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3	Deaths averted by COVID-19 vaccination in select Latin American and
4	Caribbean Countries: a modelling study
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39 ABSTRACT

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Background: The COVID-19 pandemic has had a significant impact on global health, with millions of lives lost
 worldwide. Vaccination has emerged as a crucial strategy in mitigating the impact of the disease. This study
 aims to estimate the number of deaths averted through vaccination in LAC during the first year and a half of
 vaccination rollout (January 2021 - May 2022).

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Methods: Publicly available data on COVID-19 deaths and vaccination rates were used to estimate the total
 number of deaths averted via vaccination in LAC. Using estimates for number of deaths, number of
 vaccinated, and vaccine effectiveness, a counterfactual estimated number of deaths observed without
 vaccination was calculated. Vaccine effectiveness estimates were obtained from published studies. The
 analysis focused on 17 countries in LAC and considered adults aged 18 years and above.

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Findings: After accounting for underreporting, the analysis estimated that over 1.49 million deaths were
 caused by COVID-19 in the selected countries during the study period. Without vaccination, the model
 estimated that between 2.10 and 4.11 million COVID-19 deaths would have occurred. Consequently,
 vaccination efforts resulted in approximately 610,000 to 2.61 million deaths averted.

interpretation: This study represents the first large-scale, multi-center estimate of population-level vaccine
 impact on COVID-19 mortality in LAC. The findings underscore the substantial impact of timely and
 widespread vaccination in averting COVID-19 deaths. These results provide crucial support for vaccination
 programs aimed at combating epidemic infectious diseases in the region and future pandemics.

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52 **Funding:** This study was funded by the Pan-American Health Organization (PAHO).

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54 Key Words: Covid-19, Latin America, Caribbean, Vaccination, Mathematical Modeling

55 Introduction

56	The World Health Organization (WHO) declared a public health emergency of international concern (PHEIC) on
57	January 30, 2020 in response to the identification of a novel coronavirus (SARS-CoV-2) in China. In March
58	2020, as lab-confirmed SARS-CoV-2 cases exponentially grew in China, and newly identified transmission was
59	reported in other countries, WHO declared the outbreak a global pandemic and called on countries to rapidly
0'	respond with control and mitigation plans to slow the spread of the virus. In the ensuing months, countries
'1	worldwide have faced challenges to keep a responsive pace with the spread of the virus, which has led to
2'	substantial health and socioeconomic losses and significant mortality related to COVID-19 worldwide. ¹ To
73	date, a total of 7 million deaths due to COVID-19 have been reported globally since January 1 st 2020.
74	Countries in the Americas have been among the hardest hit by the pandemic. By early 2023, approximately
' 5	43% of all reported COVID-19 deaths in the world had occurred in the region, reaching 2.89 million deaths as
'6	of January 1 st , 2023. To date, South America as a sub-region experienced 1.35 million COVID-19 deaths during
77	the pandemic. ² Although most COVID-19 deaths occur among older adults and individuals living with
78	comorbidities, deaths have occurred in all ages including young children, even though younger ages appear to
<i>י</i> 9	be less susceptible to severe disease.

The first vaccines to prevent COVID-19 became available for use in early 2021. As of July 2021, eight COVID-19 vaccines had received Emergency Use Listing (EUL) by the WHO pre-qualification process,³ upon meeting predefined criteria for safety and efficacy. By May 2023, this number had reached 15,⁴ and many more are under assessment for pre-qualification.⁵

The rapid deployment of vaccines has been proven critical to halt the pandemic's toll in the region. Many countries in the region accessed vaccines via PAHO's Revolving Fund, in active collaboration with the COVAX Facility. In Latin American and Caribbean (LAC) countries, 82% of the population has received at least one dose of COVID-19 vaccine to date, and 1.1 billion doses of vaccine have been administered.⁶ Despite the initial

- 38 availability of COVID-19 vaccines across the region, wide inter- and intra-country variation in access and
- 39 availability to vaccines were observed in the region.⁶
- 30 Selected studies have recently used models to estimate the impact of COVID-19 vaccination in averting COVID-
- 19 deaths in selected countries and periods.^{7,8} To date, the burden of COVID-19 deaths prevented by
- yaccination, a key measure of the impact of the vaccination program, has not been established for the Latin
- 3 American region. This study aims to estimate the numbers of COVID-19 deaths averted due to vaccination in
- 34 selected countries of the LAC region during the COVID-19 pandemic.

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- Methods 96
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)8 Study design, setting and period

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)0	We used existing data on reported deaths due to COVID-19 and COVID-19 vaccination coverage over time to
)1	estimate deaths averted via vaccination for select countries in Latin America and the Caribbean. This
)2	modelling study used data from 17 countries in the LAC region during the period ranging from vaccine
)3	introduction in each country (early 2021) to May 2022 (Table 1). The 17 countries were selected for inclusion
)4	because they had available COVID-19 vaccination coverage data (Figure 1). This included: Argentina, Brazil,
)5	Chile, Colombia, Paraguay, Uruguay, Jamaica, Peru, Belize, Bolivia, Costa Rica, Ecuador, El Salvador,
)6	Guatemala, Honduras, Mexico, and Venezuela. All other countries in the Latin American and Caribbean regions
)7	were excluded due to missing data on COVID-19 vaccination coverage and/or COVID-19 deaths. Our analysis
)8	considered only adults over 18, and the model was stratified by age (18-59 years old, 60 years and older).
)9	Data Sources
LO	COVID-19 deaths
L0 L1	<i>COVID-19 deaths</i> When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global
LO L1 L2	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such
LO L1 L2 L3	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the
LO L1 L2 L3 L4	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the penalized composite link model for ungrouping. ¹⁰ The COVerAGE-DB database provided deaths by age group
LO L1 L2 L3 L4 L5	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the penalized composite link model for ungrouping. ¹⁰ The COVerAGE-DB database provided deaths by age group (18-59, 60+) as well as by time period (collapsed into monthly death counts). COVerAGE-DB was used for
LO L1 L2 L3 L4 L5 L6	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the penalized composite link model for ungrouping. ¹⁰ The COVerAGE-DB database provided deaths by age group (18-59, 60+) as well as by time period (collapsed into monthly death counts). COVerAGE-DB was used for observed death counts in Argentina, Brazil, Chile, Colombia, Paraguay, Uruguay, Jamaica, and Peru. Mexico
LO L1 L2 L3 L4 L5 L6 L7	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the penalized composite link model for ungrouping. ¹⁰ The COVerAGE-DB database provided deaths by age group (18-59, 60+) as well as by time period (collapsed into monthly death counts). COVerAGE-DB was used for observed death counts in Argentina, Brazil, Chile, Colombia, Paraguay, Uruguay, Jamaica, and Peru. Mexico had COVID-19 mortality data available by age and time in COVerAGE-DB through October 2021, and this data
LO L1 L2 L3 L4 L5 L6 L7 L8	COVID-19 deaths When possible, we used country-specific data for observed deaths over time from the COVerAGE-DB global demographic database of COVID-19 deaths. ⁹ This dataset used data as reported by government entities, such as health ministries, and harmonized the data to standard metrics, measures, and age-bands using the penalized composite link model for ungrouping. ¹⁰ The COVerAGE-DB database provided deaths by age group (18-59, 60+) as well as by time period (collapsed into monthly death counts). COVerAGE-DB was used for observed death counts in Argentina, Brazil, Chile, Colombia, Paraguay, Uruguay, Jamaica, and Peru. Mexico had COVID-19 mortality data available by age and time in COVerAGE-DB through October 2021, and this data was used for the analysis from December 2020 to October 2021. For countries that did not have COVID-19

- 20 non-age stratified COVID-19 death estimates over time from the World Health Organization Coronavirus
- (COVID-19) Dashboard.¹ Data from the World Health Organization (WHO) was not age-stratified, therefore we 21

22	imputed age stratified deaths using a linear regression model with population size by age category, country
<u>2</u> 3	World Bank income level, and vaccination level in those over 60 as predictors. The linear regression model was
24	validated using countries for which age-stratified death data were available. Additional methods can be found
25	in the supplement. Countries for which death data were imputed from WHO reported numbers for the full
26	time period of the analysis were Belize, Bolivia, Costa Rica, Ecuador, El Salvador, Guatemala, Honduras, and
<u>?</u> 7	Venezuela. In addition, age-specific death counts were imputed for Mexico from November 2021 to May 2022.
28	To account for the underreporting of COVID-19 deaths in the region, we used a multiplier considering
29	available evidence from the literature, considering country-specific mortality underestimates ranging from 0
30	to 79% in studied countries (see Additional Methods). ¹¹
}1	Vaccine coverage and effectiveness data
32	Data on vaccination by age over time by country and age group were obtained from the Pan-American
}3	Organization (PAHO) ¹² and from Our World in Data (OWID) ¹³ . Vaccine coverage considered partial and
}4	complete primary series, and first booster dose (not the second booster and beyond).
}5	OWID data were complete for all countries of interest but were not age-stratified and included vaccination in
}6	those under 18, which was outside our study population. Data reported to PAHO were age-stratified, available
}7	as of September 2021, and less complete for some countries. Therefore, we used PAHO data to determine
}8	proportion of all vaccinations that were administered to each age group, and OWID to determine proportion
}9	of population within each age group that was vaccinated over time. Data for age-specific vaccination was only
10	available for Mexico starting in February of 2022, we therefore assumed the same proportion of vaccines
i 1	going to each age group in the months from December 2020 through January 2022 as in February 2022. As it is
12	likely that elderly people were more prioritized for early vaccination, it is likely that this leads us to slightly
13	underestimate ¹⁴⁻¹⁶ the number of deaths averted in the older age group in the early part of 2021.
14	Multiple vaccine products were available and used by countries within PAHO over the course of vaccine
1 5	administration (Table 1), and it is difficult to ascertain what proportion of all vaccinations were using specific

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16	products at each time point. Therefore, we considered a range of vaccine effectiveness (stratified by partial vs
↓ 7	full vs booster vaccination) based on the vaccine effectiveness estimated for the vaccine products in the
18	literature, with an effort to use studies conducted in Latin American countries. ¹⁷⁻²⁶ Additional boosters beyond
19	the first were not considered in the analysis. Estimates of vaccine effectiveness can be seen in Table 2.
;0	
51	Population
52	Population estimates by age sub-group for each country in 2021 were obtained from the United Nations
;3	World Populations Prospects. ²⁷
54	
55	Model Structure and Equations
56	To calculate deaths averted via vaccination, we used the following equations, wherein $m{D}_{i,m,V= u}$ is the number
57	of deaths reported in month $i,$ for age group $m{m}$. The reported level of vaccination for age group $m{m}$ at month $m{i}$
;8	is shown as v . $D_{i,m,V=0}$ is the expected number of deaths that would have been observed for age group m at
;9	month i had there been no vaccination, and X is a multiplier for assumed underreporting of case counts. ¹⁸
50	${p}_{o,i,m}$ is the proportion of the population partly vaccinated (one dose), ${p}_{f,i,m}$ is the proportion of the
51	population fully vaccinated, and $p_{b,i,m}$ is the proportion of the population booster vaccinated for age group m
52	at month $i.~VE_{o_i}$ is the vaccine effectiveness against death for partial vaccination, $~VE_f$ is the vaccine
53	effectiveness against death for full series vaccination, and ${\it VE}_b$ is the vaccine effectiveness against death for
54	full series vaccination with booster. $m{D}_{Averted}$ is the estimated number of deaths averted via vaccination.
55	Equation 1 shows the calculation for expected deaths that would have been observed if there had been no
56	vaccination in age group $m{m}$ in month $m{i}.$
57	
58	Eq. 1 $D_{i,m,V=0} = \frac{D_{i,m,V=v} * X}{1 - (p_{o,i,m} * VE_p) - (p_{f,i,m} * VE_f) - (p_{b,i,m} * VE_b)}$

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¹2 Eq. 2
$$D_{V=0,m} = \sum_{1}^{i} D_{V=0,i,m}$$

- 73
- ⁷⁴ Equation 3 calculates estimated deaths averted via vaccination.
- **7**5

⁷6 Eq. 3
$$D_{Averted,m} = D_{V=0,m} - D_{V=v,m}$$

- 7
- ⁷⁸ Equation 4 sums deaths averted across age groups for the final estimate of deaths averted.
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30 Eq. 4.
$$D_{Averted} = \sum_{1}^{length(m)} D_{Averted,m}$$

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We calculated estimated deaths averted by country within the group of countries included in the regional

33 analysis and used country-specific estimates to come to a final region-wide estimate.

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35 Sensitivity analysis

As there were multiple vaccine products used in this region over time, with varying estimates of vaccine

s7 effectiveness against COVID-19 due to different variants of concern (VOC), which also varies over time and by

38 country, we considered a range of vaccine effectiveness estimates in the model, assigned to low, medium, and

- 39 high range estimates. Also under sensitivity analysis, we modeled estimates with and without accounting for
- **)0** under-reporting of COVID-19 mortality.
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- **Ethical issues**

- 3 This study used publicly available secondary data, considering a variety of open data sources and platforms
- 34 which report COVID-19 related data reported and made available by the countries, PAHO, WHO and other
- international organizations. Only aggregated data were used, and mathematical models have been applied to
- estimate the averted death burden associated with COVID-19 vaccination in the region.

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- **Results**
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)0	There were 1.05 million COVID-19 deaths reported in the 17 selected Latin America and Caribbean countries
)1	from the start of vaccination (ranging by country from December 2020 to March 2021) to May 2022 (Table 1).
)2	Accounting for underreporting, the analysis assumes that there were actually 1.49 million COVID-19 deaths in
)3	these countries during this period. (Table 3, Figure 2). Our model estimates that without vaccination and
)4	assuming medium vaccine effectiveness, there would have been 2.67 million deaths during this same time
)5	period. Therefore, an estimated 1.18 million deaths were averted by vaccination, with that estimate ranging
)6	between 610,000 deaths averted assuming low vaccine effectiveness and 2.62 million deaths averted
)7	assuming high vaccine effectiveness. Overall, our model estimates that around 273 (142-607) deaths were
)8	averted per 100,000 people in LAC.
)9	In a sensitivity analysis, if we instead considered COVID-19 deaths as reported with no assumed
LO	underreporting, our model estimated that vaccination averted 870,000 deaths (range: 450,000, 1.96 million)
1	(Table 3, Supplementary Figure 2)
L2	Country-specific data closely align with region-wide results (Supplementary Table 1, Supplementary Figures
L3	2,3). Rates of deaths averted by country varied considerably by country over time, especially in the over 60
L4	age group (Supplemental Figure 4).

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- L8 Discussion
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20	The COVID-19 pandemic has caused unprecedented loss of life worldwide, and vaccination has emerged as a
21	critical tool to mitigate its impact. To our knowledge, this is the first multi-country study evaluating the impact
22	of vaccination on COVID-19 deaths in the Latin American and Caribbean Region. Our model estimates that
23	between 700,000 and 3.1 million deaths were averted by vaccination, underscoring the importance that
<u>2</u> 4	vaccination had in mitigating the impact of the COVID-19 pandemic.
25	
26	Incidence of deaths averted by country varied based on vaccination coverage over time (especially in the over
27	60 age group) (Supplementary Figure 4) as well as whether COVID-19 outbreaks were seen largely prior to or
28	after the initiation of vaccination. For instance, the model estimates that proportionally more deaths were
<u> 29</u>	averted in Chile and Uruguay as there were spikes in deaths at a time when a lot of the population (especially
30	those over 60) was vaccinated (Supplementary Figures 2,3).
30 31	those over 60) was vaccinated (Supplementary Figures 2,3).
30 31 32	those over 60) was vaccinated (Supplementary Figures 2,3). Our results are in line with available model projections of COVID-19 deaths averted by vaccination in other
30 31 32 33	those over 60) was vaccinated (Supplementary Figures 2,3). Our results are in line with available model projections of COVID-19 deaths averted by vaccination in other Regions and in selected countries. The projected impact of COVID-19 vaccination in deaths during the first
 30 31 32 33 34 	those over 60) was vaccinated (Supplementary Figures 2,3). Our results are in line with available model projections of COVID-19 deaths averted by vaccination in other Regions and in selected countries. The projected impact of COVID-19 vaccination in deaths during the first year of COVID-19 vaccination rollout globally during the first year of vaccine availability from Dec 8 2020
<pre>30 31 32 33 34 35</pre>	those over 60) was vaccinated (Supplementary Figures 2,3). Our results are in line with available model projections of COVID-19 deaths averted by vaccination in other Regions and in selected countries. The projected impact of COVID-19 vaccination in deaths during the first year of COVID-19 vaccination rollout globally during the first year of vaccine availability from Dec 8 2020 through Dec 8, 2021 was reported as 14·4 million (95% credible interval [Crl] 13·7-15·9) in 185 countries. ²⁸
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 30 31 32 33 34 35 36 37 38 	those over 60) was vaccinated (Supplementary Figures 2,3). Our results are in line with available model projections of COVID-19 deaths averted by vaccination in other Regions and in selected countries. The projected impact of COVID-19 vaccination in deaths during the first year of COVID-19 vaccination rollout globally during the first year of vaccine availability from Dec 8 2020 through Dec 8, 2021 was reported as 14·4 million (95% credible interval [Crl] 13·7-15·9) in 185 countries. ²⁸ Savinkina et al ⁸ also modeled COVID-19 deaths-averted by vaccinating low-income and lower-middle-income countries in late 2021, when the Omicron VOC was already predominant globally. The study estimated that scaling up global vaccination in 2022 with complete primary series plus a booster dose could result in an

10	Country and region-specific studies have also been conducted. In the United States, Steele et al. ⁷ modeled the
11	projected number of deaths averted by COVID-19 vaccination, and concluded that the US vaccination
12	campaign averted 58% of deaths that might have otherwise occurred in the period of Dec 1 $^{ m st}$ 2020 through
13	September 30 th , 2021. Over the same time period, our analysis estimates that approximately 25% (range
14	based on vaccine effectiveness estimates: 15%-34%) of deaths had been averted via vaccination in LAC. When
1 5	expanding the time frame through May 2022, our analysis estimates that an approximate 45% (range based
16	on vaccine effectiveness estimates: 30%-65%) of deaths had been averted via vaccination. This may be due to
ŀ 7	vaccination starting earlier and being more readily and equitably accessible to the population in the US than in
18	much of LAC.

Ferreira et al²⁹ estimated averted COVID-19 deaths by vaccination in Brazil among adults over 60 years of age

50 considering a time period from January to August 2021, reporting 58,000 averted deaths. The authors

i1 reinforce that this represents an underestimate of the impact of vaccination in Brazilian elderly. In this time

j2 period, our model estimates approximately 70,000 deaths averted in those over 60 years of age (range:

*i*3 47,000-90,000).

A similar assessment for 33 countries of the European Region from December 2020, when vaccination was
 first introduced, through November 2021, resulted in an estimated 469,186 deaths averted (95% credible
 interval [Crl] 129,851–733,744; 23–62%).³⁰

Despite varying geographical locations and scope, and different study periods, all these studies reinforce the
 significant impact of averted COVID-19 mortality due to vaccination, with varying rates by country, period, and
 vaccine coverage.

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51 Our study has several limitations. A number of vaccine products were used in the countries in the analysis over 52 the time-period of interest, but we did not have adequate data on vaccine coverage by each vaccine product.

53	Therefore, we averaged vaccine effectiveness across products and present three estimates, ranging from low
54	vaccine effectiveness equal to the lowest effectiveness vaccine used in the region to high vaccine
55	effectiveness, equal to the effectiveness of mRNA vaccines. Due to uncertainty in vaccine effectiveness, we did
56	not consider vaccine waning in the analysis as we provide a wide range of vaccine effectiveness estimates that
57	would capture vaccine waning. Our analysis relies on publicly available aggregated data as reported by
58	countries, and some of this reporting may be incomplete due to the nature of data reporting during a
59	pandemic. Some of this limitation, particularly related to under-reporting of COVID-19 mortality, was
0'	addressed by considering an adjustment factor for under-reporting. In addition, our analysis does not account
'1	for protection derived from past SARS-CoV2 natural infection against reinfection and severe disease. ³¹ This
'2	could result in a potential over-estimation of vaccine impact on deaths in our case-base scenario. This is
73	somewhat accounted for in sensitivity analysis considering a range of estimates for potential vaccine effect.
'4	Lastly, we did not use a dynamic transmission model, and therefore cannot model disease dynamics in the
7 5	population over time nor the indirect protection resulting from vaccination. Considering the reported indirect
'6	effects of the vaccine in decreasing the probability of secondary transmission from an infected vaccine recipient to
7	other individual, ³² potentially resulting in an even more significant impact of the vaccine in terms of reducing
78	deaths, our estimates are conservative and would be underestimating vaccine impact.

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This analysis captured data from 17 countries, for which data were available. Though there are more countries in Latin America and the Caribbean, the countries excluded from the analysis were mainly small and would not greatly change the magnitude of the overall estimated results. However, these countries were largely low income with high burden of COVID-19 disease; it is important to continue working to improve data collection and surveillance in this region in order to make analyses possible in the future. Also, our model does not take into account other public health measures implemented by the countries during the pandemic, and adherence to them by the population, including mask use, lockdowns, quality and availability of healthcare services,

- 37 among others. Though these factors may impact COVID-19 mortality, but it was not possible to ascertain their
- 38 individual impact in this modelling study.
- 39

) 0	Finally, it is worthwhile mentioning that such analysis is only made possible due to the availability of
)1	administrative data collected and shared by countries. During a pandemic and in public health emergency
€2	situations, data collection, cleaning, sharing and analysis may be even more challenging and pose an additional
)3	burden to already constrained public health healthcare personnel in the local levels. However, analyses such
) 4	as this one underscore the importance of data collection and analysis to support decision making, public
)5	health policy implementation, and assessment of interventions.
)6	
) 7	In conclusion, our study provides evidence of the significant impact of vaccination in reducing COVID-19

 deaths in the Latin American and Caribbean region, one of the regions most strongly impacted by the pandemic. Despite the many challenges to COVID-19 vaccination in LAC- including timely access to vaccines, varying vaccine products and schedules, evolving circulating variants, and shifting vaccination strategies and target groups- these findings underscore the underscore the substantial impact of timely and widespread vaccination in averting COVID-19 deaths. Further studies evaluating the impact of vaccination in other selected health outcomes including hospitalization, healthcare service utilization, costs, and long-COVID, in addition to other non-health outcomes including educational, social and economic indicators, may provide additional evidence relevant to policy makers and society as a whole. All these constitute complementary pieces of evidence which are valuable support for vaccination programs aimed at combating epidemic infectious diseases in the region and future pandemics. 		
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 95 evidence relevant to policy makers and society as a whole. All these constitute complementary pieces of 96 evidence which are valuable support for vaccination programs aimed at combating epidemic infectious 97 diseases in the region and future pandemics.)4	other non-health outcomes including educational, social and economic indicators, may provide additional
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)7 diseases in the region and future pandemics.)6	evidence which are valuable support for vaccination programs aimed at combating epidemic infectious
)7	diseases in the region and future pandemics.

Data Sharing Statement

All data used in this analysis are publicly available. All analysis code is publicly available and can be accessed
 at: https://github.com/ASavinkina/COVID_Vx_Impact.

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L1 Conflict of Interest Statement

L2 Authors have no conflicts of interest to report.

L3 Funding

L4 Funding for this analysis came from the Pan-American Health Organization.

L5 Presentation

- 16 This work was previously presented at Epidemics, in November 2023.
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Table 1. Country-specific data on vaccination, including start date of vaccination, percent coverage by age-groups considered in the analysis, and vaccines used in period.

Country	Start date of vaccination	% over 60 yo vaccinated by May 2022	% 18-59 yo vaccinated by May 2022	Vaccines in use through May 2022 ¹	1. Sou
Argentina	2020-12	95	90.8	CanSino, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V	rce :
Brazil	2021-01	98.4	85.9	Johnson&Johnson, Pfizer/BioNTech, Oxford/AstraZeneca, Sinovac	Ou
Chile	2020-12	93.9	96.9	CanSino, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac	r
Colombia	2021-03	81.1	48.3	Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac	Wo
Paraguay	2021-02	76	59.9	Covaxin, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sinovac, Sputnik V	rld in
Uruguay	2021-03	100	79.8	Sinovac, Pfizer/BioNTech, Oxford/AstraZeneca	Dat
Jamaica	2021-03	35.2	26.4	Johnson&Johnson, Moderna, Pfizer/BioNTech, Oxford/AstraZeneca	a
Peru	2021-02	90.2	91.1	Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing	
Belize	2021-02	74.7	67.8	Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing	-19
Bolivia	2021-02	70.9	62.6	Johnson&Johnson, Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sputnik V	cin
Costa Rica	2021-02	85.1	90.4	Oxford/AstraZeneca, Pfizer/BioNTech	dat
Ecuador	2021-02	90.5	87.1	CanSino, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac	aba
El Salvador	2021-02	84.2	80.8	Oxford/AstraZeneca, Pfizer/BioNTech, Sinopharm/Beijing, Sinovac	se ¹
Guatemala	2021-02	58.8	47.6	Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sputnik V	3
Honduras	2021-02	66.4	34.6	Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sputnik V	
Venezuela	2021-02	42.2	58	Abdala, Sinopharm/Beijing, Sinovac, Soberana02, Sputnik Light, Sputnik V	
Mexico	2020-12	92.7	80.1	CanSino, Johnson&Johnson, Moderna, Oxford/AstraZeneca, Pfizer/BioNTech, Sinovac, Sputnik V	

Table 2. Parameters used as inputs to the model

	Estimate	Source
COVID-19 mortality underreporting rate	Country dependent (see additional methods)	Msemburi et al. (2023) ¹¹
Vaccine effectiveness estimates, by age and dose		
Medium vaccine effectiveness, 18-59 years old	% (point estimate)	
Fully vaccinated (2 dose primary schedule)	0.849	Santos, CVBD, et al (2023) ²⁰ Cerqueira-Silva, T. Et al (2022) ²²
Partly vaccinated (1 dose primary schedule)	0.553	Cerqueira-Silva, T. Et al (2022) ²¹ , Santos, CVBD, et al (2023) ²⁰
1 st Booster dose	0.971	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et all (2022) ²⁶ Menni, C et al (2022) ²⁵
Medium vaccine effectiveness 60+ years old		
Fully vaccinated (2 dose primary schedule)	0.801	Monteiro, HS, et al (2023) ¹⁴ Santos, CVBD, et al (2023) ²⁰ Ranzani, OT, et al (2021) ²⁴ Hitchings, MDT, et al (2021) ¹⁵
Partly vaccinated (1 dose primary schedule)	0.526	Bermingham, C, et al (2022) ¹⁶ Nunes, B, et al (2021) ¹⁹
1 st Booster dose	0.925	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et all (2022) ²⁶ Menni, C et al (2022) ²⁵
Vaccine effectiveness estimates,		, , , ,
sensitivity analyses, by age and dose High vaccine effectiveness, 18-59 years old		
Fully vaccinated (2 dose primary schedule)	0.945	Santos, CVBD, et al (2023) ²⁰
Partly vaccinated (1 dose primary schedule)	0.625	Cerqueira-Silva, T. Et al (2022) ²¹ Santos, CVBD, et al (2023) ²⁰
1 st Booster dose	0.99	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et all (2022) ²⁶ Menni, C et al (2022) ²⁵

High vaccine effectiveness, 60+ years old							
Fully vaccinated (2 dose primary schedule)	0.936	Hitchings, MDT, et al (2021) ¹⁵					
Partly vaccinated (1 dose primary schedule)	0.737	Bermimgham, C, et al (2022) ¹⁶ Nunes, B, et al (2021) ¹⁹					
1 st Booster dose	0.99	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et all (2022) ²⁶ Menni, C et al (2022) ²⁵					
Low vaccine effectiveness, 18-59 years old							
Fully vaccinated (2 dose primary schedule)	0.678	Cerqueira-Silva, T. Et al (2022) ²²					
Partly vaccinated (1 dose primary schedule)	0.353	Cerqueira-Silva, T. Et al (2022) ²¹ Santos, CVBD, et al (2023) ²⁰					
1 st Booster dose	0.90	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et al (2022) ²⁶ Menni, C et al (2022) ²⁵					
Low vaccine effectiveness, 60+ years old		, , , ,					
Fully vaccinated (2 dose primary schedule)	0.612	Ranzani, O. T. et al(2022) ²³					
Partly vaccinated (1 dose primary schedule)	0.157	Bermimgham, C, et al (2022) ¹⁶ Nunes, B, et al (2021) ¹⁹					
1 st Booster dose	0.90	Cerqueira-Silva, T. Et al (2022) ²² Ranzani, O. T. et al(2022) ²³ Jara, A. et all (2022) ²⁶ Menni, C et al (2022) ²⁵					

Table 3. Model estimates for deaths averted by COVID-19 vaccination, stratified by vaccine effectiveness ranges, with and without correction for under-reporting of deaths, during the study period. Selected countries in the Latin American and Caribbean Region.

		Medium Va	ccine Effectiveness	Low Vaccine Effectiveness		High Vaccine Effectiveness	
	Observed deaths	Estimated number of deaths, no vaccination	Estimated deaths averted	Estimated number of deaths, no vaccination	Estimated deaths averted	Estimated number of deaths, no vaccination	Estimated deaths averted
Region estimates							
Correction for underreporting	1,490,000	2,670,000	1,180,000	2,100,000	610,000	4,110,000	2,620,000
No correction for underreporting	1,050,000	1,920,000	870,000	1,500,000	450,000	3,010,000	1,960,000

Figure 1. Map showing 17 countries in the Latin American and Caribbean regions which were included in the modeling analysis. Included countries are shown in grey and excluded countries in white. Included countries are: Argentina, Brazil, Chile, Colombia, Paraguay, Uruguay, Jamaica, Peru, Belize, Bolivia, Costa Rica, Ecuador, El Salvador, Guatemala, Honduras, Mexico, and Venezuela.

Figure 2. Observed deaths (solid line) and model estimates for deaths without vaccination (dashed line) by age-group (60+: blue, 18-59: red) over time. A. Cumulative deaths over time, B. Incident deaths over time. The shaded grey area represents the range of deaths averted given range of vaccine effectiveness estimates.

Supplementary Figure 1. Observed deaths (solid line) and model estimates for deaths without vaccination (dashed line) by age-group (18-59: left , 60+: right panel) over time. A. Cumulative deaths over time, B. Incident deaths over time. No correction for underreporting of COVID-19 deaths.

Supplementary Figure 2. Incident observed deaths, per 100,000 population, (solid line) and model estimates for deaths without vaccination, per 100,000, (dashed line) by age-group (18-59: left , 60+: right panel) over time, by country.

Supplementary Figure 3. Incident observed deaths, per 100,000 population, (solid line) and model estimates for deaths without vaccination, per 100,000, (dashed line) by age-group (18-59: left , 60+: right panel) over time, by country. No correction for underreporting of COVID-19 deaths.

Supplementary Figure 4. Incident deaths averted per 100,000 population (vertical axis) plotted against vaccination coverage (two dose vaccination) (horizontal axis). A. Under 60 years of age, B. Over 60 years of age.





Correction for country–level estimated underreporting of COVID–19 mortality (Msemburi et al, 2023)

В

deaths



Correction for country-level estimated underreporting of COVID-19 mortality (Msemburi et al, 2023)