of deprivation to leprosy risk than has previously been possible. In particular, our results highlight a striking gradient of increasing leprosy risk with decreasing levels of education and income. Furthermore, this study shows evidence of large inequalities in leprosy risk across different ethnic groups in Brazil.

Implications of all the available evidence

Indicators of deprivation and low socioeconomic status are associated with an increased risk of leprosy in Brazil. Strategies targeting high-risk populations to reduce leprosy transmission and prevent progression towards potentially stigmatising disabilities should prioritise individuals and families living in precarious situations with low income. Social development appears to be a key strategy for reducing the prevalence of leprosy worldwide.

identify geographical, socioeconomic, and household factors associated with the new case detection rate of leprosy in the overall population, in individuals younger than 15 years, of paucibacillary and multibacillary subtypes, and in five regions of Brazil.

Methods

Study design and participants

The 100 Million Brazilian Cohort¹⁶ was created by the Centro de Integração de Dados e Conhecimentos para Saúde at Oswaldo Cruz Foundation (Salvador, Brazil) to evaluate the impact of social determinants and policies on health. The cohort includes administrative records from over 114 million individuals aged 16 years or older whose families applied for social assistance via the Cadastro Único para Programas Sociais (CadÚnico) registry between 2001 and 2015. In January, 2018, the baseline cohort was linked to leprosy records from 2007 to 2014 registered in the national notifiable disease system, Sistema de Informação de Agravos de Notificação (SINAN-leprosy).^{17,18}

In our analysis, the study population included members of the 100 Million Brazilian Cohort followed from Jan 1, 2007, to Dec 31, 2014. Cohort members were excluded if they were diagnosed with leprosy before registration in CadÚnico, belonged to family units without one member aged 15 years or older (ie, children registered separately from their families), had less than 1 day of follow-up, or were a recurrent leprosy case. Within each family unit, the oldest member was designated as head of family. This study complied with the international (Helsinki), Brazilian, and UK research regulations and was approved by the ethics committees of the University of Brasília (Brasília, Brazil; reference number 1.822.125), Instituto Gonçalo Moniz-Fiocruz (Salvador, Brazil; reference number 1.612.302), and London School of Hygiene & Tropical Medicine (London, UK; reference number 10580-1).

Procedure

For this investigation, we extracted a de-identified dataset including geographical location (region and urbanisation), exposure data related to family living conditions (water supply, household density, housing construction material, presence of electricity, and sewage and waste collection in the household), family income, and sociodemographic indicators (sex, age, race or ethnicity, education, and work) for all family members. Outcome data obtained from linkage to SINAN-leprosy included information on leprosy cases (date of diagnosis, case type [newly detected or relapsed], and leprosy type [paucibacillary or multibacillary]).

Statistical analysis

Based on a broad literature review, we developed a hierarchical framework to investigate the social determinants of leprosy in Brazil (figure 1). Social indicators were grouped into three blocks representing distal, intermediate, and proximal variables. Distal variables related to geographical factors and included region and location of the family home (urban or rural). Intermediate

variables related to socioeconomic position in the community and included self-identified race or ethnicity ("preto" [ie, black], "pardo" (ie, mixed race), "branco" [ie, white], Asian, or Indigenous), education, employment, and per-capita family income (relative to the Brazilian minimum wage). For individuals younger than 18 years, education and employment were reported as the education level and employment status of the head of family. Proximal variables related to household conditions at the family level and included building material, water supply, sanitation, electricity, waste disposal destination, and household density (ie, number of individuals per room). Age and sex were considered to be confounders a priori. The primary outcome of this study was incidence of diagnosed and registered leprosy cases, commonly defined as the leprosy new case detection rate.

For each potential risk marker of leprosy, we first estimated the crude incidence of leprosy in all individuals with available data. Thereafter, we did a complete case analysis, excluding individuals with missing data on any of the covariates in the hierarchical framework.

For the primary outcome analysis, we used Poisson regression models with cluster-robust SEs (ie, accounting for familial clustering of covariates) to estimate the adjusted incidence rate ratios (IRRs) of leprosy. Following a hierarchical analytical approach, we created three adjusted models of leprosy incidence. All variables associated with IRR of leprosy at a significance threshold of p value less than 0.10 were included in the next level model. Model 1 included distal factors plus age and sex. Model 2 included variables from model 1 and intermediate factors. Model 3 included variables from model 2 and proximal factors.

In subsidiary analyses, we investigated the association of potential risk markers with leprosy incidence in the subgroup of children younger than 15 years and by clinical subtype (ie, paucibacillary vs multibacillary) following the same hierarchical approach as the main analysis. Follow-up was censored at the time individuals turned 15 years of age or at the time of leprosy diagnosis, whichever occurred first. We selected the younger-than-15-years age group as new case diagnosis in children is indicative of active disease transmission and this age group represents a priority target group for leprosy elimination.^{5,19} Similarly, multibacillary leprosy presentations are associated with increased rates of onward transmission and disabilities than paucibacillary cases. Given the important regional inequality in socioeconomic and demographic indicators in Brazil, we also investigated potential regional differences in socioeconomic determinants of leprosy in analyses stratified by region (south, southeast, northeast, north, and central-west) using the described hierarchical approach.20

In the sensitivity analysis, we adjusted for year of entry into the cohort to assess the potential effect of policy changes during the study period (Jan 1, 2007, to

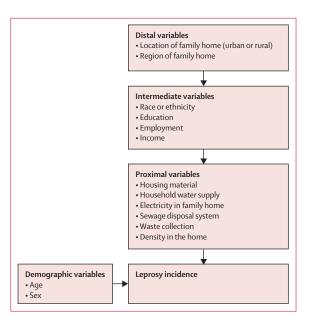


Figure 1: Conceptual framework for the association of sociodemographic factors with leprosy incidence

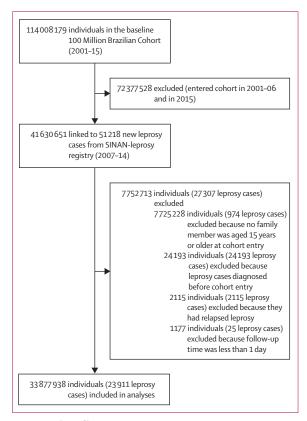


Figure 2: Study profile

The population in this study was selected from the 100 Million Brazilian Cohort.

Dec 31, 2014). Further, as leprosy has a long incubation period and some baseline factors could have changed over time (eg, income or household characteristics), we did a sensitivity analysis restricted to 2 years of follow-up. All p values were calculated for two-sided statistical tests, and all analyses were done using Stata, version 15.0.

Role of the funding source

The funder of the study played no role in study design, data collection, data analysis, data interpretation, or writing of the report. The joint first authors had full access to all the data in the study and all authors had final responsibility for the decision to submit for publication.

Results

The study population included 33877938 individuals (55% female), and 23911 incident leprosy cases (figure 2). Mean age at entry into the cohort was $24 \cdot 4$ years (SD 21·1) and median follow-up duration was $4 \cdot 1$ years (IQR $2 \cdot 1 - 6 \cdot 4$), with a total of 139778058 person-years of follow-up. Most individuals (27430499 [81·0%]) lived in an urban setting, and the southeast (with 12760974 [37·7%] individuals) and northeast (with 10323799 [30·5%] individuals) regions of Brazil were the most represented in the

	Number of individuals with missing data*	Number of individuals	Person-years	Leprosy cases	Crude incidence† (95% CI)
Demographic variables					
Age	2816 (<0·1%)				
<15 years		14172096 (41.8%)	62898954	3273	5·2 (5·0–5·4)
≥15 years		19701096 (58·2%)	76867919	20636	26.8 (26.5-27.2)
Sex	0				
Female		18 499 333 (54·6%)	75642536	11778	15.6 (15.3–15.9)
Male		15 378 605 (45·4%)	64137271	12133	18.9 (18.6–19.3)
Distal variables					
Region of family home	0				
South		3729784 (11.0%)	13 633 178	663	4.9 (4.5-5.2)
Southeast		12760974 (37.7%)	48 906 390	3268	6.7 (6.5–6.9)
North		4179048 (12·3%)	18314832	5525	30·2 (29·4–31)
Northeast		10323799 (30.5%)	48101419	10017	20.8 (20.4–21.2)
Central-west		2884333 (8·5%)	10823988	4438	41 (39.8-42.2)
Location of family home	36 956 (0.1%)				
Urban		27 430 499 (81.0%)	109800000	18953	17.3 (17.0–17.5)
Rural		6 410 472 (18.9%)	29895545	4936	16.5 (16.1–17)
Intermediate variables					
Race or ethnicity	943260 (2.8%)				
"Pardo" (ie, mixed race)		19 275 827 (56·9%)	83774268	16958	20.2 (19.9–20.6)
"Branco" (ie, white)		11154507 (32.9%)	43 225 070	4448	10.3 (10.0–10.6)
"Preto" (ie, black)		2115391 (6·2%)	9241334	1892	20.5 (19.6–41.4)
Indigenous		247685 (0.7%)	1115229	80	7.2 (5.8–8.9)
Asian		141268 (0.4%)	426151	78	18·3 (14·7–22·9)
Highest level of education‡	4027882 (11·9%)				
Higher education		193732 (0.6%)	785 443	69	8.8 (6.9–11.1)
Year 10-12		7 906 287 (23.3%)	22117454	2338	10.6 (10.2–11.0)
Year 6-9		9792017 (28·9%)	41 842 035	5945	14.2 (13.9–14.6)
Year 1–5		8 933 482 (26·4%)	41040299	8839	21.5 (21.1–22.0)
Preschool, no education, or illiterate		3024538 (8·9%)	14461430	4154	28.7 (24.6–29.6)
Employment‡	4768980 (14·1%)				
Currently employed		17700913 (52.2%)	61157120	10 478	17.1 (16.8–17.5)
Unemployed student		4327199 (12·8%)	26 942 843	5335	19.8 (19.3–20.3)
Unemployed (not student)		10 080 846 (29.8%)	28 555 481	5483	19·2 (18·7–19·7)
ncome per capita§	929 (<0.1%)				
>1 minimum wage		1424157 (4·2%)	3801664	857	22.1 (20.7–23.6)
>0·5–1 minimum wage		4 513 939 (13·3%)	13027761	3535	27.1 (26.3–28)
>0·25–0·5 minimum wage		6438130(19.0%)	23592423	3845	16.3 (15.8–16.8)
0–0·25 minimum wage		16662023(49.2%)	80 578 218	12 986	16.1 (15.8–16.4)
No income		4838760 (14-3%)	18697865	2687	14.4 (13.8–14.9)

	Number of individuals with missing data*	Number of individuals	Person-years	Leprosy cases	Crude incidence† (95% CI)
(Continued from previous page)					
Proximal variables					
Housing material	849 112 (2·5%)				
Brick or cement		26 645 109 (78.7%)	106900000	16339	15·3 (15·1–15·5)
Taipa, wood, or other		6383717 (18.8%)	31 139 685	7254	23·3 (22·8–23·8)
Household water supply	849109 (2·5%)				
Public network		24975375 (73·7%)	100 100 000	16 110	16-1 (15-8–16-3)
Well, natural source, cistern, or other		8 053 454 (23.8%)	37981211	7483	19·7 (19·3–20·2)
Sewage disposal system	1577939 (4·7%)				
Public network		17 084 378 (50·4%)	66948282	7609	11.4 (11.1–11.6)
Septic tank, ditch, or other		15 215 621 (44·9%)	69 532 912	15597	19.7 (19.3–20.2)
Electricity in family home	849 060 (2·5%)				
Home meter		26 683 824 (78.8%)	109 500 000	18 922	17-3 (17–17-5)
Community meter		2108775 (6.2%)	8 110 157	838	10.3 (9.7–11.1)
Illegal electricity, gas lighting, candlelight, or other		4236279 (12·5%)	20483095	3833	18.7 (18.1–19.3)
Waste collection	849136 (2·5%)				
Public collection system		26872031(79.3%)	107 600 000	17783	16.5 (16.3–16.8)
Burned, buried, outdoor disposal, or other		6 156 771 (18.2%)	30 467 394	5811	19.1 (18.6–19.6)
Density (individuals per room)	865411(2.6%)				
≤0.5		9989012 (29·5%)	35201492	8687	24.7 (24.2–25.2)
>0.5-0.75		7103940 (21·0%)	27 826 309	4296	15-4 (15–15-9)
>0.75-1.00		7806338 (23.0%)	33761337	5007	14.8 (14.4–15.3)
>1.00		8 113 237 (23.9%)	41223277	5583	13.5 (13.2–19.9)

Data are n or n (%) unless otherwise specified. *Individuals with missing data were included in the study population and for the estimation of crude incidence, but not in the adjusted analysis (table 2). †The crude incidence is expressed per 100 000 person-years. ‡Information on education and employment is reported for adult individuals (>18 years) or for the oldest member of the family of individuals younger than 18 years. §Income in minimum wage was calculated by year, dividing the familial income by the minimum wage in the year of application in the Cadastro Único para Programas Sociais.

Table 1: Baseline characteristics (n=33 877 938)

cohort (table 1). 19275827 (56.9%) individuals self-identified as being "pardo" (ie, mixed race), and 11154507 (32.9%) identified as being "branco" (ie, white). 11958020 (35.3%) individuals completed education at primary school level or less, and 27938913 (82.5%) had a per-capita income of less than half the minimum wage.

The association of socioeconomic risk factors with incidence of leprosy was assessed in a complete case analysis of 23899942 individuals, including 18518 leprosy cases, followed up for a median of 3.5 years (IQR 2.0-6.6; table 2). Subgroup analyses in children younger than 15 years included 9772650 children and 2725 leprosy cases (table 3). Geographical factors included in the distal model were associated with leprosy risk in the full cohort and in children. In the full cohort, individuals residing in the north or central-west regions had an approximately eight-times higher leprosy incidence than did individuals in the south region (IRR 8.01, 95% CI 7.29-8.80 [north vs south regions], and 8.36, 7.60-9.20 [central-west vs south regions]; table 2). This risk was enhanced in individuals younger than 15 years; children living in the north region had a 34-times higher leprosy incidence than did those living in the south region $(33 \cdot 6, 18 \cdot 1 - 62 \cdot 2;$ table 3). Individuals living in an urban area were also at increased risk of leprosy compared with rural inhabitants (1.22, 1.18-1.27, in the full cohort; 1.45, 1.29-1.63, in children).

Intermediate factors associated with risk of leprosy in the full cohort included race or ethnicity, education, and income (table 2). When compared with individuals in the full cohort identifying as "branco" (ie, white), those who identified as "preto" (ie, black) had the highest risk of leprosy (IRR 1.40, 95% CI 1.32-1.49), followed by "pardo" individuals (1.26, 1.21-1.32). Indigenous individuals appeared to have lower leprosy incidence than did the "branco" population (0.39, 0.30-0.51). Lower education level and low income were also associated with increased leprosy risk, with evidence of a positive trend for both factors. The greatest increase in risk was found for individuals with the lowest level of education (or whose head of family had the lowest level of education), with an over two-times higher leprosy incidence than those who continued education past high school ($2 \cdot 09$, $1 \cdot 62 - 2 \cdot 72$). Similarly, individuals with no income or an income per capita less than 0.25 times the minimum wage had a leprosy risk more than 40% higher than those earning more than minimum wage (1.46, 1.32-1.62, for individuals with no income; 1.47, 1.34-1.61, for those with incomes <0.25 times the minimum wage). Unemployment was associated with a reduced leprosy risk regardless of current education status. In further analyses investigating this inverse effect, we identified an interaction between age and employment after stratification by year of cohort entry (as the employment questionnaire was updated in 2010; appendix p 1). After stratification, only the 18–30-years age group showed a significant protective effect of unemployment in both subgroups.

The association of self-reported race or ethnicity with leprosy risk in children followed a similar pattern to the full cohort, with the highest risk among children identifying as "preto" (IRR 1.92, 95% CI 1.52-2.42), followed by those identifying as "pardo" (1.60, 1.38-1.85), and a decreased risk for Indigenous children (0.35, 0.17-0.75). Having a head of family in the lowest education group was also associated with a significantly increased leprosy risk in children (2.66, 1.10-6.49). The increased IRR values calculated for children with familial incomes lower than the minimum wage were not significant (table 3).

See Online for appendix

	Model 1		Model 2*		Model 3†	
	IRR	p value	IRR	p value	IRR	p value
Demographic variables						
Age (per 10 years)	1.31 (1.30–1.31)	<0.001	1.35 (1.34–1.36)	<0.001	1.36 (1.35–1.36)	<0.001
Sex						
Female	Ref					
Male	1.25 (1.22–1.29)	<0.001	1.23 (1.19–1.26)	<0.001	1.22 (1.19–1.26)	<0.001
Distal variables						
Region of family home						
South	Ref					
South-east	1.47 (1.33–1.61)	<0.001				
North-east	5.09 (4.64-5.57)	<0.001				
North	8.01 (7.29–8.80)	<0.001				
Central-west	8.36 (7.60–9.20)	<0.001				
Location of family home						
Rural	Ref					
Urban	1.22 (1.18–1.27)	<0.001				
Intermediate variables						
Race or ethnicity						
"Branco" (ie, white)			Ref			
"Preto" (ie, black)			1.40 (1.32–1.49)	<0.001		
"Pardo" (ie, mixed race)			1.26 (1.21–1.32)	<0.001		
Asian			1.12 (0.87–1.45)	0.38		
Indigenous			0.39 (0.30-0.51)	<0.001		
Highest level of education‡						
Higher education			Ref			
Year 10–12			1.39 (1.07–1.80)	0.01		
Year 6-9			1.77 (1.37-2.29)	<0.001		
Year 1–5			1.95 (1.51–2.52)	<0.001		
Preschool, no education, or illiterate			2.09 (1.62–2.72)	<0.001		
Employment‡						
Currently employed			Ref			
Unemployed student			0.96 (0.92-0.99)	<0.001		
Unemployed (not student)			0.73 (0.69–0.76)	<0.001		
Income per capita						
>1 minimum wage			Ref			
>0·5–1 minimum wage			0.95 (0.87–1.05)	0.31		
>0·25–0·5 minimum wage			1.23 (1.12–1.35)	<0.001		
0–0·25 minimum wage			1.47 (1.34–1.61)	<0.001		
No income			1.46 (1.32–1.62)	<0.001		

	Model 1		Model 2*		Model 3†	
	IRR	p value	IRR	p value	IRR	p value
(Continued from previous page)						
Proximal variables						
Housing material						
Brick or cement					Ref	
Taipa, wood, or other					1.34 (1.29–1.40)	<0.00
Household water supply						
Public network					Ref	
Well, natural source, cistern, or other					0.97 (0.93-1.01)	0.16
Sewage disposal system						
Public network					Ref	
Septic tank, ditch, or other					1.35 (1.30–1.40)	<0.00
Electricity in family home						
Home meter					Ref	
Community meter					0.93 (0.86–1.01)	0.10
Illegal electricity, gas lighting, candlelight, or other					1.03 (0.98–1.08)	0.26
Waste collection system						
Public collection system					Ref	
Burned, buried, outdoor disposal, or other					0.97 (0.92–1.04)	0.41
Density (individuals per room)						
≤0·5					Ref	
>0.5-0.75					1.02 (0.97–1.07)	0.37
>0.75-1.00					1.01 (0.97–1.06)	0.61
>1.00					0.97 (0.92–1.02)	0.25

IRRs for leprosy new case detection were obtained using generalised linear Poisson models with clustered SEs to account for clustering by family. A complete-case analysis approach was used excluding from all models individuals with missing data in any of the three models. IRR=incidence rate ratio. *Covariates in model 2 were adjusted for covariates from model 1 with p<0.1 (ie, model 2 was adjusted for region and location of family home). †Covariates in model 3 are adjusted for covariates from model 1 and model 2 with p<0.1 (ie, model 3 was adjusted for region, location of family home, ethnicity, education, employment, and income per capita). ‡Information on education and employment is reported for adult individuals (>18 years) or for the oldest member of the family of individuals younger than 18 years.

Table 2: Multivariate hierarchical association of socioeconomic factors with leprosy incidence using a complete-case analysis (n=23899942)

Proximal factors associated with an increased leprosy risk in the total population and in children included the lack of a public network for sewage disposal and living in an accommodation built of less durable materials than brick and cement (table 2; table 3). IRR estimates for housing material other than brick and cement were 1.34 (95% CI 1.29-1.40) in the full cohort and 1.26 $(1 \cdot 11 - 1 \cdot 43)$ for children vounger than 15 years. The leprosy IRR for absence of public sewage disposal was 1.35 (1.30–1.40) in the total cohort and 1.55 (1.37–1.75) for children. Absence of a formal lighting source in the home was also associated with increased risk of leprosy in children (1.19, 1.05-1.35). There was no evidence of an association of household water supply, electricity in family home, waste collection system, or housing density with leprosy risk in the total cohort. In children, use of a non-public waste collection system was inversely associated with leprosy risk (0.79, 0.68-0.93), whereas increased housing density was associated with an increase in leprosy risk (1.21, 1.01-1.44, for more than one person per room vs less than one person per two rooms).

Increasing age was associated with an increased leprosy risk in the total cohort and in children. The IRR of leprosy in the proximal model was 1.36 (95% CI 1.35-1.36) per 10-year increase in age in the full cohort, and 3.33 (2.92-3.80) in children (10-15 years *vs* 0-5 years). Male sex was also associated with an increased leprosy incidence in the full cohort (1.22, 1.19-1.26) in the proximal model, but not in children.

In the analysis stratified by leprosy subtypes, results were similar between paucibacillary (7310) and multibacillary (11205) cases for most socioeconomic determinants (appendix pp 2–3). Age, region, location of family home, race or ethnicity, education, employment and income were associated with risk of both paucibacillary and multibacillary leprosy. Similar trends were apparent for both disease subtypes across all factors with the exception of sex, which showed opposing directions of association between paucibacillary (male *vs* female IRR 0.73, 95% CI 0.70-0.77) and multibacillary subtypes (1.70, 1.63-1.76; appendix pp 2–3).

Stratified analyses by geographical region showed little evidence of differences between regions for most

socioeconomic determinants of leprosy risk with the exception of education. The inverse association of education with leprosy risk, which was evident in all regions, appeared to be strongest in the south and southeast regions (appendix pp 4–5).

Sensitivity analyses adjusting for year of entry into the cohort and restricted follow-up time to 2 years showed consistent results with the primary analysis (appendix pp 6–9).

Discussion

In this study, we have investigated the association of socioeconomic and demographic factors with leprosy incidence in the 100 Million Brazilian Cohort. With 33877938 individuals, including 23911 leprosy cases, to our knowledge, this is the largest study to investigate the social determinants of leprosy.

Study results provided strong evidence of an association of poverty indicators with leprosy incidence. Factors

	Model 1		Model 2*		Model 3†	
	IRR	p value	IRR	p value	IRR	p value
Demographic variables						
Age (years)						
0 to <5	Ref		Ref		Ref	
≥5 to <10	2.82 (2.55-3.12)	<0.001	2.70 (2.44-2.98)	<0.001	2.71 (2.45-3.00)	<0.001
≥10 to <15	3·34 (2·94–3·80)	<0.001	3.28 (2.89–3.73)	<0.001	3.33 (2.92–3.80)	<0.001
Sex						
Female	Ref		Ref		Ref	
Male	0.98 (0.90–1.07)	0.61	0.98 (0.90–1.06)	0.57	0.98 (0.89–1.06)	0.58
Distal variables						
Region of family home						
South	Ref					
Southeast	5.44 (2.91–10.16)	<0.001				
Northeast	24.18 (13.08–44.74)	<0.001				
North	33.58 (18.12–62.24)	<0.001				
Central-west	26.02 (13.94-48.56)	<0.001				
Location of family home						
Rural	Ref					
Urban	1.45 (1.29–1.63)	<0.001				
Intermediate variables						
Race or ethnicity						
"Branco" (ie, white)			Ref			
"Preto" (ie, black)			1.92 (1.52–2.42)	<0.001		
"Pardo" (ie, mixed race)			1.60 (1.38–1.85)	<0.001		
Asian			1.92 (0.91–4.07)	0.09		
Indigenous			0.35 (0.17-0.75)	0.007		
Highest level of education (head of family)						
Higher education			Ref			
Year 10–12			1.49 (0.61–3.62)	0.38		
Year 6-9			2.12 (0.88–5.10)	0.10		
Year 1–5			2.14 (0.89–5.17)	0.09		
Preschool or no education or illiterate			2.66 (1.10–6.49)	0.03		
Employment (head of family)						
Currently employed			Ref			
Unemployed student			1.08 (0.96–1.21)	0.38		
Unemployed (not student)			0.70 (0.59–0.82)	<0.001		
Income per capita						
>1 minimum wage			Ref			
>0·5-1 minimum wage			2.61 (0.35–19.17)	0.35		
>0·25-0·5 minimum wage			3.44 (0.48–24.56)	0.22		
0–0·25 minimum wage			4.31 (0.61–30.58)	0.14		
No income			4.01 (0.56-28.60)	0.17		

	Model 1		Model 2*		Model 3†	
	IRR	p value	IRR	p value	IRR	p value
(Continued from next page)						
Proximal variables						
Housing material						
Brick or cement					Ref	
Taipa, wood, or other					1.26 (1.11–1.43)	<0.001
Household water supply						
Public network					Ref	
Well, natural source, cistern, or other					0.95 (0.84-1.08)	0.44
Sewage disposal system						
Public network					Ref	
Septic tank, ditch, or other					1.55 (1.37–1.75)	<0.001
Electricity in family home						
Home meter					Ref	
Community meter					0.90 (0.71–1.15)	0.41
Illegal electricity, gas lighting, candlelight, or other					1.19 (1.05–1.35)	0.01
Waste collection system						
Public collection system					Ref	
Burned, buried, outdoor disposal, or other					0.79 (0.68-0.93)	0.004
Density (individuals per room)						
≤0.5					Ref	
>0.5-0.75					1.22 (1.01–1.46)	0.04
>0.75-1.00					1.15 (0.96–1.38)	0.22
>1.00					1.21 (1.01–1.44)	0.04

IRRs for leprosy new case detection were obtained using generalised linear Poisson models with clustered SEs to account for clustering by family. A complete-case analysis approach was used excluding from all models individuals with missing data in any of the three models. Follow-up time was censored when individuals turned 15 or were diagnosed with leprosy, whichever event occurred first. IRR=incidence rate ratio. *Covariates in model 2 were adjusted for covariates from model 1 with p<0-1 (ie, model 2 was adjusted for region and location of family home). †Covariates in model 3 are adjusted for covariates from model 1 and model 2 with p<0-1 (ie, model 3 was adjusted for region, location of family home, ethnicity, education, and employment; model 3 was also adjusted for income per capita despite p>0-1 because it was considered a relevant confounder).

Table 3: Multivariate hierarchical association of socioeconomic factors with leprosy new case detection in individuals younger than 15 years (n=9772 650)

that showed a consistent direction of effect across analyses included age, region of residence, location of family home, race or ethnicity, education, income, and indicators of living conditions (ie, housing material and sewage disposal system). The direction of association for these factors in both primary and subgroup analyses, found evidence that the most deprived groups in Brazil are at the greatest risk of leprosy detection. Individuals residing in regions with the most widespread poverty in the country (central-west, north, and northeast regions) had leprosy risk five-to-eight times greater than other individuals.20 Similarly, being of a self-reported "preto" (ie, black) or "pardo" (ie, mixed race) ethnicity-which is associated with higher deprivation levels in Brazil-was linked to an up to 40% increase in disease risk.²¹ However, Indigenous ethnicity, which is also associated with increased levels of poverty in Brazil, was associated with decreased risks of leprosy in our study.21 The lower detection rates in Indigenous individuals than in other ethnic groups could reflect lower prevalence of disease because of their living in isolated communities and perhaps an under-diagnosis of leprosy cases because of disparities in health-care access.²² The difference in risk

across ethnic groups increased in individuals younger than 15 years, with results showing a 92% increase in leprosy incidence in children who identified as "preto" (ie, black) compared with those who identified as "branco" (ie, white). Furthermore, direct indicators of deprivation, including no family income, lower level of education, and factors reflecting unfavourable living conditions, were associated with a leprosy incidence up to two-times higher. A gradient effect was evident, showing an increasing risk of leprosy with decreasing income and education level.

The association of unfavourable socioeconomic conditions with increased leprosy risk has been reported in previous studies and was recently summarised in a systematic review by Pescarini and colleagues.⁷ These authors reported a number of poverty indicators associated with an increased risk of leprosy in highburden countries, including food shortages, increased prevalence of illiteracy, and decreased income. Among studies included in the review, increased prevalence of illiteracy was associated with an up to two-times greater risk of leprosy, whereas decreased income was associated with an increased leprosy risk in one out of four studies.

Additional socioeconomic factors that reflect increased contact exposure and increased levels of deprivation, such as urbanisation and household crowding, have also been associated with an increased risk of leprosy detection.7.23 Although we found similar evidence that individuals living in urban areas were at a greater risk of leprosy detection than individuals living in rural areas, we did not find evidence of an association of household density with leprosy risk in the full cohort. It is, however, noteworthy that in subgroup analyses increased household density (more than one resident per two rooms) was associated with an increased leprosy risk in children, a group indicative of active transmission. Most countries reporting sex-specific leprosy incidence report more detected cases in men than in women,^{24,25} which is in line with our study findings. This sex-associated difference in leprosy detection has been suggested to reflect differences between men and women in exposure behaviours and health-care access.25-27

Only one individual-level study has previously assessed the association of unemployment with leprosy risk and found no evidence of an association.²⁸ In our study, we found that unemployment was associated with a decreased leprosy risk, despite the crude analysis indicating increased leprosy incidence in unemployed individuals. However, after accounting for changes to the CadÚnico registration questionnaire, this protective effect appeared to be driven by the 18–30-year age subpopulation. This inverse association might be due to different behavioural patterns between employed and unemployed individuals in this age group. However, we were unable to investigate this association further because of the unavailability of detailed information in the registry data.

There are several strengths to this study. As leprosy is a rare disease with a long incubation period, accrual of a sufficient number of cases represents an important limitation to longitudinal studies of the disease. The large size of our study population, with a follow-up duration of up to 8 years, has provided us with unprecedented power to study key socioeconomic determinants of leprosy. Furthermore, we have performed the largest individuallevel prospective investigation of poverty and leprosy, providing a more robust estimation of the effect of deprivation on leprosy than has previously been possible. The detailed level of data on income and education available in this study has also enabled us to assess the gradient impact of these factors on leprosy risk.

However, our study has limitations. As the data used was routinely collected for non-research purposes, there are limitations to the detail and completeness of the information collected. For instance, other socioeconomic determinants—such as household cleanliness, nutrition, and food shortages—that have been associated with leprosy risk in previous studies were not available in this study. The level of information available has also restricted our ability to investigate the specific mechanisms through which socioeconomic factors might influence leprosy infection and transmission (eg, as related to the unexpected inverse association of unemployment with leprosy incidence in individuals aged 18–30 years). Additionally, although we adjusted for region of residence, data for relocation and migration of cohort members were not available. This could have led to attenuated estimates of leprosy risk, if relocation was associated with a change in socioeconomic status.

Missing data are a common problem for routinely collected records. Overall, we excluded 29% of the population because of missing information, particularly related to education and employment. As the leprosy incidence in the complete-case analysis was similar to that of the total population (18.7 per 100000 for the complete-case population vs 17.1 per 100 000 for the total population), the exclusion of participants with missing data is unlikely to have strongly biased our findings. Of note, however, leprosy incidence was lower in individuals with missing data for education (13.1 per 100000) than in those for whom these data were available (17.8 per 100000), and in individuals with missing data for employment (11.3 per 100000) than in those for whom these data were available (18.2 per 100000); these differences might have influenced our estimates for these factors.

As information on leprosy cases diagnosed before 2007 was not included, individuals diagnosed before 2007 who have not completed treatment might be misclassified in our population. However, given the rarity of the disease, this is unlikely to have had any substantial effect on study results. Finally, as the population used in this study consists of potential beneficiaries of social protection programmes, who represent the poorest portion of the Brazilian population, the findings of this study might not be applicable to the general Brazilian population. Indeed, the difference in risk between our study population and individuals in the higher socioeconomic strata of the Brazilian population is likely to be even greater.

The findings of this study show that the most deprived segments of the Brazilian population are at greatest risk of leprosy. The existence of a gradient in disease risk with increasing poverty within the poorest portion of the Brazilian population is a strong argument for the important contribution of deprivation to leprosy risk. This unequal distribution of risk places an even greater burden on already socioeconomically disadvantaged groups, reinforcing existing social and health inequalities.

Our results have important implications for the strategy of disease control in Brazil and abroad. Early detection and prevention in high-risk communities is vital for interrupting leprosy transmission in children and reducing the prevalence of stigmatising leprosy-related disabilities. Strategies aiming to increase leprosy diagnosis and improve access to health care in the poorest populations in leprosy-endemic regions might have important benefits for improving disease control and achieving WHO goals. Our results support the existing evidence, which suggests that along with early diagnosis and treatment of leprosy cases, social development is a key strategy for reducing the prevalence of leprosy worldwide.²⁹ Poverty alleviating interventions, such as the Brazilian cash transfer programme Bolsa Familia, could substantially contribute towards achieving the goal of leprosy elimination.^{30,31}

Contributors

JSN, JMP, AS, MYI, MLFP, LCR, MLB, and GOP contributed to the study conception and data collection. JSN, AR, JMP, AS, and EBB contributed to the study design and data analysis plan. AR, JMP, and AA analysed the data. JSN, AR, JMP, LS, MLB, EBB, and GOB contributed to data interpretation. JSN, AR, JMP, and EBB wrote the manuscript draft. All authors critically reviewed the manuscript and approved the final draft. JSN, AR, and JMP contributed equally as joint first authors of the manuscript. MLB, EBB, and GOP contributed equally as joint senior authors.

Declaration of interests

We declare no competing interests.

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