



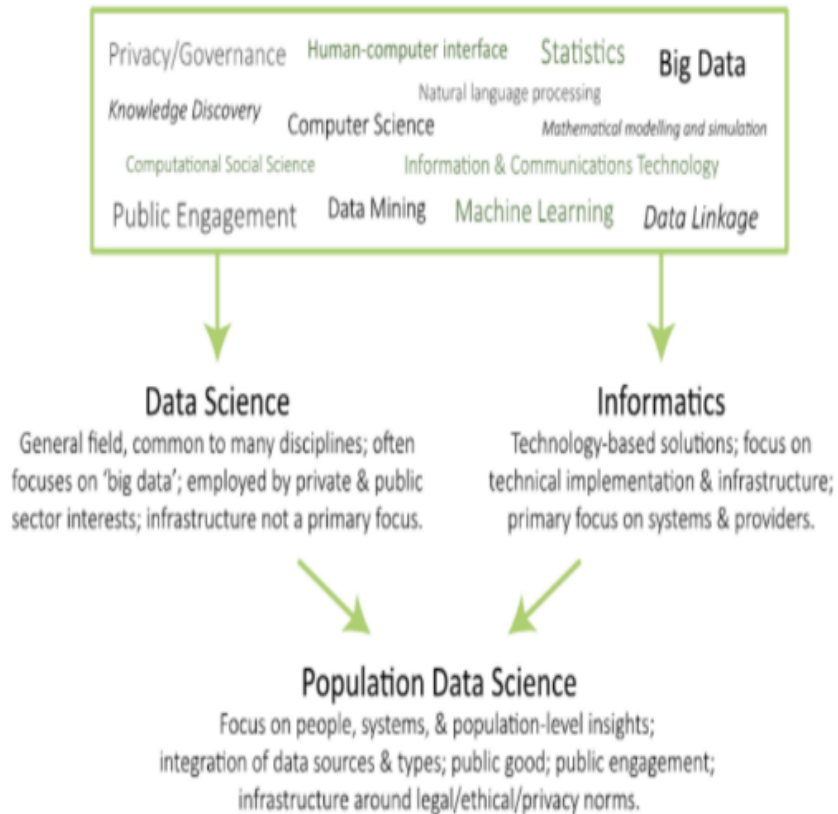
Population-based epidemiology in the era of data science and routine health data:

Experiences from Brazil

Mauricio L Barreto



Population Data Science



This multidisciplinary science aims to promote technological advancements, and discover new ways of analyzing data and methods of public engagement.

- **Population Data Science** is characterized by four aspects:

i) It is valuable and in the public's interest, as it uses data in a positive manner to benefit citizens and society;

ii) Data from different sources are integrated and analyzed;

iii) Results are analyzed from a populational perspective;

iv) Technical infrastructure should be developed, and policies should be elaborated in conformity with regional ethical and legal standards to support scientific research, while preserving the privacy of data subjects.



What challenges might an initiative using linked data to support research in Brazil face?

Brazil's Unified Health System - SUS

- That largest Latin American country (8.5 million Km²)
- Population of ~215 million inhabitants

Universal access to health care services for the entire Brazilian population, and universal health coverage across Brazil is provided through the Brazilian Unified Health System (SUS).



LGPD, Academic Research and Public Health Research



Presidência da República
Secretaria-Geral
Subchefia para Assuntos Jurídicos

[LEI Nº 13.709, DE 14 DE AGOSTO DE 2018.](#)

[Espõe sobre a proteção de dados pessoais e altera a Lei nº 12.965, de 20 de abril de 2014, Marco Civil da Internet;](#)

[Lei Geral de Proteção de Dados Pessoais \(LGPD\)](#) [\(Sicrago\)](#) [Lei nº 13.853, de 2019](#) [Vigência](#)

O PRESIDENTE DA REPÚBLICA Faz saber que o Congresso Nacional decretou e eu sanciono a seguinte Lei:

CAPÍTULO DISPOSIÇÕES PRELIMINARES

Art. 1º Esta Lei dispõe sobre o tratamento de dados pessoais, inclusive nos meios digitais, por pessoa natural ou por pessoa jurídica de direito público ou privado, com o objetivo de proteger os direitos fundamentais de liberdade e de privacidade e o livre desenvolvimento da personalidade da pessoa natural.

Parágrafo Único. As normas gerais contidas nesta Lei são de interesse nacional e devem ser observadas pela União, Estados, Distrito Federal e Municípios. [\(Institui a Lei nº 13.853, de 2019\)](#) [Vigência](#)

Art. 2º A disciplina da proteção de dados pessoais tem como fundamentos:

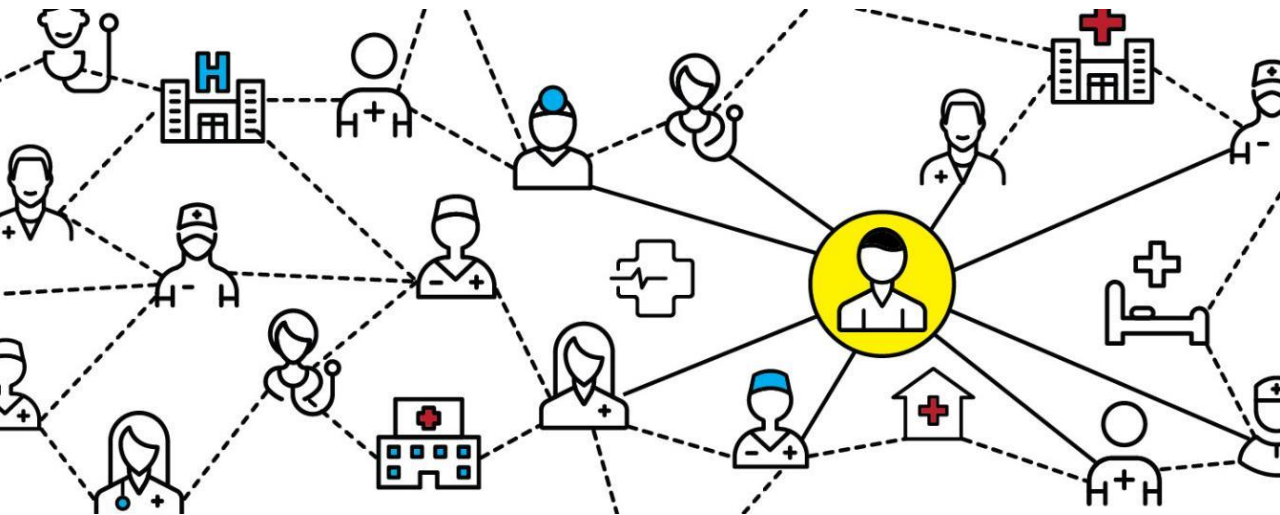
- I - o respeito à liberdade;
- II - a autodeterminação informacional;
- III - a liberdade de expressão, de informação, de comunicação e de opinião;
- IV - a intimidade, de honra e de imagem;
- V - o desenvolvimento econômico e tecnológico e a inovação;
- VI - a livre iniciativa, a livre concorrência e a defesa do consumidor; e
- VII - os direitos humanos, o livre exercício do direito de cidadania pelas pessoas naturais.

Art. 3º Esta Lei aplica-se a qualquer operação de tratamento realizada por pessoa jurídica de direito público ou privado, independentemente do meio, do país de sua sede ou do país onde estejam localizados os dados, desde que:

- a operação de tratamento seja realizada no território nacional;

- Scientific research and public health are considered specific contexts for processing personal data under the LGPD, provided that recommendations and safeguards established by the law are followed in conformity with specific regulations for each sector (Articles 4º, 7º, 11 e 13).

Fragmentation



Brazil Data Ecosystem

Social and Health Policies

Health Outcomes



Many challenges to connecting these data “silos”

- ✓ Data heterogeneity (accuracy, format);
- ✓ Data fragmentation (multiple databases, multiple owners/ stakeholders);
- ✓ Data availability (protection for commercial or cultural reasons, or related to personal privacy);
- ✓ Data handling (data management, data access, data quality, data querying, data sharing);
- ✓ Data privacy and integrity (prevention of corruption and hacking);
- ✓ Data conceptualisation (ontologies).

Why was CIDACS created?



CIDACS was created in December 2016 in the city of Salvador (Bahia-Brazil) with the objective of conducting interdisciplinary research on population health determinants using integrated Brazilian (national) datasets to generate scientific knowledge and provide evidence to support public policymaking.



Unified Registry for Social Programmes (CadUnico)



Individual level variables

- ✓ Age (at time of application)
- ✓ Sex
- ✓ Marital status
- ✓ Relationship to the person responsible for the household
- ✓ Race/Ethnicity
- ✓ Literacy status
- ✓ Level of education
- ✓ Employment status
- ✓ Household income (monthly)
- ✓ Individual income (monthly)
- ✓ Indigenous, *quilombola*, and other traditional population groups
- ✓ Experiencing homelessness?
- ✓ Place of birth



Family level variables

- ✓ Municipality of family residence
- ✓ Region of family residence
- ✓ Location of family residence
- ✓ Housing and flooring material
- ✓ Household type
- ✓ Household water supply
- ✓ Sewage disposal system
- ✓ Electricity
- ✓ Waste collection
- ✓ Sidewalks around household
- ✓ Number of individuals in the household
- ✓ Number of rooms in the household

| Data source | Data type | Approximate coverage | Examples of relevant variables |
|-------------|--|--|--|
| SINASC | Live birth records in Brazil | 97% of live births | Newborn characteristics (sex, Apgar scores, birth weight, ICD-10 coded congenital malformation), maternal characteristics (name, age, marital status, education, race/ethnicity, place of residence), paternal characteristics (name, age), perinatal information (reproductive history: parity, abortions, stillbirths, gestational duration, delivery mode, number of fetuses, antenatal care attendance), location of birth |
| CadUnico | Social records from over 130 million individuals aged ≥ 16 years whose families applied for social assistance in Brazil | >50% of population | Location of residence (municipality, region, urban or rural), living conditions (housing, water sources, electricity, sewage, waste, household density), socioeconomic characteristics (education, employment, income), demographics (age, sex, race/ethnicity), social protection program participation and conditionalities |
| SINAN | Records of communicable diseases of interest in the country | ---- | It is disease specific. Onset of symptoms, date of birth, patient name, sex, address, laboratory confirmation, symptoms and treatment |
| SIH-SUS | Hospitalisation admission records | 75% of hospitalisations in the Brazilian National Health System | Cause of hospitalisation (ICD-10 code), duration, costs, and date of hospitalisation, type of hospital |
| SIM | Death records in Brazil | 75-95% of Brazilian deaths, with some geographic heterogeneity | Cause of death (ICD-10 code), characteristics of the deceased (dates of birth and death, name, name of parents, sex, race/ethnicity, birth weight for infants), place of death, characteristics of mother of deceased children (maternal name, age, marital status, education, occupation, race/ethnicity, number of births, place of residence, length of gestation, number of previous stillbirths or abortions, type of delivery) |
| SISVAN | Anthropometric and food consumption records | 30% of children <5 years attending primary care in the Brazilian National Health System, with heterogeneity across populations | Date of birth, age, sex, race/ethnicity, anthropometrics, breastfeeding, complementary feeding, consumption of healthy and unhealthy foods |

a novel iterative **deterministic** record linkage algorithm based on a combination of indexing search and scoring algorithms (provided by Elasticsearch) [...] for huge datasets, with higher accuracy, improved scalability, and substantially shorter execution time compared to other existing linkage tools.

BMC Medical Informatics and Decision Making

Home About [Articles](#) [Submission Guidelines](#) [Collections](#) [Join The Board](#) [Submit manuscript](#)

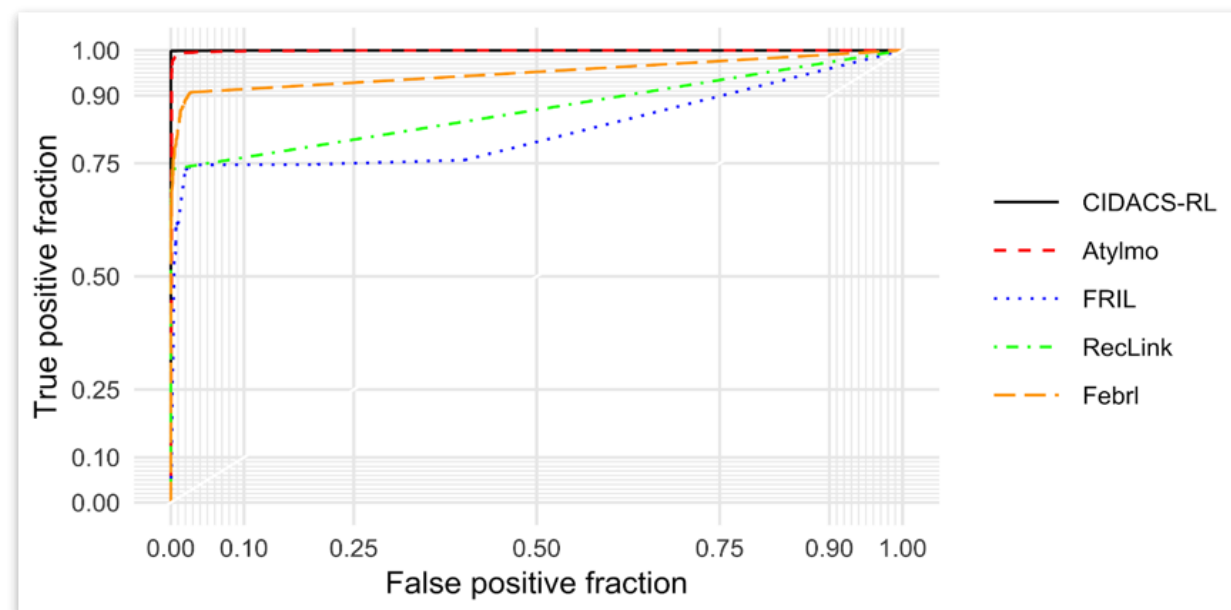
Research article | [Open access](#) | Published: 09 November 2020

CIDACS-RL: a novel indexing search and scoring-based record linkage system for huge datasets with high accuracy and scalability

[George C. G. Barbosa](#) , [M. Sanni Ali](#), [Bruno Araujo](#), [Sandra Reis](#), [Samila Sena](#), [Maria Y. T. Ichihara](#), [Julia Pescarini](#), [Rosemeire L. Fiaccone](#), [Leila D. Amorim](#), [Robespierre Pita](#), [Marcos E. Barreto](#), [Liam Smeeth](#) & [Mauricio L. Barreto](#)

BMC Medical Informatics and Decision Making 20, Article number: 289 (2020) | [Cite this article](#)

3525 Accesses | 34 Citations | 1 Altmetric | [Metrics](#)

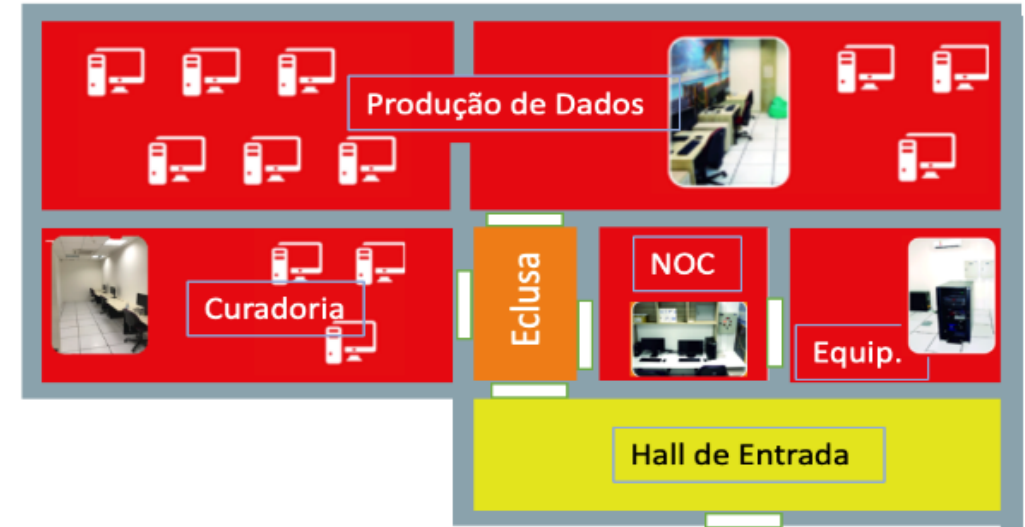


cidacsRL

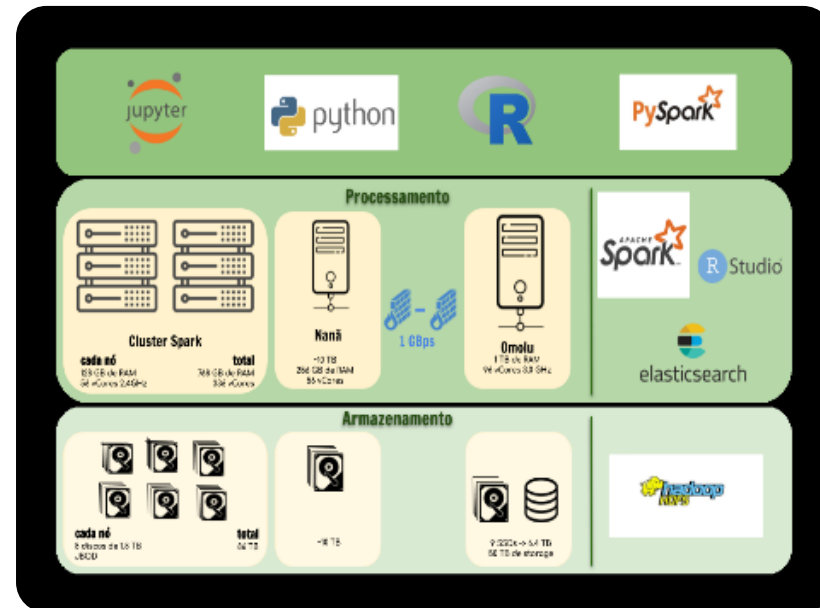
Computational resources on Data platform



Safety room for data integration



Datacenter Container



The centre employs a complex data management system incorporating information security, ethical principles, and privacy protection.

International Journal of Population Data Science (2019) 4:2:04

International Journal of
Population Data Science

Journal Website: www.ijpds.org



The Centre for Data and Knowledge Integration for Health (CIDACS): Linking Health and Social Data in Brazil

Barreto, ML^{1,2*}, Ichihara, MY^{1,2}, Almeida, BA¹, Barreto, ME^{1,3}, Cabral, L¹, Fiaccone, RL^{1,4}, Carreiro, RP¹, Teles, CAS¹, Pitta, R¹, Penna, GO^{1,5,6}, Barral-Netto, M¹, Ali, MS^{1,7,8}, Barbosa, G¹, Denaxas, S⁹, Rodrigues, LC^{1,8}, and Smeeth, L^{1,8}

Submission History

| | |
|-----------|------------|
| Submitted | 31/08/2019 |
| Accepted | 21/09/2019 |
| Published | 20/11/2019 |

¹Centre for Data and Knowledge Integration for Health (CIDACS), Gonçalo Moniz Institute, Oswaldo Cruz Foundation (FIOCRUZ), Salvador, Brazil.

²Institute of Collective Health, Federal University of Bahia (UFBA), Salvador, Brazil.

³Computer Science Department, Federal University of Bahia (UFBA), Salvador, Brazil.

⁴Statistics Department, Federal University of Bahia (UFBA), Brazil.

⁵Tropical Medicine Centre, University of Brasilia (UnB), Brazil.

⁶Escola FioCruz de Governo, FIOCRUZ Brasilia, Brazil.

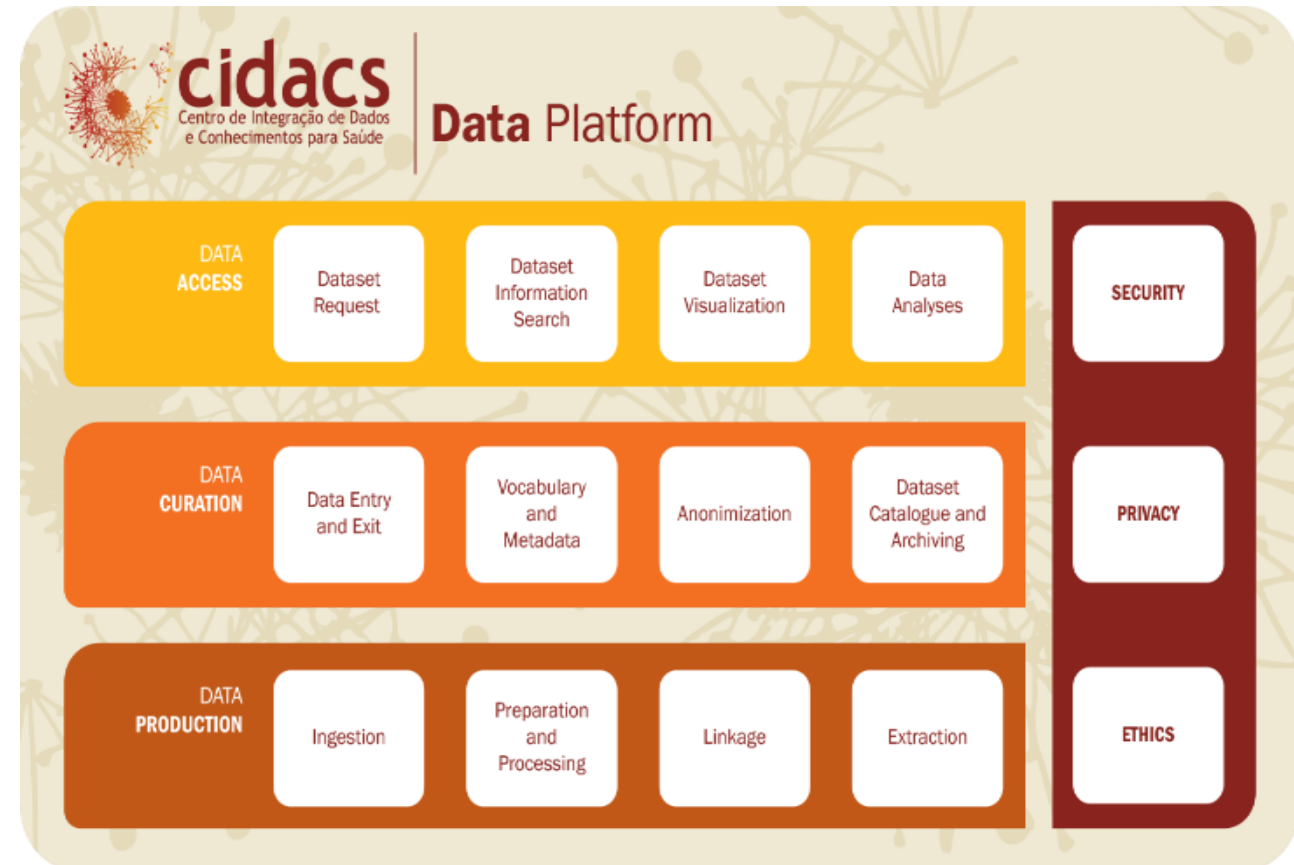
⁷Center for Statistics in Medicine, Nuffield Department of Orthopaedics, Rheumatology and Musculoskeletal Sciences, University of Oxford, Oxford, UK.

⁸Faculty of Epidemiology and Population Health, London School of Hygiene and Tropical Medicine, United Kingdom.

⁹Institute of Health Informatics, University College London, United Kingdom.

Abstract

The Centre for Data and Knowledge Integration for Health (CIDACS) was created in 2016 in Salvador, Bahia-Brazil with the objective of integrating data and knowledge aiming to answer scientific questions related to the health of the Brazilian population. This article details our experiences in the establishment and operations of CIDACS, as well as efforts made to obtain high-quality linked data while adhering to security, ethical use and privacy issues. Every effort has been made to conduct operations while implementing appropriate structures, procedures, processes and controls over the original and integrated databases in order to provide adequate datasets to answer relevant research questions. Looking forward, CIDACS is expected to be an important resource for researchers and policymakers interested in enhancing the evidence base pertaining to different aspects of health, in particular when investigating, from a nation-wide perspective, the role of social determinants of health and the effects of social and environmental policies on different health outcomes.



Data management, data governance, data ethics

International Journal of Population Data Science (2024) 9:1:06

International Journal of
Population Data Science

Journal Website: www.ijpds.org



CIDACS' efforts towards an inclusive and dialogic data governance in Brazil: a focused literature review

Bethânia de A. Almeida^{1,*}, Roberto P. Carreiro¹, Maira L. de Souza¹, and Mauricio L. Barreto¹

Submission History

| | |
|------------|------------|
| Submitted: | 29/04/2023 |
| Accepted: | 20/02/2024 |
| Published: | 12/03/2024 |

¹Centre for Data and Knowledge Integration for Health (CIDACS), Gonçalo Moniz Institute, Oswaldo Cruz Foundation (FIOCRUZ), Salvador, Bahia

Abstract

The Centre for Data and Knowledge Integration for Health's (CIDACS) data governance efforts have primarily focused on legal, technical and operational procedures to provide high-quality linked administrative data for investigations on social determinants of health and the impact of social protection policies in low-income and vulnerable populations throughout Brazil. The Centre is moving towards an updated data governance model that incorporates the participation of, and consultation and dialogue with, data stakeholders, including groups covered by our linked data. To this end, this paper presents our procedures and challenges, outlining relevant considerations based on a focused literature review that aims to support the inclusion of societal participation in our revised data governance approach, which should be considered an ongoing process.

Keywords

data governance; administrative data linkage; data subjects rights as groups and communities

- Research analysis is focused on a population perspective; however, ethical and legal standards, as well as the preservation of privacy, target individuals.
- Our data governance approach has started to address questions related to data ethics, as well as the rights of groups as data subjects.

100 Million Brazilians Cohort



International Journal of Epidemiology, 2022, e27–e38
<https://doi.org/10.1093/ije/dyab213>
 Advance Access Publication Date: 18 December 2021
 Cohort Profile

OXFORD

Cohort Profile

Cohort Profile: The 100 Million Brazilian Cohort

CIDACS' Birth Cohort



International Journal of Epidemiology, 2021, 51–59
 doi: 10.1093/ije/dyaa295
 Advance Access Publication Date: 30 December 2020
 Cohort Profile

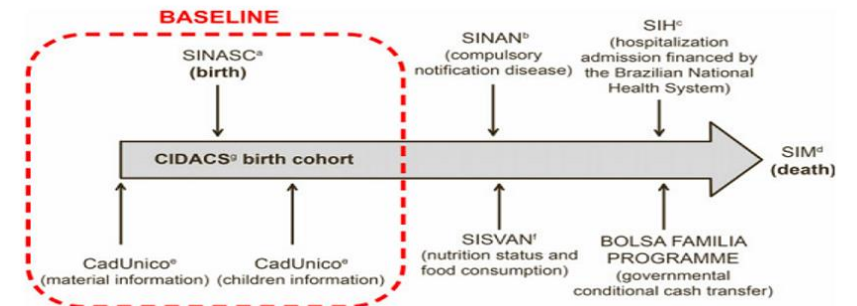
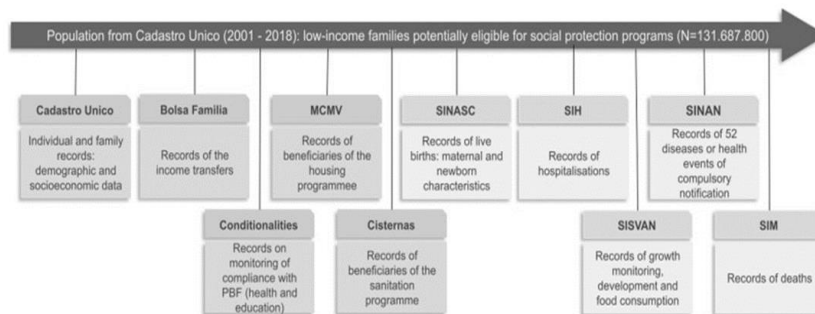


Cohort Profile

Cohort Profile: Centro de Integração de Dados e Conhecimentos para Saúde (CIDACS) Birth Cohort



Coorte de 100 milhões de brasileiros



Available at: <https://doi.org/10.1093/ije/dyab213>



DATA FOR RESEARCHING THE HEALTH OF THE MOST VULNERABLE POPULATION

The integrated data produced at CIDACS/Fiocruz Bahia as Cohorts allow investigating the most diverse health problems in vulnerable groups in the country.

Center with the **largest data resource** among all low- and middle-income countries in the world



Photo: Gabriela Carvalho



With a large data volume, the **Cidacs/Fiocruz Bahia** samples allow visualizing issues that smaller samples cannot achieve.



Data resources from a **longitudinal perspective**, that considers changes over time



Consulting in **governance** and **curation of databases** for institutions



Investigation of **health inequalities** in specific groups
Migrants, indigenous communities, homeless people, black people, and more

Comparing local levels of **social, environmental, and health inequalities**

Region of the country, state, municipality, census tract, health region, among other possibilities



Check out the **Guide for Accessing Integrated Data in Health Research**, prepared by CIDACS/Fiocruz Bahia, prepared by Cidacs/Fiocruz Bahia.

Find out more about how CIDACS links large databases to generate search results.



The 100 Million Brazilians cohort and CIDACS' Birth cohort support research initiatives in a variety of areas related to public health.

Strategic research agenda

- **Social and Environmental Determinants of Health and Health Inequalities**
- **Assessment of the Impact of Social Policies on Health**
- **Assessment of the Impact of Health Programs and Interventions**
- **Digital Surveillance and Public Health Emergencies**
- **Data Governance, Science and Society**
- **Knowledge Dissemination and Societal Engagement**

TO EVALUATE THE IMPACT OF POVERTY REDUCTION POLICIES ON HEALTH

Original Investigation | Health Policy

Participation in Conditional Cash Transfer Program During Pregnancy and Birth Weight-Related Outcomes

Ila R. Falcão, PhD; Rita de Cássia Ribeiro-Silva, PhD; Rosemeire L. Fiaccone, PhD; Flávia Jôse Oliveira Alves, PhD; Aline dos Santos Rocha, PhD; Naiá Ortelan, PhD; Natanael J. Silva, MSc; Poliana Rebouças, PhD; Elzo Pereira Pinto Júnior, PhD; Marcia Furquim de Almeida, PhD; Enny S. Paixão, PhD; Júlia M. Pescarini, PhD; Laura C. Rodrigues, PhD; Maria Yury Ichihara, PhD; Mauricio L. Barreto, PhD



American Journal of Epidemiology
© The Author(s) 2020. Published by Oxford University Press on behalf of the Johns Hopkins Bloomberg School of Public Health. This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/4.0>), which permits unrestricted reuse, distribution, and reproduction in any medium, provided the original work is properly cited.

Vol. 00, No. 00
DOI: 10.1093/aje/kwsa127
Advance Access publication:

Original Contribution

Conditional Cash Transfer Program and Leprosy Incidence: Analysis of 12.9 Million Families From the 100 Million Brazilian Cohort

Fiaccone,
Strina,
Penna, and

PLOS MEDICINE

RESEARCH ARTICLE

Relationship between the Bolsa Família national cash transfer programme and suicide incidence in Brazil: A quasi-experimental study

Daiane Borges Machado^{1,2*}, **Elizabeth Williamson**³, **Julia M. Pescarini**^{1,3}, **Flavia J. O. Alves**¹, **Luís F. S. Castro-de-Araujo**^{1,4}, **Maria Yury Ichihara**¹, **Laura C. Rodrigues**^{1,3}, **Ricardo Araya**⁵, **Vikram Patel**^{2,6}, **Maurício L. Barreto**^{1,7}

Original Investigation | Public Health

Association of Conditional Cash Transfers With Maternal Mortality Using the 100 Million Brazilian Cohort

Flávia Jôse O. Alves, PhD; Dandara Ramos, PhD; Enny S. Paixão, PhD; Ila R. Falcão, PhD; Rita de Cássia Ribeiro-Silva, PhD; Rosemeire Fiaccone, PhD; Davide Rasella, PhD; Camila Teixeira, PhD; Daiane Borges Machado, PhD; Aline Rocha, PhD; Marcia F. de Almeida, PhD; Emanuelle F. Goes, PhD; Laura C. Rodrigues, PhD; Maria Yury Ichihara, PhD; Estela M. L. Aquino, PhD; Mauricio L. Barreto, PhD

PLOS MEDICINE

RESEARCH ARTICLE

Conditional cash transfer program and child mortality: A cross-sectional analysis nested within the 100 Million Brazilian Cohort

Dandara Ramos^{1,2*}, **Nívea B. da Silva**^{1,3*}, **Maria Yury Ichihara**^{1,2}, **Rosemeire L. Fiaccone**^{1,3}, **Daniela Almeida**^{1,4}, **Samila Sena**¹, **Poliana Rebouças**^{1,2}, **Elzo Pereira Pinto Júnior**¹, **Enny S. Paixão**^{1,5}, **Sanni Ali**^{1,5}, **Laura C. Rodrigues**^{1,5}, **Maurício L. Barreto**^{1,2}

nature communications



Article

<https://doi.org/10.1038/s41467-024-44975-z>

Income determines the impact of cash transfers on HIV/AIDS: cohort study of 22.7 million Brazilians

Received: 4 September 2023

Accepted: 10 January 2024

Published online: 12 February 2024

Check for updates

Andréa F. Silva^{1,2}, **Inês Dourado**¹, **Iracema Lua**^{1,2}, **Gabriela S. Jesus**^{1,3}, **Nathalia S. Guimarães**¹, **Gabriel A. S. Morais**¹, **Rodrigo V. R. Anderle**¹, **Julia M. Pescarini**², **Daiane B. Machado**^{2,4}, **Carlos A. S. T. Santos**², **Maria Y. Ichihara**², **Mauricio L. Barreto**^{1,2}, **Laio Magno**^{1,5}, **Luis E. Souza**¹, **James Macinko**⁶ & **Davide Rasella**^{1,2,7}



Program (BFP) Impact on Child Mortality

PLOS MEDICINE

RESEARCH ARTICLE

Conditional cash transfer program and child mortality: A cross-sectional analysis nested within the 100 Million Brazilian Cohort

Dandara Ramos^{1,2}*, Nívea B. da Silva^{1,3}, Maria Yury Ichihara^{1,2}, Rosemeire L. Fiaccone^{1,3}, Daniela Almeida^{1,4}, Samila Sena¹, Poliana Rebouças^{1,2}, Elzo Pereira Pinto Júnior¹, Enny S. Paixão^{1,5}, Sanni Ali^{1,5}, Laura C. Rodrigues^{1,5}, Maurício L. Barreto^{1,2}

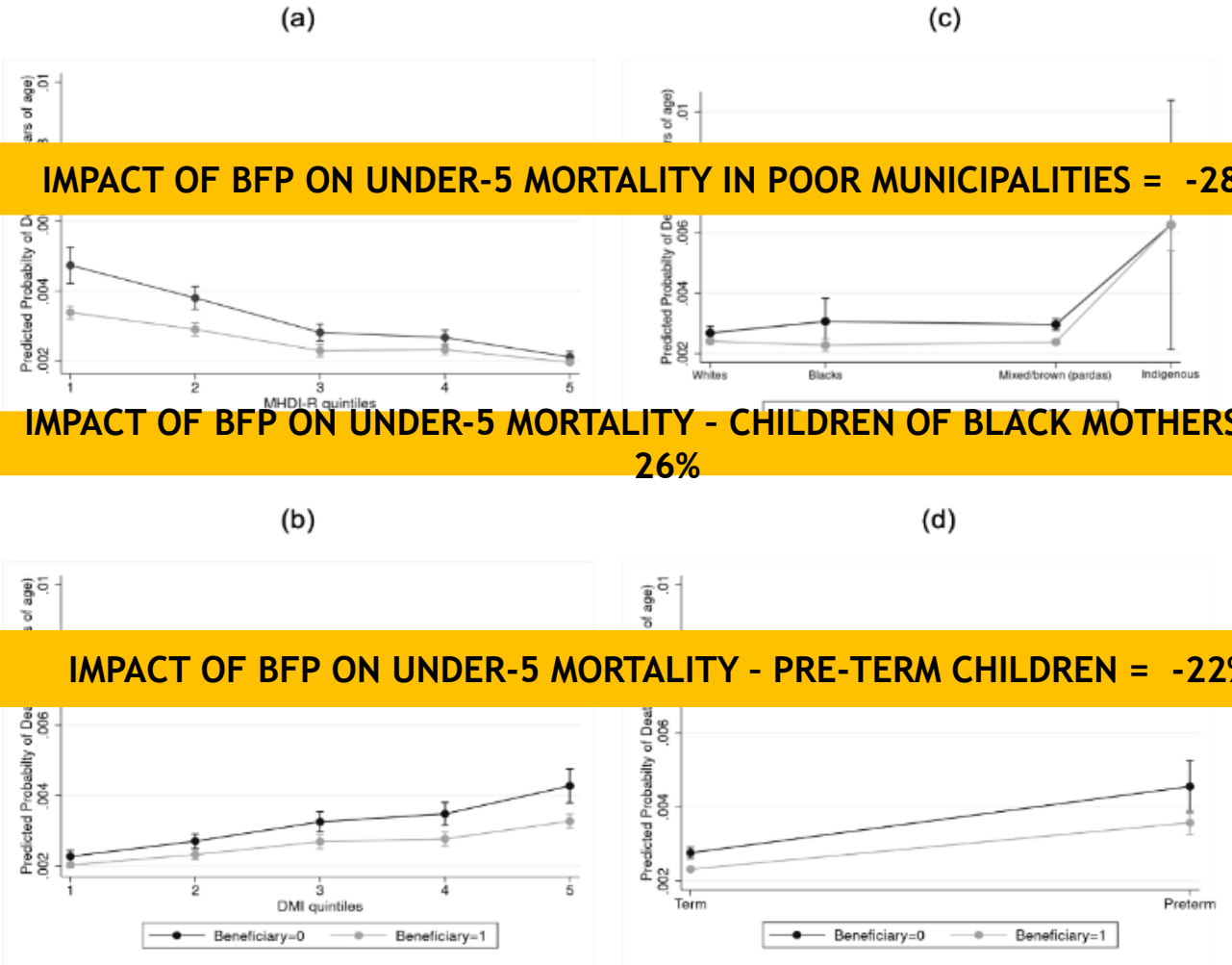
**IMPACT OF BFP ON UNDER-5 MORTALITY OVERALL
= -17%**

Participar de um programa de transferência condicionada de renda, como o Bolsa Família, **reduz em 17% a chance de mortes**

This study also observed heterogeneities in BFP effect among several subgroups

Association was stronger for:

- (a) children living in municipalities in the lowest income quintile (1st quintile of municipal income: wOR= 0.72; 95% CI: 0.62 to 0.82)
- (b) municipalities with better BFP management (5th quintile of the Decentralized management index: wOR= 0.76; 95% CI: 0.66 to 0.88)
- (c) children of Black mothers (wOR =0.74; 95% CI: 0.57 to 0.97);
- (d) preterm children (wOR =0.78; 95% CI: 0.68 to 0.90);



TO INVESTIGATE LOW-FREQUENCY BUT RELEVANT HEALTH EVENTS

THE NEW ENGLAND JOURNAL OF MEDICINE

The Lancet Regional Health - Americas 3 (2021) 100045



Contents lists available at ScienceDirect

The Lancet Regional Health - Americas

journal homepage: www.elsevier.com/locate/lanam



Research paper

Risk of mortality for small newborns in Brazil, 2011-2018: A national birth cohort study of 17.6 million records from routine register-based linked data

Enny S. Paixao, Ph.D^{1,2,*}, Hannah Blencowe, MD, Ph.D., Eric O. Ohuma, Ph.D², Aline dos Santos Rocha^{1,3}, Flávia Maria da Conceição N. Costa, MD, Ph.D^{1,4}, Lorena S.

JAMA Dermatology | Original Investigation Incidence of and Factors Associated With L... Among Household Contacts of Patients Wi...

Camila Silveira Silva Teixeira, MSc; Júlia Moreira Pescarini, PhD; Flávia José Oliveira Alves; Jolida Silva Nery, PhD; Mauro Niskler Sanchez, PhD; Carlos Teles, PhD; Maria Yury Travas; Anna Ramond, PhD; Liam Smeeth, PhD; Maria Lucia Fernandes Penna, PhD; Laura Cunha; Elizabeth B. Brickley, PhD; Gerson Oliveira Penna, PhD; Mauricio Lima Barreto, PhD;

Figure 2. Cumulative Incidence of Subsequent Leprosy Cases Among Households of Patients With Leprosy

Received: 31 August 2021 | Revised: 4 November 2021 | Accepted: 11 November 2021 | First published online: 13 December 2021
DOI: 10.1002/ijgo.14053

CLINICAL ARTICLE
Obstetrics



Recurrence of preterm births: A population-based linkage with 3.5 million live births from the CIDACS Birth Cohort

Aline S. Rocha^{1,2} | Rita de Cássia Ribeiro-Silva^{1,2} | Enny S. Paixao^{2,3} | Ila R. Falcão^{1,2} | Flávia Jôse. O. Alves^{2,4} | Naiá Ortelan² | Marcia F. de Almeida⁵ | Rosemeire L. Fiaccone^{2,6} | Laura C. Rodrigues³ | Maria Yury Ichihara² | Mauricio L. Barreto^{2,4}



Risk of death following chikungunya virus disease in the 100 Million Brazilian Cohort, 2015-18: a matched cohort study and self-controlled case series

Thiago Cerqueira-Silva, Julia M Pescarini, Luciana L Cardim, Clémence Leyrat, Heather Whitaker, Carlos Alexandre Antunes de Brito, Elizabeth B Brickley, Manoel Baral-Netto, Mauricio L Barreto, Maria G Teixeira, Viviane S Boaventura, Enny S Paixão

Summary
Background Chikungunya virus outbreaks have been associated with excess deaths at the ecological level. Previous studies have assessed the risk factors for severe versus mild chikungunya virus disease. However, the risk of death following chikungunya virus disease compared with the risk of death in individuals without the disease remains unexplored. We aimed to investigate the risk of death in the 2 years following chikungunya virus disease.

Lancet Infect Dis 2024;
24: 504-13
Published Online
February 8, 2024
[https://doi.org/10.1016/S1473-3099\(23\)00739-9](https://doi.org/10.1016/S1473-3099(23)00739-9)

ORIGINAL ARTICLE

Mortality from Congenital Zika Syndrome — Nationwide Cohort Study in Brazil

Enny S. Paixao, Ph.D., Luciana L. Cardim, Ph.D., Maria C.N. Costa, M.D., Ph.D., Elizabeth B. Brickley, Ph.D., Rita C.O. de Carvalho-Sauer, M.Sc., Eduardo H. Carmo, M.D., Ph.D., Roberta F.S. Andrade, Ph.D., Moreno S. Rodrigues, Ph.D., Rafael V. Veiga, Ph.D., Larissa C. Costa, Ph.D., Cynthia A. Moore, M.D., Ph.D., Giovanni V.A. França, Ph.D.,



Incidence and risk factors of tuberculosis among 420 854 household contacts of patients with tuberculosis in the 100 Million Brazilian Cohort (2004-18): a cohort study

o S S Teixeira, Maria Yury Ichihara, Davide Rasella, Jolida S Nery, Samila O L Sena, Elizabeth B Brickley, ro N Sanchez*, Julia M Pescarini*

LANCET
tious Diseases

Causes of death in children with congenital Zika syndrome in Brazil, 2015 to 2018: A nationwide record linkage study

Maria da Conceição N. Costa^{1,2*}, Luciana Lobato Cardim^{1*}, Cynthia A. Moore³, Eliene dos Santos de Jesus^{2,4}, Rita Carvalho-Sauer^{2,5}, Mauricio L. Barreto^{1,2}, Laura C. Rodrigues^{1,6}, Liam Smeeth⁶, Lavínia Schuler-Faccini⁷, Elizabeth B. Brickley⁶, Wanderson K. Oliveira⁸, Eduardo Hage Carmo^{1,9}, Julia Moreira Pescarini^{1,6}, Roberto F. S. Andrade^{1,10}, Moreno M. S. Rodrigues¹, Rafael V. Veiga¹, Larissa C. Costa¹, Giovanni V. A. França⁹, Maria Gloria Teixeira^{1,2†}, Enny S. Paixão^{1,6†*}

1 Center of Data and Knowledge Integration for Health (CIDACS), Gonçalo Moniz Institute, Oswaldo Cruz Foundation, Salvador, Bahia, Brazil. 2 Collective Health Institute, Federal U University of Bahia, Salvador



ORIGINAL ARTICLE

Mortality from Congenital Zika Syndrome
— Nationwide Cohort Study in Brazil

Enny S. Paixão, Ph.D., Luciana L. Cardim, Ph.D., Maria C.N. Costa, M.D., Ph.D., Elizabeth B. Brickley, Ph.D., Rita C.O. de Carvalho-Sauer, M.Sc., Eduardo H. Carmo, M.D., Ph.D., Roberto F.S. Andrade, Ph.D., Moreno S. Rodrigues, Ph.D., Rafael V. Veiga, Ph.D., Larissa C. Costa, Ph.D., Cynthia A. Moore, M.D., Ph.D., Giovanni V.A. França, Ph.D., Liam Smeeth, M.D., Ph.D., Laura C. Rodrigues, M.D., Ph.D., Mauricio L. Barreto, M.D., Ph.D., and Maria G. Teixeira, M.D., Ph.D.

ABSTRACT

BACKGROUND

Prenatal exposure to Zika virus has potential teratogenic effects, with a wide spectrum of clinical presentation referred to as congenital Zika syndrome. Data on survival among children with congenital Zika syndrome are limited.

METHODS

In this population-based cohort study, we used linked, routinely collected data in Brazil, from January 2015 through December 2018, to estimate mortality among live-born children with congenital Zika syndrome as compared with those without the syndrome. Kaplan–Meier curves and survival models were assessed with adjustment for confounding and with stratification according to gestational age, birth weight, and status of being small for gestational age.

RESULTS

A total of 11,481,215 live-born children were followed to 36 months of age. The mortality rate was 52.6 deaths (95% confidence interval [CI], 47.6 to 58.0) per 1000 person-years among live-born children with congenital Zika syndrome, as compared with 5.6 deaths (95% CI, 5.6 to 5.7) per 1000 person-years among those without the syndrome. The mortality rate ratio among live-born children with congenital Zika syndrome, as compared with those without the syndrome, was 11.3 (95% CI, 10.2 to 12.4). Among infants born before 32 weeks of gestation or with a birth weight of less than 1500 g, the risks of death were similar regardless of congenital Zika syndrome status. Among infants born at term, those with congenital Zika syndrome were 14.3 times (95% CI, 12.4 to 16.4) as likely to die as those without the syndrome (mortality rate, 38.4 vs. 2.7 deaths per 1000 person-years). Among infants with a birth weight of 2500 g or greater, those with congenital Zika syndrome were 12.9 times (95% CI, 10.9 to 15.3) as likely to die as those without the syndrome (mortality rate, 32.6 vs. 2.5 deaths per 1000 person-years). The burden of congenital anomalies, diseases of the nervous system, and infectious diseases as recorded causes of deaths was higher among live-born children with congenital Zika syndrome than among those without the syndrome.

CONCLUSIONS

The risk of death was higher among live-born children with congenital Zika syndrome than among those without the syndrome and persisted throughout the first 3 years of life. (Funded by the Ministry of Health of Brazil and others.)

From the London School of Hygiene and Tropical Medicine, London (E.S.P., E.B.B., L.S., L.C.R.); the Center of Data and Knowledge Integration for Health, Gonçalo Moniz Institute, Oswaldo Cruz Foundation (E.S.P., L.L.C., M.C.N.C., E.H.C., R.F.S.A., M.S.R., R.V.V., L.C.C., L.C.R., M.L.B., M.G.T.), and Instituto de Saúde Coletiva, Federal University of Bahia (M.C.N.C., M.L.B., M.G.T.), Salvador, the East Regional Health Center of the State Health Secretariat of Bahia, Santo Antonio-de-Jesus (R.C.O.C.-S.), and the Secretariat of Health Surveillance, Ministry of Health, Brasília (G.V.A.F.) — all in Brazil; and the Division of Birth Defects and Infant Disorders, National Center on Birth Defects and Developmental Disabilities, Centers for Disease Control and Prevention, Atlanta (C.A.M.). Dr. Paixão can be contacted at eney.paixao@lshtm.ac.uk or at the London School of Hygiene and Tropical Medicine, Keppel St., London WC1E 7HT, United Kingdom.

Drs. Paixão and Cardim and Drs. Barreto and Teixeira contributed equally to this article.

N Engl J Med 2022;386:757–67.
DOI: 10.1056/NEJMoa2101195
Copyright © 2022 Massachusetts Medical Society.

DATA TO INVESTIGATE RARE BUT RELEVANT HEALTH EVENTS

Large sample sizes allow several analytical advantages, such as the analysis of rare events that are not possible in studies that rely on small sample size.



11.5 million live births, of which, **3,308** babies born with confirmed or probable CZS.



Babies born with CZS were at **>11x greater risk** of death during first three years of life than those born without.

TO INVESTIGATE HEALTH INEQUALITIES

Ethno-racial inequalities on adverse birth and neonatal outcomes: a nationwide, retrospective cohort study of 21 million Brazilian newborns

Poliana Rebouças,^{1,*} Enny S. Paixão,^{1,2} Dandara Ramos,^{1,3} Julia Pescarini,³ Elzo Pereira Pinto-Junior,³ Ila R. Falcão,³ Maria Yury Ichihara,⁴ Samila Sena,⁴ Rafael Veiga,⁴ Rita Ribeiro,^{4,5} Laura C. Rodrigues,⁵ Maurício L. Barreto,^{4,6} and Emanuelle F. Goes^{4,6}

¹Center for Data and Knowledge Integration for Health (CIDACS), Gonçalves Moniz Institute, Oswaldo Cruz Foundation, Salvador, Bahia, Brazil

²Maternal, Adolescent, Reproductive & Child Health (MARCH) Centre, London School of Hygiene & Tropical Medicine, London, UK

³Faculty of Epidemiology and Population Health, London School of Hygiene & Tropical Medicine, London, UK

ETHNICITY & HEALTH
2024, VOL. 29, NO. 1, 46–61
<https://doi.org/10.1080/13557858.2023.2245183>



OPEN ACCESS

The intersection of race/ethnicity and socioeconomic status: inequalities in breast and cervical cancer mortality in 20,665,005 adult women from the 100 Million Brazilian Cohort

Emanuelle F. Góes^{1,*}, Joanna M. N. Guimarães^{2,3}, Maria da Conceição C. Almeida⁴, Lígia Gabrielli^{5,6}, Srinivasa Vittal Katikireddi⁷, Ana Clara Campos⁸, Sheila M. Alvim Matos⁹, Ana Luísa Patrão¹⁰, Ana Cristina de Oliveira Costa⁹, Manuela Quaresma¹¹, Alastair H. Leyland¹², Maurício L. Barreto^{13,14}, Isabel dos-Santos-Silva^{15,16} and Estela M. L. Aquino^{17,18}

Breast Matos et al. BMC Public Health (2024) 24:103
<https://doi.org/10.1186/s12874-024-04550-3>

Ethnoracial disparities in childhood growth trajectories in Brazil: a longitudinal nationwide study of four million children

Helena Benes Matos, da Silva^{1,2*}, Rita de Cássia Ribeiro-Silva^{1,2}, Juliana Freitas de Mello e Silva³, Irina Chis Ster⁴, Poliana Rebouças⁵, Emanuelle Goes⁶, Maria Yury Ichihara⁷, Andréa Ferreira⁸, Julia M. Pescarini⁹, Dandara Ramos¹⁰, Elzo Pereira Pinto-Junior¹¹, Ila R. Falcão¹² and Maurício L. Barreto¹³



The Lancet Regional Health - Americas
2024;37: 100833
Published Online xxx
<https://doi.org/10.1016/j.lana.2024.100833>

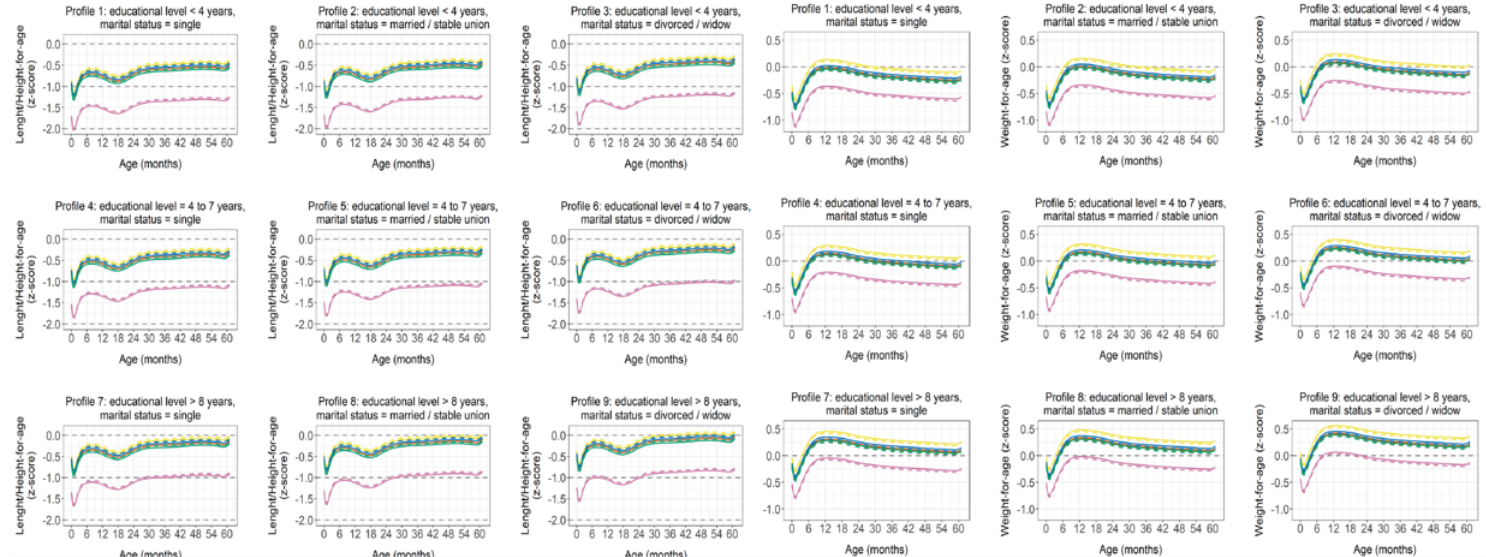
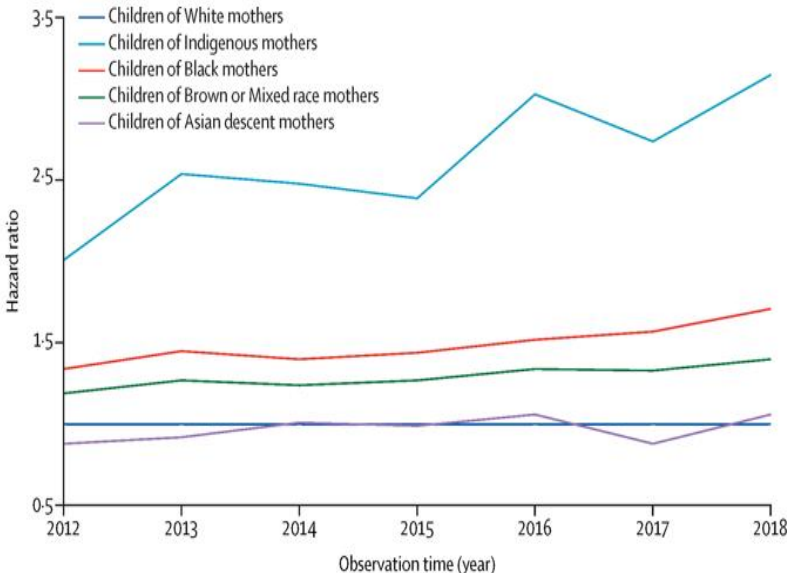
THE LANCET
Global Health

ARTICLES | VOLUME 10, ISSUE 10, E1453-E1462, OCTOBER 01, 2022

Ethnoracial inequalities and child mortality in Brazil: a nationwide longitudinal study of 19 million newborn babies

Poliana Rebouças, PhD, Emanuelle Goes, PhD, Julia Pescarini, PhD, Dandara Ramos, PhD, Maria Yury Ichihara, PhD, Samila Sena, MSc, Rafael Veiga, PhD, Laura C Rodrigues, PhD, Prof Maurício L Barreto, MD PhD, Enny S Paixão, PhD

Open Access • Published: October, 2022 • DOI: [https://doi.org/10.1016/S2214-109X\(22\)00333-3](https://doi.org/10.1016/S2214-109X(22)00333-3)



LANGU-D-23-00410R3
S2214-109X(23)00405-9
Embargo: [add date when known]
Doctopic: Primary Research

23tgh0410
Articles
Poppy C
This version saved: 10:41, 05-Sep-23

Maternal and congenital syphilis attributable to ethnoracial inequalities: a national record-linkage longitudinal study of 15 million births in Brazil

Enny S Paixão¹, Andréa F Ferreira², Julia M Pescarini³, Kerry L M Wong⁴, Emanuelle Goes⁵, Rosemeire Fiaccone⁶, Guilherme Lopes de Oliveira⁷, Poliana Rebouças⁸, Andrey Moreira Cardoso⁹, Liam Smeeth¹⁰, Maurício L Barreto¹¹, Laura C Rodrigues¹², Maria Yury Ichihara¹³

Summary
Background This study estimated ethnoracial inequalities in maternal and congenital syphilis in Brazil, understanding race as a relational category product of a sociopolitical construct that functions as an essential tool of racism and its manifestations.

Methods We linked routinely collected data from Jan 1, 2012 to Dec 31, 2017 to conduct a population-based study in Brazil. We estimated the attributable fraction of race (skin colour) for the entire population and specific subgroups compared with White women using adjusted logistic regression. We also obtained the attributable fraction of the intersection between two social markers (race and education) and compared it with White women with more than 12 years of education as the baseline.

Findings Of 15 810 488 birth records, 144 564 had maternal syphilis and 79 580 had congenital syphilis. If all women had the same baseline risk as White women, 35% (95% CI 34.89–36.10) of all maternal syphilis and 41% (40.49–42.09) of all congenital syphilis would have been prevented. Compared with other ethnoracial categories, these percentages were higher among Dark/Brown women (166% (14.74–17.70) of maternal syphilis and 166% (14.74–17.70) of congenital syphilis).



Lancet Glob Health 2023
*Contributed equally
Department of Infectious Disease Epidemiology and International Health, London School of Hygiene & Tropical Medicine, London, UK
(E S Paixão PhD, J M Pescarini PhD, K L M Wong PhD, L S Smeeth PhD, L C Rodrigues MD, Centro de Integração de Dados e Condições para Saúde, Brasília, Brazil)
(J F Ferreira PhD, E Goes PhD, M Sena PhD, M Yury Ichihara PhD, Center for Data and Knowledge Integration for Health (CIDACS), Oswaldo Cruz Foundation, Salvador, Bahia, Brazil)
(A H Leyland PhD, Institute of Public Health, PA, USA)
(I Chis Ster PhD, Instituto de Estatística, Federal de Bahia, Brazil)
(C M de Mello e Silva PhD, Centro Federal de Educação Tecnológica de Minas Gerais, Belo Horizonte, Brazil)

BMC Pediatrics

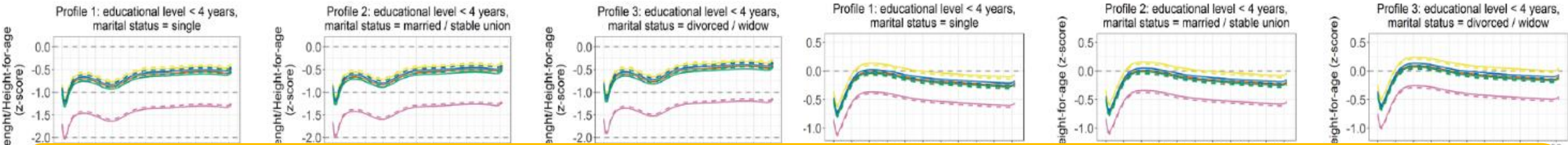
Open Access

RESEARCH

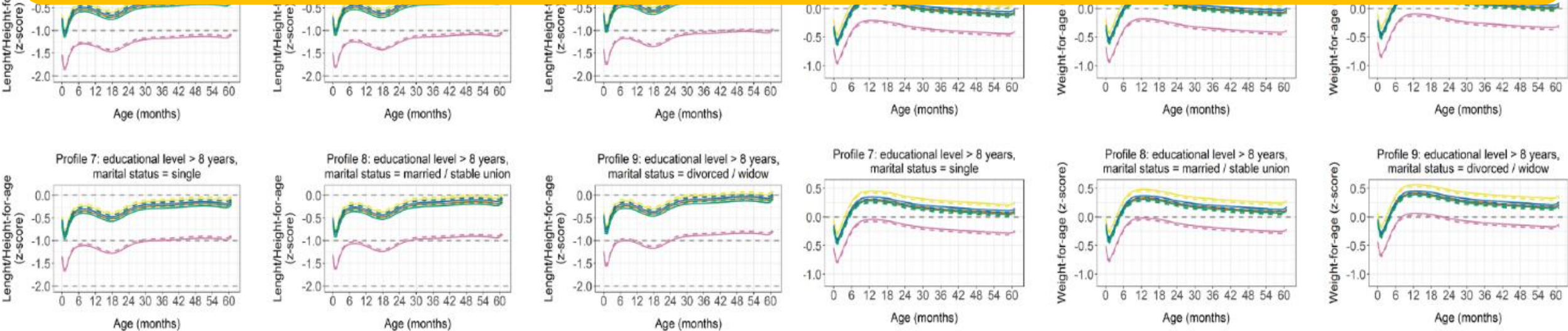
Open Access

Ethnoracial disparities in childhood growth trajectories in Brazil: a longitudinal nationwide study of four million children

Helena Benes Matos da Silva^{1,2*}, Rita de Cássia Ribeiro-Silva^{1,2}, Juliana Freitas de Mello e Silva^{1*}, Irina Chis Ster³, Poliana Rebouças², Emanuelle Goes², Maria Yury Ichihara², Andréa Ferreira^{2,4}, Julia M. Pescarini⁵, Rosemeire Leovigildo Fiaccone⁶, Enny S. Paixão⁷ and Maurício L. Barreto⁸



Children born to indigenous mothers were on average 3.3 cm (95% CI: -3.36, -3.27) shorter than their white counterparts.



Mother's race / skin color — White — Asian descent — Black — Pardo — Indigenous Sex — boys — girls

Mother's race / skin color — White — Asian descent — Black — Pardo — Indigenous Sex — boys — girls

Fig. 5 Estimated mean curves for length/height-for-age z-scores, according to mother's age, educational level, and marital status. Brazil, 2008–2017

Fig. 4 Estimated mean curves for weight-for-age z-scores model, according to mother's age, educational level, and marital status. Brazil, 2008–2017

Platform to study environmental and climate effects on health



Objective 3. Expand and update the 100 Million Brazilian and CIDACS Birth Cohorts and develop the CIDACS Climate and Environmental Platform

- Extend and expand the geocoding of data in the 100 Million Brazilian and CIDACS Birth Cohorts
- Update the the 100 Million Brazilian and CIDACS Birth Cohorts to include new data up to 2023.
- Develop a fully functional CIDACS Climate and Environmental Platform
 - Hydrometeorological, reanalysis, and satellite imagery data

21.09
2023
10:00

LANÇAMENTO

cidacsClima
Plataforma de Dados Climáticos,
Ambientais e de Saúde

PARTICIPACÕES:
Mário Moreira (Presidente da Fiocruz),
Agnes Soares (Diretora de Saúde Ambiental e do Trabalhador-MS),
Liam Smeeth (Diretor da London School of Hygiene and Tropical Medicine),
Ronaldo Oliveira (Pró-reitor PRPPG-UFBA),
Maurício Barreto (Cidacs/Fiocruz - Ba)
e muito mais!

PALESTRA
QUAIS OS DESAFIOS DA QUESTÃO CLIMÁTICA GLOBAL NO BRASIL?
Paulo Artaxo (USP)

LINK ZOOM
bit.ly/CidacsPlataformaClima



Plataforma de dados climáticos ambientais no CIDACS: Exemplos

| Dados medidos in situ pelo INMET | Modelo de Reanálise ERA 5 LAND | Modelo de Reanálise VAN DONKELLAR | MAPBIOMAS |
|---|---|---|---|
| Período: 2000-presente (diário). Download: município e UF. Variáveis: • Temperatura: max - média - ponto orvalho • Precipitação Total • Vel e direção do vento • Pressão à Superfície • Umidade Relativa | Período: 2000-presente (diário). Download: município e UF. Variáveis: • Temperatura: max - média - ponto orvalho • Precipitação Total • Comp do vento: u e v • Pressão à Superfície • Umidade Relativa | Período: 2000-presente (mensal). Download: município e UF. Modelo: V5GL01.HybridPM25 Variável: • PM2.5 • NO2 | Período: 2000-presente (mensal/annual). Download: município e UF. Variáveis: • Uso e ocupação do solo • Cicatriz de fogo • Cobertura de água |
| | | | |



Agnes Soares, coordenadora geral de Vigilância em Saúde Ambiental do Ministério da Saúde



Final considerations

- CIDACS' central mission entails generating scientific knowledge and providing evidence to support public policymaking to tackle health inequalities and other major challenges the Brazilian population faces.
- CIDACS has faced and overcome many challenges in producing scientific knowledge and evidence using integrated data.
- Overcoming these challenges requires the collective efforts of an interdisciplinary team and the development of in-house solutions, including customized data infrastructure, linkage algorithms, data acquisition processes, and analytical strategies.



Obrigado!

Thank you!

COLABORADORES CIENTÍFICOS:



APOIADORES:



Parque Tecnológico da Bahia
Rua Mundo, 121, Trobogy
Salvador - Ba, CEP 41745-715



www.cidacs.bahia.fiocruz.br
cidacs@bahia.fiocruz.br

