Multimorbidity matters in low and middle-income countries

Ana Basto-Abreu¹, Tonatiuh Barrientos-Gutierrez¹, Alisha N Wade², Daniela Oliveira de Melo³, Ana S Semeão de Souza⁴, Bruno P Nunes⁵, Arokiasamy Perianayagam⁶, Maoyi Tian⁷, Lijing L Yan⁴⁹, Arpita Ghosh¹¹,¹²,¹³ and J Jaime Miranda¹⁴,¹⁵,¹⁶

Abstract
Multimorbidity is a complex challenge affecting individuals, families, caregivers, and health systems worldwide. The burden of multimorbidity is remarkable in low- and middle-income countries (LMICs) given the many existing challenges in these settings. Investigating multimorbidity in LMICs poses many challenges including the different conditions studied, and the restriction of data sources to relatively few countries, limiting comparability and representativeness. This has led to a paucity of evidence on multimorbidity prevalence and trends, disease clusters, and health outcomes, particularly longitudinal outcomes. In this paper, based on our experience of investigating multimorbidity in LMICs contexts, we discuss how the structure of the health system does not favor addressing multimorbidity, and how this is amplified by social and economic disparities and, more recently, by the COVID-19 pandemic. We argue that generating epidemiologic data around multimorbidity with similar methods and definition is essential to improve comparability, guide clinical decision-making and inform policies, research priorities, and local responses. We call for action on policy to refinance and prioritize primary care and integrated care as the center of multimorbidity.

¹Center for Population Health Research, National Institute of Public Health, Cuernavaca, Mexico
²MRC/Wits Rural Public Health and Health Transitions Research Unit, School of Public Health, Faculty of Health Sciences, University of the Witwatersrand, Johannesburg, South Africa
³Department of Pharmaceutical Sciences, Universidade Federal de São Paulo, São Paulo, Brazil
⁴Institute of Social Medicine, State University of Rio de Janeiro, Rio de Janeiro, Brazil
⁵Department of Nursing in Public Health, Universidade Federal de Pelotas, Pelotas, Brazil
⁶International Institute for Population Sciences, Mumbai, India
⁷The George Institute for Global Health, Faculty of Medicine and Health, University of New South Wales, Sydney, NSW, Australia
⁸School of Public Health, Harbin Medical University, Harbin, China
⁹Global Health Research Center, Duke Kunshan University, Kunshan, China
¹⁰School of Health Sciences, Wuhan University, Wuhan, China
¹¹The George Institute for Global Health, New Delhi, India
¹²Manipal Academy of Higher Education, Manipal, India
¹³University of New South Wales, Sydney, NSW, Australia
¹⁴CRONICAS Centre of Excellence in Chronic Diseases, Universidad Peruana Cayetano Heredia, Lima, Peru
¹⁵Department of Medicine, School of Medicine, Universidad Peruana Cayetano Heredia, Lima, Peru
¹⁶Faculty of Epidemiology and Population Health, London School of Hygiene and Tropical Medicine, London, UK

Corresponding authors:
Ana Basto-Abreu, Center for Population Health Research. National Institute of Public Health, Avenida Universidad 655, Santa Maria Ahuacatitlán, Cuernavaca 62100, Mexico. Email: ana.basto@insp.mx
J Jaime Miranda, CRONICAS Centre of Excellence in Chronic Diseases, Universidad Peruana Cayetano Heredia, Av. Armendáriz 445, Miraflores, Lima 15074, Peru. Email: Jaime.Miranda@upch.pe
Introduction

Multimorbidity is defined as the co-existence of two or more chronic diseases. The topic has been gaining momentum for population health as populations age and the prevalence of physical and mental conditions increases. Most clinical practices and public health responses emphasize a single-disease approach, ignoring that many diseases share common risk factors and manifest jointly. Multimorbidity increases the clinical complexity of cases and the need for polypharmacy, hindering treatment and increasing the likelihood of poor health outcomes.

The multimorbidity challenge for low- and middle-income countries (LMICs) is high. The burden of chronic non-communicable diseases (NCDs) in LMICs is already large, due to the rapid urban, nutrition, and epidemiological transitions, which are superimposed on fragile health and social protection systems. These are further exacerbated by external factors such as the very limited international aid available for combating NCDs, the commercial determinants of health, and climate change. Public health and health systems in LMICs need to swiftly and effectively adapt to accommodate this challenge.

Measuring multimorbidity is not simple. A scoping review in LMICs showed multimorbidity prevalence among adults 18 or older ranged from 3.2% to 67.8%. The authors discussed marked differences between studies in defining and measuring multimorbidity and that most evidence in LMICs comes from a few countries: Brazil, China, South Africa, India, Mexico, and Iran. Meta-analytic evidence showed a multimorbidity prevalence of 30% for LMICs and 43% for Latin America and the Caribbean. Table 1 provides a summary of selected publications addressing multimorbidity in LMICs highlighting the heterogeneity of prevalence estimates and different methodologies employed. The studies were selected to place emphasis on methodological differences such as age groups, representativeness, number of conditions included, and how diseases were measured.

Building upon previous works and first-hand experience with LMIC contexts across all world regions, in this paper, we aim to discuss five characteristics of the uniqueness of the challenge of multimorbidity in LMICs, the methodological limitations of measuring multimorbidity in LMIC, and advance the debate by signaling future directions.

Why does multimorbidity matter for low- and middle-income countries?

Double burden of diseases

Low- and middle-income countries are experiencing a rapid increase in the prevalence of obesity and NCDs, while infectious diseases and undernutrition remain important burdens. In 2019, the three leading causes of death in LMICs were non-communicable diseases, that is, cardiovascular disease, neoplasms, and chronic respiratory, followed by communicable diseases: respiratory and enteric infections. This double burden of infectious and non-infectious diseases represents a challenge for population health and health systems in LMICs.

The rapid increase in chronic diseases

Comparing to high-income countries, the burden of NCDs in LMICs is not only increasing at a higher pace but also occurring at younger ages. Behavioral risks in LMICs, such as consuming high volumes of ultra-processed foods are increasing across all ages, but more so in adolescents and young adults, increasing the burden of NCDs in these age groups. Early appearance of chronic conditions, paired with poor treatment and care, results in the development of new conditions and complications, thus heavily impacting the mortality risk of LMICs populations. As NCDs are occurring on average at younger ages, multimorbidity also appears sooner, reducing quality of life, life expectancy, and productivity.

Health systems are not designed to deal with multimorbidity

Many health systems in LMICs remain fragmented, have limited resources and infrastructure, and remain unable to cope with multimorbidity. Primary care is poorly financed and the health system often fails to timely diagnose and manage chronic disease progression. Systems designed primarily for reactive acute care persist, resulting in a lack of continuity of care for most chronic conditions, perhaps except for some chronic infectious diseases such as HIV. As in high-income countries, health systems are designed to treat individual conditions, resulting in an inefficient model of care that promotes multiple visits to multiple health care providers. These deficiencies discourage patients to seek care and many diseases progress towards disease-related
Table 1. Summary of selected publications addressing multimorbidity in low- and middle-income countries.

| Country          | Prevalence, % | Age group | Year    | Representativeness | Number and type of diseases considered                                                                 | How diseases were measured                                                                 |
|------------------|---------------|-----------|---------|--------------------|------------------------------------------------------------------------------------------------------|------------------------------------------------------------------------------------------|
| El Salvador      | 15.5          | 18+       | 2013/14 | National           | 8 diseases: arthritis, asthma, cancer (any type), depression, diabetes, heart disease, hypertension, and high cholesterol | Self-reported                                                                                         |
| Panamá           | 18.3          | 18+       | 2014/15 | Regional           | >9 diseases: diabetes, AMI, stroke, hypertension, asthma, high cholesterol, hypothyroidism, celiac disease and cancer and other chronic diseases (do not mention which) | Biomarkers, self-reported data (diagnostic or taking medications)                              |
| Jamaica          | 25.1          | 18+       |         | Within-country     | 12 diseases: alcohol disorder, asthma, chronic bronchitis, COPD, depression, gastroesophageal reflux, heart disease, hypertension, lung cancer, peripheral artery disease, stroke, and diabetes | Biomarkers, self-reported data (diagnostic or taking medications)                              |
| Brazil           | 16.8          | 18+       |         | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| Mexico           | 14.4          | 18+       |         | National           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| Colombia         | 12.4          | 18+       |         | Regional           | 12 diseases: angina, arthritis, cataract, COPD, depression, diabetes, edentulism, hypertension, cognitive impairment, obesity, and stroke | Self-reported data (diagnosis) or symptom-based algorithms or measurements                         |
| Argentina        | 33.1          | 18+       | 2014/15 | Regional           | >9 diseases: diabetes, AMI, stroke, hypertension, asthma, high cholesterol, hypothyroidism, celiac disease and cancer and other chronic diseases (do not mention which) | Biomarkers, self-reported data (diagnostic or taking medications)                              |
| Peru             | 19.1          | 35+       | 2013/14 | Regional           | 12 diseases: alcohol disorder, asthma, chronic bronchitis, COPD, depression, gastroesophageal reflux, heart disease, hypertension, lung cancer, peripheral artery disease, stroke, and diabetes | Biomarkers, self-reported data (diagnostic or taking medications)                              |
| China            | 45.1          | 50+       | 2008/10 | National           | 12 diseases: angina, arthritis, cataract, COPD, depression, diabetes, edentulism, hypertension, cognitive impairment, obesity, and stroke | Self-reported data (diagnosis) or symptom-based algorithms or measurements                         |
| Ghana            | 48.3          | 60+       | 2007/08 | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| India            | 57.9          | 60+       | 2007/08 | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| Mexico           | 63.9          | 60+       | 2010    | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| South Africa     | 63.4          | 60+       | 2007/08 | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| Russia           | 71.9          | 60+       | 2007/10 | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |
| Bogotá           | 40.0          | 60+       | 2012    | Regional           | 11 diseases: hypertension, diabetes, cancer, COPD, heart attack, heart failure, stroke, arthritis, osteoporosis, gastroesophageal reflux disease, gastritis, and ulcer | Self-reported                                                                                         |

AMI: acute myocardial infarction; COPD: Chronic obstructive pulmonary disease.
All studies use the multimorbidity definition as two or more diseases.
complications. These factors all contribute to premature morbidity and mortality.\textsuperscript{50,41} Evidence shows that health system demands are higher in people with multimorbidity. In Brazil, having more than one disease increased the health services utilization by 46\% in men and by 39\% in women, and hospitalizations by 55\% in men and by 45\% in women in comparison with zero or one disease.\textsuperscript{42} The higher utilization of health services will require countries to adapt towards ensuring access to high-quality health services and integrated people-centered care for people with multimorbidity. Health services need to be tailored to people’s needs and provided in cooperation with them, their families, and communities. Health services need to engage, respect, and support people with multimorbidity, particularly considering the chronicity of many of these conditions and the need for long-term follow-up. The WHO Framework on integrated people-centered health services (IPCHS) was approved in 2016 and calls for a fundamental shift in the way health services are funded, managed, and delivered.\textsuperscript{43,44}

Existing clinical practice guidelines (CPG) do little to address the care of individuals with multimorbidity. Clinical practice guidelines are usually developed with a single disease approach, but patients with multimorbidity have different clinical profiles, different clusters of diseases and complex needs, hindering the design of standardized approaches of care. In high-income countries, CPGs have been developed to guide the management of multimorbidity, such as the one proposed by the National Institute for Clinical and Care Excellence,\textsuperscript{45} but they are generic documents about the principles of care. Indeed, multiple studies question the ability of current CPGs to guide the care of individuals with complex multimorbidity in HIC, while no evidence from LMICs exists.\textsuperscript{46–50} Current CPGs may be inappropriate for LMICs settings and may lead to poor quality of care, failing to address the complexity of therapeutic schemes to manage multimorbidity.

### Social disparities in multimorbidity

The contextual effects of multimorbidity are especially evident in LMIC where they reinforce the mechanisms that cause poverty and perpetuate the poverty cycle.\textsuperscript{51,52} Individuals in low socio-economic groups frequently have greater exposure to NCD risk factors such as air pollution and poor nutrition, and limited opportunities to engage in preventive efforts including physical activity.\textsuperscript{17–20} This is compounded by weak social protection systems, which means individuals are less able to withstand significant health care expenditure, paired with a limited agency to forego income-generating activities and an inability to negotiate time to attend to health care needs.\textsuperscript{53,54} For individuals in the lowest socioeconomic strata, the highest burden of multimorbidity is observed at the household level, with financial and non-financial costs transferred to families in the form of out-of-pocket expenditure to cover health services, as well as the invisible non-remunerated and emotional costs of caregiving largely provided by family members.\textsuperscript{54–56}

### COVID and multimorbidity

The COVID-19 pandemic, in combination with health inequalities and limited access to healthcare systems, is increasing the burden of multimorbidity and decreasing the quality of life of people with multimorbidity in LMICs. On one hand, multimorbidity increases the risk of developing COVID-related complications; on the other hand, the epidemic itself has magnified the problems for preventing and managing multimorbidity.\textsuperscript{57–59} The COVID-19 pandemic has been disrupting the existing fragmented health system, adding another layer of burden to the routine management of the multimorbidity. We are observing an increase in underdiagnoses and undertreatment of NCDs, a reduction in the availability of medicines, prescriptions, and routine check-ups in a timely manner,\textsuperscript{60} and an increasing burden of mental health problems.\textsuperscript{61,62}

Both multimorbidity and COVID-19 are linked to socioeconomic characteristics,\textsuperscript{62–64} augmenting the challenges faced in dealing with multimorbidity alone. For example, women with multimorbidity adhered more to social isolation than men,\textsuperscript{65} and reducing mobility was estimated to reduce incidences of COVID-19 in Latin America.\textsuperscript{66} Taking this observation one step further, in Chile, people living in low-income municipalities adhered less to social isolation and reduced less their mobility than people living in high-income municipalities. As a result, mortality was higher among people in low socioeconomic status.\textsuperscript{64} If we were to consider the burden of the treatment framework applied to persons living with multimorbidity,\textsuperscript{67,68} additional insights are needed into the multiple failures in protecting the population health.\textsuperscript{65,69}

Patients with multimorbidity have a higher risk of COVID-19 complications and death than those without diseases.\textsuperscript{57} A study in Mexico showed a higher risk of mortality from COVID-19 in multimorbidity patients, especially among younger adults.\textsuperscript{58} Compared to disease-free individuals of the same age group, adults aged 20–39 years with multimorbidity had 8.2 times higher risk of death, and adults aged 40–59 years had 2.8 times higher risk of death. Another study showed that multimorbidity contributed to 28\% of hospitalizations and 36\% of deaths from COVID-19 in Mexico,\textsuperscript{58} suggesting that multimorbidity significantly increases the population susceptibility to the pandemic.
How is multimorbidity measured and why is it imperfect?

Multimorbidity estimations are difficult to compare due to different definitions, different conditions included and different contexts. Multimorbidity is generally defined as the presence of two or more chronic diseases, but controversies around the definition remain. Other definitions include the coexistence of physical and mental health conditions, or three or more diseases affecting different body systems, referred to as “complex multimorbidity.” The lack of a harmonized definition has created difficulties to compare multimorbidity data across studies and explore its impact. The number and types of conditions included also reduces comparability between studies. For example, studies including intermediate cardiovascular risk factors such as obesity, dyslipidemia, or age-related diseases such as cataracts show a high prevalence of multimorbidity. Finally, the context of multimorbidity studies make comparisons difficult. Prevalence estimates can be lower in population-based studies than in hospital settings, as observed in the study in rural and urban Peruvian sites.

Misclassification of diseases included in multimorbidity remains problematic. Disease determination may differ from study to study and is usually assessed using self-report, medication usage, or biological measurements. Using objective approaches to ascertain multimorbidity in LMICs has the intrinsic trade-off that conditions are objectively assessed. Using self-reported data to ascertain multimorbidity will underestimate its prevalence as a high proportion of chronic diseases are undiagnosed in LMICs. In Mexico, for example, 30% of individuals with diabetes and 40% of those with hypertension are unaware of their diagnosis, and rates of unawareness for major chronic conditions in LMICs are generally high. The use of prescribed medications is limited due to reporting bias: patients may be unaware of what medications they are taking and they may also be used for more than one indication. Biomarker measurements, while robust, may be expensive and difficult to access in some settings. On a related topic, whilst the study of multimorbidity in high-income countries leverages the availability of electronic medical records, these are not necessarily the norm in LMICs.

Multimorbidity estimations do not account for different combinations of conditions or severity of diseases, being inappropriate to determine the level of care required, a crucial question in LMIC. Some indices, such as the Charlson Index, predict survival in patients with multiple comorbidities, by assigning weighted scores to different conditions that account for disease severity or survival. Multimorbidity indices are relevant to tailor clinical care responses, but having the level of disaggregation of multiple diseases at the population level is challenging. Also, little is known about the performance of these indices in LMIC settings.

Call to action

We have outlined the challenges of multimorbidity on LMICs and the deficiencies in its assessment and reporting. Improvement in multimorbidity-associated outcomes can only be achieved through concerted efforts by researchers, funders, and decision-makers.

Multimorbidity research agenda in low- and middle-income countries

We call for a harmonization of the multimorbidity definition. Multimorbidity evidence will be valuable if it can be harmonized under a common core of conditions that can be adopted by multimorbidity researchers and used by policymakers to inform resource allocation. The research agenda to address multimorbidity in LMICs should be sensitive to existing capacities. Countries with no available data should prioritize resources to generate a country-representative multimorbidity prevalence estimates. In the same way in which LMICs differ from HICs, they also differ from each other, and context-specific data are essential. Countries with available data should progress towards additional multimorbidity-related initiatives, such as estimating the most frequent co-occurring conditions.

Evidence about co-occurring conditions and which combinations most affect health should be generated and aligned with context-specific disease burdens and the health system capacity to respond. Investigating common disease clusters may assist in understanding underlying pathophysiology and may provide a useful framework to characterize the health and socioeconomic impacts of multimorbidity. Network analysis can be used to evaluate disease combinations and clusters, providing insight into the complex interactions among diseases. Previous studies have documented the prevalence of multimorbidity from cross-sectional studies, but the evidence from longitudinal studies in LMICs is absent. Longitudinal characterization is essential to understand the aggregation of conditions or clusters, and the progression and consequences of multimorbidity.

Multimorbidity evidence employing innovative methods is needed targeting vulnerable groups in LMIC. We call for a focus on contextually relevant analyses, considering the heterogeneity of risk factors and health capacities available to specific subpopulations, such as differences observed in urban and rural environments or specific needs and conditions of indigenous populations. Developing a comprehensive understanding of multimorbidity patterns,
correlates, and outcomes across subpopulations and geographies will require the use of multiple complex data sources including research data from epidemiological studies, national surveys, disease registries, hospital records, administrative data, and also the potential to include data from social media platforms. Although the absence of a unique national identifier in many LMICs may limit individual-level data linkages across multiple sources, it may still be possible to link data at an area level and study associations using multilevel methods. Machine learning techniques can also contribute to algorithms that can predict which individuals are more likely to have poorer outcomes.

**Political actions**

The urgent multimorbidity research agenda in LMICs cannot be pursued in the absence of political will. Multimorbidity is challenging everywhere, and policymakers have a vested interest in tackling multimorbidity given its significant health and economic impacts, affecting patients, families, the health system, and society in general. Potential solutions are only being trialed in HICs with little evidence of its effectiveness. Still, the challenge of multimorbidity in LMICs is exacerbated by the multiple factors highlighted in this article. The burden for LMICs, as countries experience demographic aging overlapped with other societal transitions, results in severe consequences for the population health and health services.

The need to adapt health systems to address multimorbidity in LMICs could be an opportunity to act on remediating historical socioeconomic inequities and the lack of high quality of care. On one hand, we need prompt political actions to address the underlying risk factors of multimorbidity, such as food environment and physical activity, targeting children, adolescents, and young adults. On the other hand, we need secondary prevention programs to address the high prevalence of multimorbidity, inadequate control of diseases, along with the consequences and sequelae of COVID-19.

Low- and middle-income country-led innovations in prevention and healthcare delivery have the opportunity to advance the frontiers in multimorbidity. The World Economic Forum has emphasized the need and opportunity for “leapfrogging” health systems in LMICs, taking advantage of distinct structural environments and disruptive technologies to move towards sustainable health systems without replicating the path of developed economies. The current COVID-19 pandemic has, to some extent, accelerated this demand by, for example, calling for building stronger health systems.

Despite multimorbidity being increasingly recognized as a public health priority, little progress has been made to develop integrated care models for patients with multimorbidity. From a LMIC perspective, rather than focusing on a one-size-fits-all remedy, one solution may be to focus on particular patterns of multimorbidity, that is, specific combinations of co-occurring conditions which are different even within countries as shown in the case of Peru’s high altitude and sea-level communities.

Focusing on continuous, coordinated, and comprehensive approaches to the care of people with multimorbidity through the health system is increasingly needed. The primary level of care should be refashioned by having family doctors with a comprehensive understanding of each disease and how they interact between them. It is at the primary level that care for people with multiple diseases should be coordinated, and health care systems should prepare themselves. The COVID-19 pandemic has signaled the challenges and limitations of depending on hospital-based healthcare delivery. LMIC-led innovations to address simultaneously multiple chronic physical and mental conditions utilizing existing scarce resources show promising routes to address the integration of care leveraging the use of digital technologies. Digital approaches for multimorbidity are, however, still in their early stages.

The WHO Framework IPCHS presents a vision of all people having access to health services, according to their needs and preferences, being safe, effective, timely, affordable, and with acceptable quality. The Framework can be adapted to all countries including LMIC, with mature or fragile health systems. In so doing, we contribute to redesigning health systems in LMICs around the people’s needs instead of diseases, so that everyone receives the right care, at the right time, and in the right place. To implement it, we need to change how health services are organized, managed, and delivered, and multimorbidity offers a unique opportunity to do so in an integrated manner.

**Closing remarks**

In this paper, we have reviewed many challenges in LMICs in dealing with multimorbidity, from inequities to the pressure on health systems in terms of healthcare utilization. We have signaled the unseen challenges in terms of personal and family burdens, alongside the limited capacity of existing health systems to provide high-quality care for all. The current adversities that many LMICs have faced in dealing with COVID-19 are an opportunity to rethink how health systems should be organized to address the challenges of multimorbidity that require integrated care, particularly at the primary care level. This paper calls for action to refinance primary care at the core of a health service model to appropriately tailor integrated care approaches for multimorbidity. In doing so, health systems in LMICs will be better equipped to foster high-quality health systems, with impacts on the physical, emotional, and financial
pressure of dealing with multimorbidity at the household level.

**Declaration of conflicting interests**

The author(s) declared no potential conflicts of interest with respect to the research, authorship, and/or publication of this article.

**Funding**

The author(s) disclosed receipt of the following financial support for the research, authorship, and/or publication of this article: ABA acknowledges having received support from Bloomberg Philanthropies (https://www.bloomberg.org/). ALW acknowledges having received support from the Emerging Global Leader Award (K43TW010698). TBG acknowledges having received support from the Urban Health in Latin America project funded by the Wellcome Trust (grant number 205177/Z/16/Z) and Bloomberg Philanthropies (https://www.bloomberg.org/). BPN receives research grants from the Research Support Foundation of Rio Grande do Sul, Brazil (grants 19/2551-0001231-4; 19/2551-0001704-9; and 21/2551-000066-0 - Programa Pesquisa para o SUS: gestão compartilhada em saúde—PSUS) related to projects on multimorbidity. LLY acknowledges having received support from the UKRI MRC/ESRC/DFID/WT, UK (MR/N015967/1), National Natural Sciences Foundation of China (71774075), and MetLife Foundation (via Duke University). JMJ acknowledges having received support from the Alliance for Health Policy and Systems Research (HQHSR120660), Bloomberg Philanthropies (grant 46129, via University of North Carolina at Chapel Hill School of Public Health), FONDECYT via CIENCIACTIVA/CONCYTEC, British Council, British Embassy and the Newton-Paulet Fund (223-2018, 224-2018), DFID/MRC/Wellcome Global Health Trials (MR/M007405/1), Fogarty International Center (R21TW009982, D71TW010877, R21TW011740), Grand Challenges Canada (0335-04), International Development Research Center Canada (IDRC 106887, 108167), Inter-American Institute for Global Change Research (IAI CRN306), National Cancer Institute (I2P2CA217231), National Heart, Lung and Blood Institute (HHSN268200900033C, 5U01HL114180, 1UM1HL134590), National Institute of Mental Health (1U19MH098780), Swiss National Science Foundation (40P740-160366), UKRI BBSRC (BB/T009004/1), UKRI EPSRC (EP/V043102/1), UKRI MRC (MR/P009894/1, MR/P024408/1, MR/P02386X/1), Wellcome (074833/Z/04/Z, 093541/Z/10/Z, 103994/Z/14/Z, 107435/Z/15/Z, 205177/Z/16/Z, 214185/Z/18/Z, 218743/Z/19/Z) and the World Diabetes Foundation (WDF15-1224).

**ORCID iDs**

Ana Basto-Abreu https://orcid.org/0000-0003-1600-4797
Tonatiuh Barrientos-Gutiérrez https://orcid.org/0000-0002-0826-9106
J Jaime Miranda https://orcid.org/0000-0002-4738-5468

**References**

1. The Lancet. Making more of multimorbidity: an emerging priority. *Lancet* 2018; 391: 1637.
2. WHO. NCD global monitoring framework, https://www.who.int/nmh/global_monitoring_framework/en/ (2018, accessed 25 September 2019).
3. World Health Organization. *Global status report on non-communicable diseases* 2014. Geneva, Switzerland: World Health Organization, http://books.google.com.pe/books/about/Global_Status_Report_on_Noncommunicable.html?hl=es&redir_esc=y (2015, accessed 5 November 2021).
4. Miranda JJ, Barrientos-Gutiérrez T, Corvalan C, et al. Understanding the rise of cardiometabolic diseases in low- and middle-income countries. *Nat Med* 2019; 25: 1667–1679.
5. United Nations, Department of Economic and Social Affairs, Population Division. World urbanization prospects: the 2018 revision [key facts], https://population.un.org/wup/Publications/Files/WUP2018-KeyFacts.pdf (accessed 4 August 2019).
6. Popkin BM and Ng SW. The nutrition transition to a stage of high obesity and noncommunicable disease prevalence dominated by ultra-processed foods is not inevitable. *Obes Rev* 2021; 23: e13366. DOI: 10.1111/obr.13366
7. Popkin BM. Measuring the nutrition transition and its dynamics. *Public Health Nutr* 2021; 24: 318–320.
8. Miranda JJ, Kinra S, Casas JP, et al. Non-communicable diseases in low- and middle-income countries: context, determinants and health policy. *Trop Med Int Health* 2008; 13: 1225–1234.
9. Mendoza W and Miranda JJ. Global shifts in cardiovascular disease, the epidemiologic transition, and other contributing factors: toward a new practice of global health cardiology. *Cardiol Clin* 2017; 35: 1–12.
10. Muka T, Imo D, Jaspers L, et al. The global impact of non-communicable diseases on healthcare spending and national income: a systematic review. *Eur J Epidemiol* 2015; 30: 251–277.
11. Chaker L, Falla A, van der Lee SJ, et al. The global impact of non-communicable diseases on healthcare spending and national income: a systematic review. *Eur J Epidemiol* 2015; 30: 357–395.
12. Frenk J and Gómez-Dantés O. False dichotomies in global health: the need for integrative thinking. *Lancet* 2016; 389: 667–670.
13. Frenk J, Bobadilla JL, Sepulveda J, et al. Health transition in middle-income countries: new challenges for health care. *Health Policy Plan* 1989; 4: 29–39.
14. Collins TE, Nugent R, Webb D, et al. Time to align: development cooperation for the prevention and control of non-communicable diseases. *BMJ* 2019; 366: 14499.
15. Nugent R, Bertram MY, Jan S, et al. Investing in non-communicable disease prevention and management to
advance the sustainable development goals. *Lancet* 2018; 391: 2029–2035.

16. Heller O, Somerville C, Suggs LS, et al. The process of prioritization of non-communicable diseases in the global health policy arena. *Health Policy Plan* 2019; 34: 370–383.

17. Knai C, Petticrew M, Mays N, et al. Systems thinking as a framework for analyzing commercial determinants of health. *Milbank Q* 2018; 96: 472–498.

18. Buse K, Tanaka S and Hawkes S. Healthy people and healthy profits? Elaborating a conceptual framework for governing the commercial determinants of non-communicable diseases and identifying options for reducing risk exposure. *Glob Health* 2017; 13: 34.

19. Nugent R and Fottrell E. Non-communicable diseases and climate change: linked global emergencies. *The Lancet* 2019; 394: 622–623. DOI: 10.1016/s0140-6736(19)31762-3.

20. Swinburn BA, Kraak VI, Allender S, et al. The global syndemic of obesity, undernutrition, and climate change: the lancet commission report. *Lancet* 2019; 393: 791–846.

21. Academy of Medical Sciences. *Multimorbidity: a priority for global health research*. London, UK: Academy of Medical Sciences, https://acmedsci.ac.uk/policy/policy-projects/multimorbidity (2018, accessed 5 September 2021).

22. Academy of Medical Sciences. *Multiple morbidities as a global health challenge*. London, UK: Academy of Medical Sciences, https://acmedsci.ac.uk/file-download/38330-567965102e84a.pdf (2015, accessed 5 September 2021).

23. Abebe F, Schneider M, Asrat B, et al. Multimorbidity of chronic non-communicable diseases in low- and middle-income countries: a scoping review. *J Comorb* 2020; 10: 2235042X20961919.

24. Huaquia-Díaz AM, Chalán-Dávila TS, Carrillo-Larco RM, et al. Multimorbidity in Latin America and the Caribbean: a systematic review and meta-analysis. *BMJ Open* 2021; 11: e050409.

25. Nguyen H, Manolova G, Daskalopoulou C, et al. Prevalence of multimorbidity in community settings: a systematic review and meta-analysis of observational studies. *J Comorb* 2019; 9: 2235042X19870934.

26. Macinko J, Andrade FCD, Nunes BP, et al. Primary care and multimorbidity in six Latin American and Caribbean countries. *Rev Panam Salud Publica* 2019; 43: e8–e9.

27. Olivese DEV, Chambi FRV, ChannEMM, et al. Risk factors for chronic diseases and multimorbidity in a primary care context of central Argentina: a web-based interactive and cross-sectional study. *Int J Environ Res Public Health* 2017; 14: 251. DOI: 10.3390/ijerph14030251.

28. Miranda JJ, Bernabe-Ortiz A, Gilman RH, et al. Multimorbidity at sea level and high-altitude urban and rural settings: The CRONICAS cohort study. *J Comorb* 2019; 9: 2235042X19875297.

29. Garin N, Koyanagi A, Chatterji S, et al. Global multimorbidity patterns: a cross-sectional, population-based, multi-country study. *J Gerontol A Biol Sci Med Sci* 2016; 71: 205–214.

30. Camargo-Casas S, Suarez-Monsalve S, Zepeda MUP, et al. Multimorbidity, depressive symptoms, and self-reported health in older adults: a secondary analysis of the sabe bogota study. *Rev Invest Clin* 2018; 70: 192–197.

31. Oni T and Unwin N. Why the communicable/non-communicable disease dichotomy is problematic for public health control strategies: implications of multimorbidity for health systems in an era of health transition. *Int Health* 2015; 7: 390–399.

32. Institute for Health Metrics and Evaluation. GBD results tool, http://ghdx.healthdata.org/gbd-results-tool (accessed 10 July 2021).

33. Boutayeb A. The double burden of communicable and non-communicable diseases in developing countries. *Trans R Soc Trop Med Hyg* 2006; 100: 191–199.

34. Hajat C and Stein E. The global burden of multiple chronic conditions: a narrative review. *Prev Med Rep* 2018; 12: 284–293.

35. Kowal P, Arokiasamy P, Afshar S, et al. Multimorbidity: health care that counts “past one” for 1–2 billion older adults. *The Lancet* 2015; 385: 2252–2253.

36. Stuckler D. Population causes and consequences of leading chronic diseases: a comparative analysis of prevailing explanations. *Milbank Q* 2008; 86: 273–326.

37. Wade AN, Payne CF, Berkman L, et al. Multimorbidity and mortality in an older, rural Black South African population cohort with high prevalence of HIV findings from the HAALSI Study. *BMJ Open* 2021; 11: e047777.

38. Beran D, Perel P and Miranda JJ. Forty years since Alma-Ata: do we need a new model for noncommunicable diseases? *J Glob Health* 2019; 9: 010316.

39. Watt N, Sigfrid L, Legido-Quigley H, et al. Health systems facilitators and barriers to the integration of HIV and chronic disease services: a systematic review. *Health Policy Plan* 2017; 32: iv13–iv26.

40. Kruk ME, Gage AD, Joseph NT, et al. Mortality due to low-quality health systems in the universal health coverage era: a systematic analysis of amenable deaths in 137 countries. *Lancet* 2018; 392: 2203–2212.

41. Mullachery PH, Rodriguez DA, Miranda JJ, et al. Mortality amenable to healthcare in Latin American cities: a cross-sectional study examining between-country variation in amenable mortality and the role of urban metrics. *Int J Epidemiol* 2022; 51: 303–313. DOI: 10.1093/ije/dyab137.

42. de Souza ASS and Braga JU. Trends in the use of health services and their relationship with multimorbidity in Brazil, 1998-2013. *BMC Health Serv Res* 2020; 20: 1080.

43. IntegratedCare4People. IPCHS Framework, https://www.integratedcare4people.org/ipchs-framework/ (accessed 25 October 2021).

44. World Health Organization. Framework on integrated people-centred health services, https://www.who.int/teams/integrated-health-services/clinical-services-and-systems/service-organizations-and-integration (2016, accessed 25 October 2021).
45. NICE. Multimorbidity: clinical assessment and management. NICE guideline [NG56]. London, UK: NICE, 2016.
46. Boyd CM, Darer J, Boult C, et al. Clinical practice guidelines and quality of care for older patients with multiple comorbid diseases: implications for pay for performance. *JAMA* 2005; 294: 716–724.
47. Vitry AI and Zhang Y. Quality of Australian clinical guidelines and relevance to the care of older people with multiple comorbid conditions. *Med J Aust* 2008; 189: 360–365.
48. Lugtenberg M, Burgers JS, Clancy C, et al. Current guidelines have limited applicability to patients with comorbid conditions: a systematic analysis of evidence-based guidelines. *PLoS One* 2011; 6: e25987.
49. Okeowo D, Patterson A, Boyd C, et al. Clinical practice guidelines for older people with multimorbidity and life-limiting illness: what are the implications for deprescribing? *Ther Adv Drug Saf* 2018; 9: 619–630.
50. Mutasingwa DR, Ge H and Upshur REG. How applicable are NICE guidelines [NG56] and relevance to the care of older people with multiple co-morbidities? *Can Fam Physician* 2011; 57: e253–e262.
51. Jan S, Laba T-L, Essue BM, et al. Action to address the household economic burden of non-communicable diseases. *Lancet* 2018; 391: 2047–2058.
52. Jaspers L, Colpani V, Chaker L, et al. The global impact of non-communicable diseases on households and impoverishment: a systematic review. *Eur J Epidemiol* 2015; 30: 163–188.
53. Taype-Rondan A, Lazo-Porras M, Moscoso-Porras M, et al. Inadequate glycaemic control in LMIC: health system failures in Peru. *Br J Gen Pract* 2016; 66: 197.
54. Pesantes MA, Brandt LR, Ipincse A, et al. An exploration into caring for a stroke-survivor in Lima, Peru: Emotional impact, stress factors, coping mechanisms and unmet needs of informal caregivers. *eNeurologicalSci* 2017; 6: 33–50.
55. Bernabe-Ortiz A, Diez-Canseco F, Vásquez A, et al. Disability, caregiver’s dependency and patterns of access to rehabilitation care: results from a national representative study in Peru. *Disabil Rehabil* 2016; 38: 582–588.
56. Pesantes MA, Tetens A, Valle AD, et al. It is not easy living with this illness*: a syndemic approach to medication adherence and lifestyle change among low-income diabetes patients in Lima, Peru. *Hum Organ* 2019; 78: 85–96.
57. Fernández-Niño JA, Guerra-Gómez JA and Idrovo AJ. Multimorbidity patterns among COVID-19 deaths: proposal for the construction of etiological models. *Rev Panam Salud Publica* 2020; 44: e166.
58. Monterrubio-Flores E, Ramírez-Villalobos MD, Espinosa-Montero J, et al. Characterizing a two-pronged epidemic in Mexico of non-communicable diseases and SARS-Cov-2: factors associated with increased case-fatality rates. *Int J Epidemiol* 2021; 50: 430–445. DOI: 10.1093/ije/dyab008
59. Reyes-Sánchez F, Basto-Abreu A, Torres-Alvarez R, et al. Fraction of COVID-19 hospitalizations and deaths attributable to chronic diseases. *Prev Med* 2022; 155: 106917.
60. Pati S, Mahapatra P, Kanungo S, et al. Managing multimorbidity (multiple chronic diseases) amid COVID-19 pandemic: a community based study from Odisha, India. *Front Public Health* 2020; 8: 584408.
61. Wu T, Jia X, Shi H, et al. Prevalence of mental health problems during the COVID-19 pandemic: a systematic review and meta-analysis. *J Affect Disord* 2021; 281: 91–98.
62. Barnett K, Mercer SW, Norbury M, et al. Epidemiology of multimorbidity and implications for health care, research, and medical education: a cross-sectional study. *Lancet* 2012; 380: 37–43.
63. Riou J, Panczak R, Althaus CL, et al. Socioeconomic position and the COVID-19 care cascade from testing to mortality in Switzerland: a population-based analysis. *Lancet Public Health* 2021; 6: e683–e691.
64. Mena GE, Martinez PP, Mahmud AS, et al. Socioeconomic status determines COVID-19 incidence and related mortality in Santiago, Chile. *Science* 2021; 372: eabg5298.
65. Batista SR, Semeao de Souza AS, Nogueira J, et al. Protective behaviors for COVID-19 among Brazilian adults and elderly living with multimorbidity: the ELSI-COVID-19 initiative. *Cad Saude Publica* 2020; 36(Suppl 3): e00196120.
66. Kephart JL, Delclos-Alió X, Rodriguez DA, et al. The effect of population mobility on COVID-19 incidence in 314 Latin American cities: a longitudinal ecological study with mobile phone location data. *Lancet Digit Health* 2021; 3: e716–e722. DOI: 10.1016/S2589-7500(21)00174-6
67. May CR, Eton DT, Boehmer K, et al. Rethinking the patient: using burden of treatment theory to understand the changing dynamics of illness. *BMC Health Serv Res* 2014; 14: 281.
68. Shippnee ND, Shah ND, May CR, et al. Cumulative complexity: a functional, patient-centered model of patient complexity can improve research and practice. *J Clin Epidemiol* 2012; 65: 1041–1051.
69. Yong E. What even counts as science writing anymore? The Atlantic, https://www.theatlantic.com/science/archive/2021/10/how-pandemic-changed-science-writing/620271/ (2021, accessed 1 November 2021).
70. Schäfer I, Hansen H, Schön G, et al. The influence of age, gender and socio-economic status on multimorbidity patterns in primary care. First results from the multicare cohort study. *BMC Health Serv Res* 2012; 12: 89.
71. Chua YP, Xie Y, Lee PSS, et al. Definitions and prevalence of multimorbidity in large database studies: a scoping review. *Int J Environ Res Public Health* 2021; 18: 1673. DOI: 10.3390/ijerph18041673
72. Harrison C, Britt H, Miller G, et al. Examining different measures of multimorbidity, using burden of treatment theory to understand the changing complexity of illness. *BMC Health Serv Res* 2014; 14: 281.
73. Johnston MC, Crilly M, Black C, et al. Defining and measuring multimorbidity: a systematic review of systematic reviews. *Eur J Public Health* 2019; 29: 182–189.
74. Campos-Nonato I, Hernández-Barrera L, Pedroza-Tobías A, et al. Hipertensión arterial en adultos mexicanos: prevalencia,
75. Basto-Abreu A, Barrientos-Gutiérrez T, Rojas-Martínez R, et al. Prevalencia de diabetes y descontrol glucémico en México: resultados de la Ensanut 2016. *Salud Publica Mex* 2016; 60: 233–243.

76. NCD Risk Factor Collaboration (NCD-RisC). Worldwide trends in hypertension prevalence and progress in treatment and control from 1990 to 2019: a pooled analysis of 1201 population-representative studies with 104 million participants. *Lancet* 2021; 398: 957–980.

77. Shen J, Kondal D, Rubinstein A, et al. A multiethnic study of prediabetes and diabetes in LMIC, *Glob Heart* 2016; 11: 61–70.

78. Althubaiti A. Information bias in health research: definition, pitfalls, and adjustment methods. *J Multidiscip Healthc* 2016; 9: 211–217.

79. Stirland LE, González-Saavedra L, Mullin DS, et al. Measuring multimorbidity beyond counting diseases: systematic review of community and population studies and guide to index choice. *BMJ* 2020; 370: m3668.

80. Hernández B, Reilly RB and Kenny RA. Investigation of multimorbidity and prevalent disease combinations in older Irish adults using network analysis and association rules. *Sci Rep* 2019; 9: 14567.

81. Cezard G, McHale C, Sullivan F, et al. Studying trajectories of multimorbidity: a systematic scoping review of longitudinal approaches and evidence. *BMJ Open* 2021; 11: e048485. DOI: 10.1101/2020.11.16.20232363

82. Violán C, Fogueu-Boreu Q, Hermosilla-Pérez E, et al. Comparison of the information provided by electronic health records data and a population health survey to estimate prevalence of selected health conditions and multimorbidity. *BMC Public Health* 2013; 13: 251.

83. Majnarić LT, Babić F, O’Sullivan S, et al. AI and big data in healthcare: towards a more comprehensive research framework for multimorbidity. *J Clin Med Res* 2021; 10: 766. DOI: 10.3390/jcm10040766

84. Piel FB, Fecht D, Hodgson S, et al. Small-area methods for investigation of environment and health. *Int J Epidemiol* 2020; 49: 686–699.

85. World Economic Forum. *Health systems leapfrogging in emerging economies project paper*. Geneva, Switzerland: World Economic Forum, http://www3.weforum.org/docs/WEF_HealthSystem_LeapfroggingEmergingEconomies_ProjectPaper_2014.pdf (2014, accessed 25 November 2021).

86. Kruk ME, Gage AD, Arsenault C, et al. High-quality health systems in the Sustainable Development Goals era: time for a revolution. *Lancet Glob Health* 2018; 6: e1196–e1252.

87. World Health Organization, OECD, International Bank for Reconstruction and Development/The World Bank. Delivering quality health services: a global imperative for universal health coverage. Geneva, Switzerland: World Health Organization, https://apps.who.int/iris/handle/10665/272465 (2018, accessed 8 December 2019).

88. Nimako K and Kruk ME. Seizing the moment to rethink health systems. *Lancet Glob Health* 2021; 9: e1758–e1762. DOI: 10.1016/S2214-109X(21)00356-9

89. Burgess R. COVID-19 mental-health responses neglect social realities. *Nature*. Epub ahead of print 4 May 2020. DOI: 10.1038/d41586-020-01313-9

90. World Economic Forum. *Health systems leapfrogging in emerging economies project*. Geneva, Switzerland: World Economic Forum, http://www3.weforum.org/docs/WEF_HealthSystems_Leapfrogging_EmergingEconomies.pdf (2015, accessed 25 November 2021).

91. The Independent Panel. The independent panel for pandemic preparedness and response, https://theindependentpanel.org/ (2020, accessed 29 June 2021).

92. Whitty CJM and Watt FM. Map clusters of diseases to tackle multimorbidity. *Nature* 2020; 579: 494–496.

93. World Bank. *Walking the talk: reimaging primary health care after COVID-19*. Washington, DC: World Bank, http://documents.worldbank.org/curated/en/814591624897277544/Walking-the-Talk-Reimagining-Primary-Health-Care-After-COVID-19 (2021, accessed 25 October 2021).

94. Diez-Canseco F, Toyama M, Ipince A, et al. Integration of a technology-based mental health screening program into routine practices of primary health care services in Peru (the allillanchu project): development and implementation. *J Med Internet Res* 2018; 20: e100.

95. Araya R, Menezes PR, Claro HG, et al. Effect of a dIntervention on depressive symptoms in patients with comorbid hypertension or diabetes in Brazil and Peru: two randomized clinical trials. *JAMA* 2021; 325: 1862. DOI: 10.1001/jama.2021.1862

96. Kraef C, van der Meerschen M and Free C. Digital telemedicine interventions for patients with multimorbidity: a systematic review and meta-analysis. *BMJ Open* 2020; 10: e036904.