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6

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# Influence of the Covid-19 pandemic on cerebrovascular diseases in the Sao Paulo region of Brazil

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## Abstract

**Background** The rapid spread of covid-19 overwhelmed healthcare systems. This study aimed to investigate the impact of the covid-19 pandemic on hospitalizations and hospital deaths due to cerebrovascular diseases (CVD) in São Paulo state, Brazil.

**Methods** This ecologic study evaluated the CVD hospitalizations and hospital deaths (2017–2021) by demographic features and CVD type. During the pandemic (2020–2021), segmented regression models were used to detect changes in CVD trends. We also evaluated the detrended cross-correlation between CVD deaths and hospitalization with the SARS-Cov-2 infection series.

**Results** During the pandemic, there is a 35% reduction in CVD hospitalizations, mainly in elective admissions and ischemic stroke, but a 6.5% increase in deaths, especially in Black and Brown individuals, and those aged 20–29 years. From 2020 to 2021, Black and Brown individuals experience an earlier and more prolonged increase in hospital deaths. Ischemic CVD hospitalizations decrease in the first quarter of 2020. Older people exhibit a monthly increase of 2.9% in hospitalizations and 5.3% in deaths in the 2nd and 3rd quarters of 2021. SARS-Cov-2 infections are inversely correlated to CVD hospitalizations and directly correlated to CVD hospital deaths.

**Conclusions** Covid-19 pandemic negatively affects CVD hospitalizations and deaths, particularly in Black and Brown individuals. The decrease in hospitalizations and increase in hospital deaths of ischemic CVD highlights vulnerability in accessing healthcare resources during the pandemic.

#### Plain language summary

The Covid-19 pandemic temporally disrupted health services. We analyzed the impact of the pandemic on Cerebrovascular Diseases (CVD), which are diseases that affect blood flow in the brain. We looked at public hospital admissions and deaths recorded in São Paulo, the most populous and developed Brazilian state. There was a 35% reduction in hospitalizations and a 6.5% increase in deaths, especially in Black and Brown individuals, young and older adults, and those with CVD in which blood flow is reduced. Rising SARS-CoV-2 cases were associated with fewer CVD hospitalizations but more hospital deaths. These findings should be considered when planning how best to prevent CVDrelated hospital admissions and deaths during future pandemics.

Cerebrovascular disease (CVD) is one of the leading causes of disability and death globally<sup>1</sup>. According to Global Stroke Statistics, there are ~12.2 million new cases of CVD and 6.5 million deaths attributed to it each year worldwide<sup>2,3</sup>. Characterized by the rapid clinical development of signs and symptoms resulting from a focal or global brain disorder, with symptom duration exceeding 24 hours, potentially leading to death<sup>1</sup>. Several key factors contribute to the development of CVD, including a family history of this condition, Black individuals, age over 55 years, and modifiable clinical conditions such as diabetes and hypertension<sup>3–8</sup>.

Brazil ranks as the third country with the highest number of cases and deaths due to Covid-19 worldwide<sup>8-10</sup>. There are 87,518 deaths attributed to CVD in Brazil from January 1st to October 13th, 2022, an average of 12 deaths per hour or 307 fatalities per day<sup>7</sup>. São Paulo state, the largest metropolis in South America, records the first fatal case of SARS-CoV-2 infection in Brazil and remains at the top of the ranking for the highest incidence of this disease in the country. By August 12th, 2021, the state had 4,147,665 confirmed cases and 176,465 deaths<sup>8</sup>.

Given the severity of the pandemic, international initiatives implement contingency plans to expand testing and hospital beds<sup>11-13</sup>. The response to the Covid-19 pandemic in Brazil varies across the country, with different initiatives implemented at both national and local levels<sup>14,15</sup>. In São Paulo state, for example, sanitary measures and mobility restrictions are in place from March 2020 to December 2021, based on factors such as the availability of hospital beds in each municipality, case incidence, and the emergence of new variants of the SARS-CoV-2 virus<sup>8,16</sup>.

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Previous literature identifies a decrease in hospitalizations for CVD during the Covid-19 pandemic, accompanied by an increase in associated severity and mortality<sup>6,17–19</sup>. The hypotheses suggest that measures to control the transmission of Covid-19, such as mobility restrictions and disruption of healthcare services, may delay medical treatment and monitoring for chronic non-communicable conditions like diabetes and hypertension. Additionally, the immune response triggered by SARS-CoV-2 infection, including inflammatory reactions and coagulation disorders, may contribute to the development of CVD during the pandemic<sup>20–25</sup>.

In light of the global recognition of the necessity to reevaluate clinical decision-making and public policies in developing nations, particularly during public health emergencies like the Covid-19 pandemic, there is an imperative to implement optimal strategies for managing CVD<sup>13</sup>.

In this context, Brazil, with its vast geographical expanse and notable social disparities, maintains a hospital information system that rigorously documents all admissions and fatalities within the public sector<sup>5</sup>. This systematic approach, overseen by trained personnel, offers important benefits for gathering epidemiological data and conducting comprehensive assessments of diseases on a broad scale.

Considering the global impact of high mortality and disability from cardiovascular diseases (CVD), it is noteworthy that most national and international studies assessing hospitalizations and deaths from CVD are constrained to the early stages of the Covid-19 pandemic. This study seeks to address this gap by evaluating the influence of the Covid-19 pandemic on hospital admissions and deaths due to CVD in São Paulo, the most populous and principal economic hub in the Southern Hemisphere, spanning the period from 2017 to 2021.

This study reveals a 35% reduction in CVD hospitalizations, particularly in elective admissions and ischemic stroke, but a 6.5% increase in CVD-related deaths. The rise in deaths is especially pronounced among Black and Brown individuals and those aged 20-29 years. Additionally, SARS-CoV-2 infections are inversely correlated with CVD hospitalizations but directly linked to CVD-related deaths, highlighting the pandemic's impact on vulnerable populations and the need for targeted healthcare strategies.

#### Methods

This study is an ecological time series analysis conducted on monthly hospitalizations and deaths associated with CVD using data from the Hospital Information System (SIH) recorded in the São Paulo state, Brazil from January 2017 to December 2021.

Eligible CVD admissions and deaths were those coded as I60–I69 according to the International Statistical Classification of Diseases and Related Health Problems 10th revision (ICD-10) and classified as hemorrhagic (ICD-I60–I62), ischemic (ICD I63), unspecified (ICD I64), or other types (ICD I65–I69).

To gather a comprehensive profile of hospitalizations and deaths, we extracted the following variables: sex, age group, skin color, and type of admission (elective or emergency). Regarding the time of data collection, the skin color registration was already filled in the dataset through a closed-ended question, with five categories: White, Brown, Black, Yellow, and Indigenous, according to the Brazilian Institute of Geography and Statistics categorizations. The data were collected through the individual's self-declaration during hospital admission. However, since this data collection could involve individuals who can be unconscious, the individual's companion may answer this question at the time of medical admission. In cases where no companion is present, the healthcare professional is responsible for classifying the individual's ethnicity/skin color. SARS-CoV-2 infections reported to the State Data Analysis System Foundation (SEADE) of the state of São Paulo were laboratorial confirmed by molecular (RT-PCR), serological (IgM, IgA, or IgG), and antigen tests<sup>10,15</sup>.

To determine the periods of circulation restrictions, we used the monthly social isolation index of the Intelligent Monitoring System of São Paulo (SIMI-SP). This index represents the percentage of displacement between municipalities, with higher values indicating lower population displacement. The desirable social isolation index is considered to be equal to or greater than 45%.

#### Statistical analysis

The exploratory analysis included the examination of absolute and relative frequencies as well as minimum and maximum values. The data was stratified based on two distinct periods: before the pandemic (January 2017 to December 2019) and during the pandemic (February 2020 to December 2021). To calculate the annual average of hospitalizations or deaths, we considered three years in the pre-pandemic period and two years during the pandemic. The relative difference expressed as a percentage (%), was determined by comparing the average numbers between the pre-pandemic and pandemic periods, with the numerator being the difference and the denominator being the average number in the pre-pandemic period. Zero values indicated no change, negative results indicated a reduction, and positive values indicated an increase in CVD events.

To examine the temporal pattern of CVD hospitalizations and hospital deaths from January 2020 to December 2021, we performed Join Point segmented regression models (SRM) <sup>26</sup> with a negative binomial distribution with offset term. We performed models for the total events and stratified by skin color, age group, and CVD type (ischemic or hemorrhagic). These models allowed us to calculate the annual percentage changes (APC), along with their corresponding 95% confidence intervals (95% CI), of the absolute number of CVD hospitalizations and deaths for each time segment, with the null hypothesis being APC = 0, indicating an absence of variation in hospitalizations and deaths over time. Since month was the regression variable, the APC means a monthly percentage change<sup>26</sup>.

Considering better visualization/adjustment of the methodology for SRM analysis in skin color stratification, we only considered data from White, Brown, and Black individuals.

During the pandemic period (2020-2021), we built line graphs to visualize the time series of monthly CVD events (hospitalizations or deaths) in relation to the number of SARS-CoV-2 infections. The graphs depicted the onset and conclusion of SARS-CoV-2 waves and the social isolation index. Subsequently, we calculated the Detrended Cross-Correlation (DCC) test coefficient (95% CI)<sup>27</sup> to determine the unbiased correlation between the CVD series (hospitalizations or deaths) and the incidence of SARS-CoV-2. The DCC test (two-sided test) yields values ranging from -1 to 1, with zero indicating no correlation, positive values denoting a simultaneous increase in CVD and SARS-CoV-2 events, and negative values indicating an inverse correlation.

We performed the analyses using the libraries 'tseries', 'mgcv' and 'segmented\_ $2.1-3^{128-30}$  of the free software R, version  $4.4.1^{31}$ .

#### Ethical aspects

This study utilized publicly available anonymous data and did not require ethical approval of the Ethics Committee. The research was registered under number 1698 in the Institutional Research Management System of the Evandro Chagas National Institute of Infectious Diseases at the Oswaldo Cruz Foundation.

### **Reporting summary**

Further information on research design is available in the Nature Portfolio Reporting Summary linked to this article.

#### Results

Between January 2017 and December 2021, there were 277,272 CVD hospitalizations (monthly median = 4042, minimum = 2083, maximum = 4716) and 42,004 CVD hospital deaths (monthly median = 560, minimum = 453, maximum = 891).

Comparing the average numbers/year of CVD hospitalizations and deaths in the pre-pandemic (2017–2019) and during pandemic (2020–2021) periods, we observed a decrease in the average annual difference for hospitalizations (-34.8%, mean number/pre-pandemic year = 49422.7 and mean number/year during pandemic = 32,251) an increase in

the average annual number of hospital deaths (6.5%, mean number/year pre-pandemic = 8371 and mean number/year during pandemic = 8917).

Table 1 displays the distribution of CVD hospitalizations and deaths categorized by demographic and clinical characteristics, as well as the pre and during pandemic periods. The data reveals a higher prevalence of men, individuals with White skin color, those over 50 years of age, emergency admissions, and unspecified types of CVD.

When comparing the two periods, it was evident that the average annual number of hospitalizations decreased across all characteristics, with high reductions observed in skin color not informed (-43.9%), ischemic CVD type (-50.3%), and elective hospitalizations (-85.5%). Conversely, there was a proportional increase in the average number of deaths in nearly all analyzed subgroups, particularly among Black or Brown individuals (15.9% and 14.4%, respectively), as well as individuals aged 20-29 years and 70-79 years (14.2% and 10.3%, respectively). Notably, ischemic-type CVD showed an increase in deaths during the pandemic (10.8%), despite a decrease in hospitalizations.

Figure 1 illustrates the monthly percentage change in CVD hospitalizations (Fig. 1A) and deaths (Fig. 1B) from January 2020 to December 2021. We could observe a significant increase in the monthly percentage change from early 2021, specifically February 2021 for hospitalizations (APC = 2.5; CI = 1.43|3.62) and March 2021 for hospital deaths(APC = 3.7, CI = 1.50|6.08), followed by a decline from July/2021 for deaths (APC = -4.5, CI = -6.06|-3.09).

We observed significant variations in all periods for hospitalizations and deaths in the age group over 60 years (Fig. 2). This age group exhibited a reduction in the absolute number of hospitalizations until March 2021, followed by an increasing trend of hospitalizations between March and October 2021 (APC = 2.8, CI = 1.56|4.20), and a subsequent decline from October 2021 (APC = -34.2, CI = -40.34|-27.44). In contrast, for individuals aged under 60 years, the decline in hospitalizations began at a lower level and earlier, in October 2020 (APC = 1.47, CI = -2.84|-0.07) (Fig. 2A).

Regarding deaths (Fig. 2B), similar patterns to the hospitalization series were observed (Fig. 2A), with a decline starting from August 2021 for those over 60 years old (APC = -20.3, CI = -22.45|-18.10) and from October 2021 for those under 60 years old (APC = -47.97, CI = -56.41|-37.89).

Throughout the analyzed period (Fig. 3), the White group consistently displayed higher number of hospitalizations and deaths compared to Black and Brown individuals. Between March and October 2021 (Fig. 3A), both populations experienced similar increases in hospitalizations (APC White = 2.5, CI 1.19|4.01; APC Black and Brown = 2.3, CI = 0.99|3.63), followed by a decline from October 2021 (APC White = -33.3, CI = -40.04|-25.92; APC Black and Brown = -38.85, CI = -44.68|-32.40). However, the increase in deaths among Black and Brown people began earlier and persisted longer than in White individuals, spanning from March 2020 to September 2021 (APC = 0.91, CI = 0.53|1.28). Notably, the decline in deaths for the Black and Brown group commenced 1 month after the decline observed in the White group, September 2021 for Black and Brown(APC = -16.9 CI -20.28|-13.51), and August 2021 for White (APC = -18.4, CI = -20.72|-16.01) (Fig. 3B).

Regarding the type of CVD (Fig. 4), a significant decline in hospitalizations of the ischemic type was observed in the initial months of the Covid-19 pandemic until March 2020 (APC = -23.5, CI = -31.49|-14.68), followed by a significant decline between August 2021 and December 2021 for ischemic (APC -4.5, CI = -8.02|-1.02) and hemorrhagic (APC = -15.0, CI = -17.99|-11.90) hospitalizations (Fig. 4A).

For deaths, we observed significant declines between August 2021 and December 2021 in hemorrhagic classification (APC = -14.9, CI = -20.08|-9.44) and September 2021 and December 2021 for ischemic classification (APC = -25.0|CI = -38.77, -8.26) (Fig. 4B).

Figures 5 and 6 illustrate the monthly time series of SARS-CoV-2 infections, CVD hospitalizations, and hospital deaths during the pandemic (February 2020 to December 2021). A negative cross-correlation was observed between the hospitalization series and SARS-CoV-2 (p value = 0.02; correlation = -0.54; 95%CI -0.820|-0.071) and a

positive correlation between the hospital deaths series and SARS-CoV-2 (p value = 0.05; correlation=0.40; 95%CI 0.025|0.691), especially evident during the second wave of the pandemic (Jan to Aug/2021).

#### Discussion

The present study revealed an important reduction of ~35% in CVD hospitalizations during the pandemic period (2020–2021) in São Paulo state, primarily observed in elective, ischemic, and unspecified CVD. Conversely, there was an approximate 6% increase in hospital deaths, particularly among Black and Brown individuals, youth and elderly, and those with ischemic CVD. Furthermore, as the number of SARS-CoV-2 infections increased, there was a tendency for a decrease in CVD hospitalizations.

The reduction observed in elective hospitalizations and cases of ischemic CVD, coupled with the simultaneous increase in deaths, can be attributed to challenges faced in accessing healthcare services during the pandemic. In 2021, the disease control coordination of the state of São Paulo published a report highlighting the disruption in the provision of care for chronic non-communicable diseases (CNCD) during the Covid-19 pandemic. According to the report, there was an alarming increase in the premature mortality rate from CNCDs, rising from 35.2 to 50.8 per 100,000 inhabitants in the state of São Paulo. This increase was primarily due to a 72% reduction in outpatient services as per the state's guidelines, leading to an impact on healthcare access and continuity of care for CNCDs<sup>32</sup>.

Supporting this hypothesis, Siegler et al.<sup>24</sup> attributed the reduction in CVD diagnosis during the pandemic to potential delays in initial care caused by circulation restrictions and strain on the healthcare system, including the limited bed availability and emergency care capacity. Consequently, the increase in CVD severity and mortality at the onset of the pandemic has been extensively discussed in the literature, prompting calls for further investigations into the long-term impact<sup>6,19</sup>.

This discourse gains additional support from the findings presented by Rocha et al.<sup>33</sup>, which highlight the increase in the number of intensive care beds across various municipalities following the onset of the pandemic. However, despite this augmentation, a decline in CVD hospitalizations was observed. The rise in CVD-related deaths occurring at home and other locations, as suggested by Orellana et al.<sup>34,35</sup>, Brant et al.<sup>36</sup> and the Mortality Information System (MIS, 2021), may indicate potential delays in initial care due to circulation restrictions and strain on the healthcare system. This underscores the importance of incorporating this variable into future studies examining the location of CVD deaths during the Covid-19 pandemic.

Additionally, during the first year of the pandemic (2020), internal migration may have impacted hospitalizations and deaths related to COVID-19 and CVD. However, Lorenz et al.<sup>37</sup> highlighted that internal migration within São Paulo state primarily involved a minority of high-income individuals. This underscores the importance of incorporating these variables into future studies examining the location of CVD deaths and the impact of migration during the Covid-19 pandemic.

Despite a similar reduction in CVD hospitalizations across all ethnic groups, there was a notable increase in hospital deaths among Black or Brown individuals during the pandemic compared to the White group. These results are in accordance with previous Brazilian studies that have consistently found higher CVD mortality rates among Black and Brown individuals<sup>4,38</sup>. These findings align with similar studies conducted in North America, which examined the effects of social resources on stroke survivors in New York and racial disparities in ischemic stroke subtypes in Los Angeles<sup>39,40</sup>. The more considerable increase in the average number of deaths among Black and brown individuals, as observed in our study, may reflect the heightened severity of the disease, potentially stemming from socioeconomic disadvantages and limited access to healthcare services, which might have been exacerbated during the Covid-19 pandemic<sup>6,19,41</sup>.

The observed increase in the average number of CVD deaths among the elderly aligns with previous findings that indicate higher mortality rates with advancing  $age^{7}$ . In contrast, we observed a 14% increase in deaths among young individuals aged 20 to 29 years, particularly in the ischemic

		Hospitalizations	izations							Hospital deaths	deaths						
		Total	Pre-pan	Pre-pandemic ( <i>N</i> = 212,770)	12,770)	During p	During pandemic (N = 64,502)	= 64,502)		Total	Pre-pan	Pre-pandemic (N = 24,170)	,170)	During	During pandemic (N = 17,834)	= 17,834)	
		z	2	%	Annual avera- ge <sup>1</sup>	<u>د</u>	%	Annual avera- ge <sup>2</sup>	$\Delta^3$	z	5	%	Annu- al avera- ge <sup>1</sup>	2	%	Annu- al avera- ge <sup>2</sup>	Δ <sup>3</sup>
Sex	Male	111,592	77,905	52.5	25968.3	33,687	52.2	16843.5	-35.1	22,084	12871	51.2	4290.3	9213	51.6	4606.5	7.4
	Female	101,178	70,363	47.5	23454.3	30,815	47.8	15407.5	-34.3	2086	12,242	48.8	4080.7	8621	48.4	4310.5	5.6
Skin color group	White	116,077	81,214	54.7	27071.3	34,863	54.0	17431.5	-35.6	2307	13,716	54.6	4572.0	9591	53.8	4795.5	4.9
	Black	13,716	9332	6.3	3110.7	4384	6.8	2192	-29.5	2588	1460	5.8	486.7	1128	6.3	564	15.9
	Brown	48,326	32,611	21.1	10870.3	15,715	24.4	7857.5	-27.7	10,055	5704	22.7	1901.3	4351	24.4	2175.5	14.4
	Yellow	2012	1360	0.9	453.3	652	1.0	326	-28.1	437	256	1.0	85.3	181	1.0	90.5	6.1
	Indigenous	29	20	0.1	6.7	6	0.1	4.5	-32.5	4	3	0.0	1.0	-	0.0	0.5	-50.0
	Uninformed	32,610	23,731	16.0	7910.3	8879	13.7	4439.5	-43.9	42,947	3974	15.8	1324.7	2582	14.5	1291	-2.5
CVD type⁴	Hemorrhagic	31,798	21,390	14.4	7130.0	13,408	19.6	6704	-6.0	10,120	5976	23.9	1992.0	4014	23.1	2007	0.8
	Ischemic	27,298	18,251	12.2	6083.7	6047	8.9	3023.5	-50.3	7020	3988	15.9	1329.3	2947	17.0	1473.5	10.8
	Unspecified	138,844	95,622	64.0	31874.0	43,222	63.1	21,611	-32.2	24,215	14,107	56.3	4702.3	9826	56.6	4913	4.5
	Other	198,24	14,108	9.4	4702.7	5716	8.4	2858	-39.2	1592	976	3.9	325.3	567	3.3	283.5	-12.9
Age group	0-14 years	1077	736	0.5	245.3	341	0.5	170.5	-30.5	75	44	0.2	14.7	31	0.2	15.5	5.7
	15-19 years	828	589	0.4	196.3	239	0.4	119.5	-39.1	83	58	0.2	19.3	25	0.1	12.5	-35.3
	20-29 years	3195	2179	1.4	726.3	1016	1.5	508	-30.1	317	180	0.7	60.0	137	0.8	68.5	14.2
	30-39 years	7897	5491	3.7	1830.3	2406	3.3	1203	-34.3	1106	667	2.7	222.3	439	2.5	219.5	-1.3
	40-49 years	19,539	13,448	9.0	4482.7	6091	9.3	3045.5	-32.1	3097	1816	7.2	605.3	1281	7.2	640.5	5.8
	50-59 years	38,499	26,918	18.1	8972.7	11,581	17.9	5790.5	-35.5	6183	3617	14.4	1205.7	2566	14.4	1283	6.4
	60-69 years	56,327	39,294	36.5	13098.0	17,033	26.4	8516.5	-35.0	10,131	5978	23.8	1992.7	4153	23.3	2076.5	4.2
	70-79 years	50,120	34,958	23.6	11652.7	15,162	23.5	7581	-34.9	11,026	6355	25.3	2118.3	4671	26.2	2335.5	10.3
	>80 years	35,288	24,655	16.6	8218.3	10,633	16.5	5316.5	-35.3	10,929	6398	25.5	2132.7	4531	25.4	2265.5	6.2
Hospitalization type	Elective	13,373	12,193	8.2	4064.3	1180	1.8	290	-85.5								
	Urgency	211,590	136,075	91.8	45358.3	63,322	98.2	31,661	-30.2								

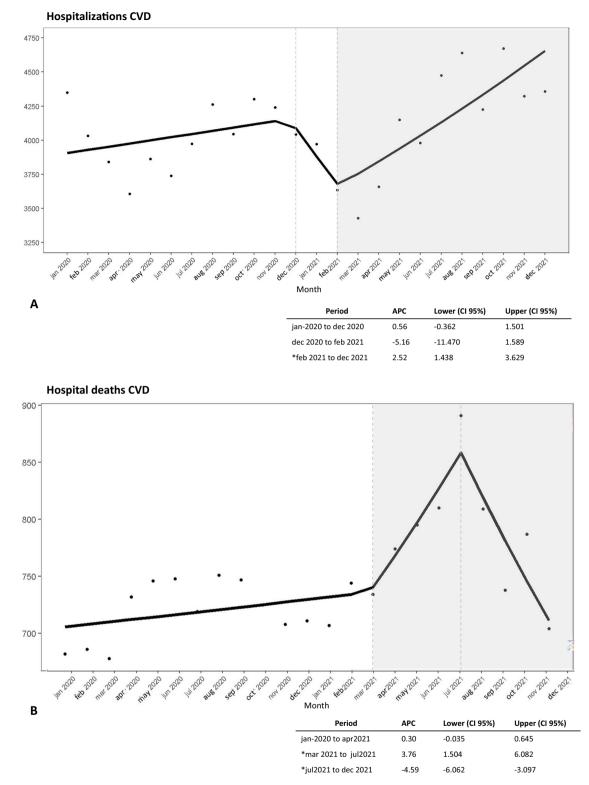


Fig. 1 | Monthly trends in hospitalizations and hospital deaths from cerebrovascular disease (CVD) in São Paulo, Brazil (January 2020–December 2021). A Time series of CVD hospitalizations. B Time series of CVD hospital deaths. Note: gray area = significant APC values; Dataset: Supplementary Data 1.

subtype. This unpredicted finding could potentially be attributed to the thromboembolic effects associated with Covid-19 $^{6,42-44}$ .

Conversely, Lorenz et al.<sup>37</sup> associated the start of the vaccination campaign for the elderly (January 2021) and the relaxation of circulation restriction measures with an increase in Covid-19 deaths in the younger population (aged 20 to 59 years). In this context, Freitas et al.<sup>45</sup> analyzed that

different variants could alter the pattern of Covid-19 mortality among age groups, as well as change its profile of pathogenicity and virulence.

The unexpected findings of increased mortality from CVD in young individuals warrant further investigation into the pathophysiology of CVD in this specific age group, considering its subtype, risk factors, and the particularities of COVID-19 in this population.

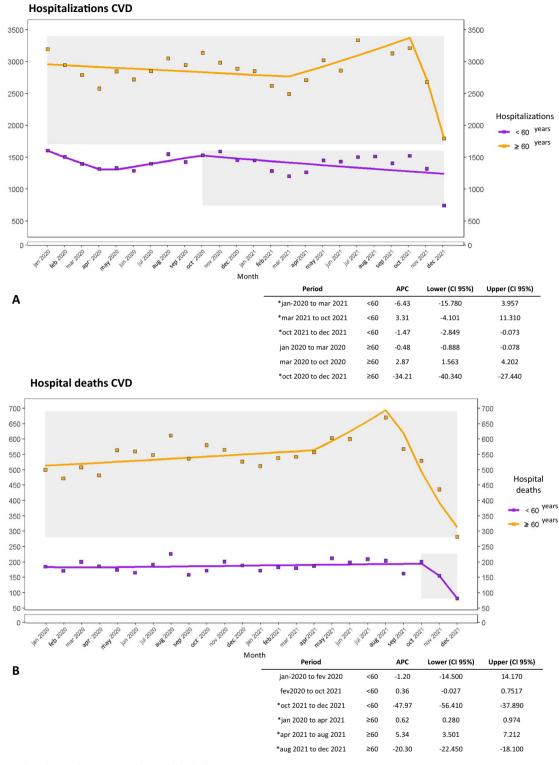


Fig. 2 | Monthly trends in hospitalizations and hospital deaths from cerebrovascular disease (CVD), stratified by age group, in São Paulo, Brazil (January 2020–December 2021). A Time series of CVD hospitalizations by age group. **B** Time series of CVD hospital deaths by age group. Note: gray area = Significant APC values; dataset: supplementary data 2–5; Script analysis: Supplementary Data 6.

Additionally, socioeconomic factors may have played a role, as many young individuals lost their jobs during the pandemic, with this age group often being considered economically active<sup>46,47</sup>. The impact of deaths among economically active individuals in the most populous state of Brazil could compromise the workforce of a region that functions as the country's largest economic center.

When examining the monthly percentage changes in CVD hospitalizations and hospital deaths during the Covid-19 pandemic, we identified an increase in both outcomes among individuals aged 60 years or more, a reduction in hospitalizations among the White population, and an increase in deaths among the Black and Brown populations during the corresponding period in 2020. Previous literature emphasized the importance of

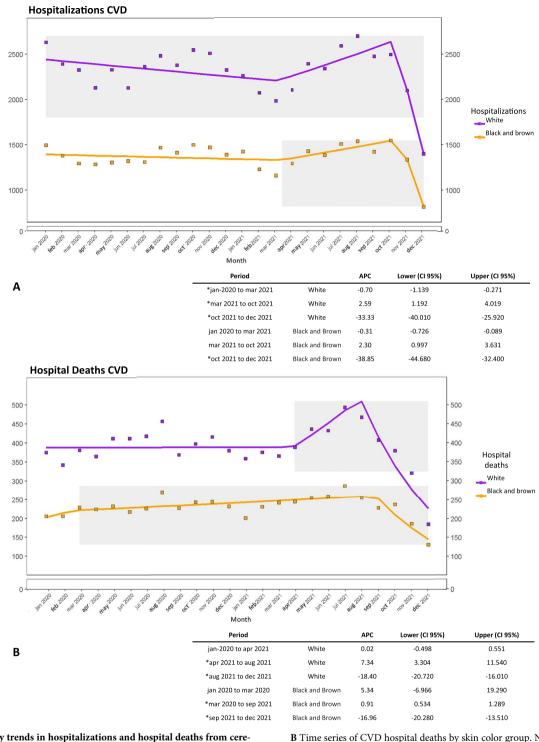


Fig. 3 | Monthly trends in hospitalizations and hospital deaths from cerebrovascular disease (CVD), stratified by skin color, in São Paulo, Brazil (January 2020–December 2021). A Time series of CVD hospitalizations by skin color group. **B** Time series of CVD hospital deaths by skin color group. Note: gray area = significant APC values; dataset: supplementary data 7–10; script analysis: supplementary data 11.

equitable access to information and healthcare resources for vulnerable populations during the pandemic. Santos et al.<sup>48</sup> highlighted the impact of Covid-19 containment efforts in the context of socioeconomic and racial inequality, particularly in the first pandemic year.

In 2021, there was a significant overall increase in monthly percentage change in CVD hospitalizations, albeit with delays in increments among different age strata and Black and Brown individuals. Several contributing factors could be considered for the global increase, such as the reorganization of the healthcare system after the first year of the pandemic with more available hospital beds<sup>48,49</sup>, the use of telemedicine for clinical management of covid-19 mild cases<sup>50,51</sup>, flexibilization in circulation restriction measures<sup>52,53</sup>, and the potential impact of new virus variants and immunization against Covid-19 on the clinical manifestation of CVD<sup>54-57</sup>.

The association between SARS-CoV-2 infection and CVD hospitalizations and deaths appears to exist, predominantly observed during periods of higher incidence of SARS-Cov-2 infection, such as the second wave in the beginning of 2021. The available literature is scarce regarding CVD trends throughout 2020 and 2021. However, there were descriptions from the early



Fig. 4 | Monthly trends in hospitalizations and hospital deaths from cerebrovascular disease (CVD), stratified by classification type, in São Paulo, Brazil (January 2020–December 2021). A Time series of CVD hospitalizations by

classification type. **B** Time series of CVD hospital deaths by classification type. Note: Gray area = Significant APC values; dataset: supplementary data 12–15; script analysis: supplementary data 16.

periods of 2020 that support our findings, emphasizing the importance of continued observation over time<sup>23,25,58,59</sup>.

In this scenario, there is an international acknowledgment of the need to reassess clinical decision-making and public policies in developing countries, aiming to implement best practices in managing CVD when dealing with public health crises, such as the covid-19 pandemic<sup>13,46,59</sup>. It is crucial to investigate socioeconomic indicators, regional and ethnic

disparities in healthcare coverage and access, and the continuity of care for chronic non transmissible diseases (CNCD) during pandemic situations, closely linked to CVD incidence and mortality.

It is important to acknowledge the limitations of this study. Firstly, the hospital information system, primarily designed for financial purposes, may have been prone to underreporting. This potential underreporting, along with delays in notifications, could explain sudden drops observed in the



Fig. 5 | Time series of SARS-CoV-2 infection cases and cerebrovascular disease (CVD) hospitalizations in São Paulo, Brazil (February 2020–December 2021). Black circle: period of social isolation greater than 45%. Blue area: first wave of SARS-CoV-2 infections. Orange area: second wave of SARS-CoV-2 infections. Blue line:

hospital deaths due to cerebrovascular disease (CVD). Orange line: cases of SARS-CoV-2 infection. Green triangle: start date of COVID-19 vaccination. Note: p value = 0.05; correlation coefficient = 0.40; Confidence interval = 0.025|0.691; dataset: supplementary data 1.

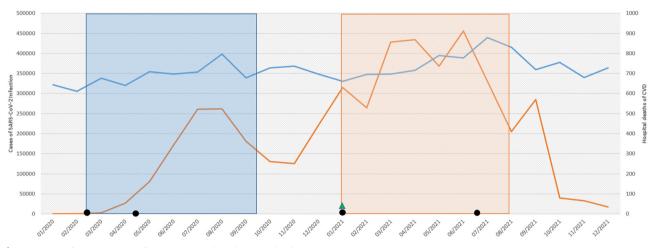


Fig. 6 | Time series of SARS-CoV-2 infection cases and cerebrovascular disease (CVD) hospital deaths in São Paulo, Brazil (February 2020–December 2021). Black circle: period of social isolation greater than 45%. Blue area: first wave of SARS-CoV-2 infections. Orange area: second wave of SARS-CoV-2 infections. Blue line:

hospital deaths due to cerebrovascular disease (CVD). Orange line: cases of SARS-CoV-2 infection. Green triangle: start date of COVID-19 vaccination. Note: p value = 0.02; correlation coefficient = -0.54; confidence interval: -0.820|-0.071; dataset: supplementary data 1.

stratified pattern during the last quarter of 2021 for all evaluated outcomes. Secondly, our results might be affected by completeness failures due to the large volume of data during the pandemic.

The elevated number of events attributed to unspecified CVD could be a result of this scenario. However, São Paulo boasts a high-quality standard of routinely-collected data, such as the hospital information system. The study's sample size and time series surpassed that of previous studies, most of which were conducted in the early stages of the pandemic or at local healthcare units.

The third limitation concerns the use of raw data stratified by age instead of age-standardized rates in the descriptive analyses. From 2015 to 2020, population estimates and censuses in the state of São Paulo showed a proportional increase in the population aged 60 years and older, from 13.2% to 15.3%, respectively<sup>60,61</sup>. Despite the results not being presented by standardized rates, we found a proportional reduction in the raw values of hospitalizations and hospital deaths across all age groups.

Furthermore, there is acknowledgment in the literature of the need to investigate CVDs during the Covid-19 pandemic. However, studies have

focused on the early stages of the pandemic<sup>17,20</sup> or on local healthcare services with smaller populations in comparison to the state of São Paulo<sup>21,23</sup>. Our study makes a valuable contribution by taking these challenges in a wider and more densely populated setting.

Based on our findings, the Covid-19 pandemic may have influenced a reduction in hospitalizations for CVD, with an increase in hospital deaths over the study period. In 2021, there were improvements in healthcare due to vaccination, restructuring of the health system, and follow-up of CNCDs. Despite this improvement in 2021, we can still identify the most affected subgroups and highlight disparities in deaths based on skin color, as well as a higher occurrence among youth and the elderly. The elevated proportion of unspecified CVD also suggests a vulnerability in accessing health resources, exacerbated by the Covid-19 pandemic.

These findings enrich the existing knowledge base, especially for the most influential state in Latin America, and can provide valuable insights for future actions in management of CVDs, which is particularly relevant considering the potential emergence of new outbreaks of Covid-19 and other pandemics.

## Data availability

The data on eligible CVD admissions and deaths is anonymous and publicly available on the website https://tabnet.datasus.gov.br/, accessed on 02/15/2023. SARS-CoV-2 infection records reported to the State Data Analysis System Foundation (SEADE) are freely available at https://www.seade.gov.br/coronavirus/, accessed on 11/15/2022. The periods of circulation restrictions are publicly available at https://www.saopaulo.sp. gov.br/coronavirus/isolamento/, accessed on 11/15/2022. The source data for Figs. 1, 5, and 6 is in Supplementary Data 1. The source data for Fig. 2 is in Supplementary Data 2–5. The source data for Fig. 3 is in Supplementary Data 7–10. The source data for Fig. 4 is in Supplementary Data 12–15.

## Code availability

The script analysis for Fig. 2 is in Supplementary Data 6. The script analysis for Fig. 3 is in Supplementary Data 11. The script analysis for Fig. 4 is in Supplementary Data 16.

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## Author contributions

R.T.A. and R.V.C.O.: contributed to the conception and design of the study, acquisition and analysis of data, drafting the text, and preparing the figures. Y.H.M.H. contributed to the conception and design of the study, analysis of data, and drafting of the text.

# **Competing interests**

The authors declare no competing interests.

## **Additional information**

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