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1 Combined association of obesity and other cardiometabolic diseases with severe COVID-19

- 2 outcomes: a nationwide cross-sectional study of 21,773 Brazilian adult and elderly inpatients
- 3 Natanael J Silva, MSc^{1,2}; Rita C Ribeiro-Silva, PhD^{1,2,3}; Andréa JF Ferreira, MSc^{1,2,4}; Camila SS
- 4 Teixeira, MSc^{1,2,4}; Aline S Rocha, MSc^{1,2,3}; Flávia Jôse O Alves, MSc^{1,2,4}; Ila R Falcão, PhD²;
- 5 Elizabete J Pinto, PhD^{2,5}; Carlos Antônio ST Santos, PhD^{1,2,6}; Rosemeire L Fiaccone, PhD^{1,2,7}; Maria
- 6 Yury T Ichihara, MD PhD^{1,2}; Enny S Paixão, PhD^{1,2,8}; Mauricio L Barreto, MD PhD^{1,2,4}
- ¹ Rede CoVida, Salvador, BA, Brazil
- 8 ²Centre for Data and Knowledge Integration for Health, Oswaldo Cruz Foundation, Salvador, BA, Brazil
- ³ School of Nutrition, Federal University of Bahia, Salvador, BA, Brazil
- ⁴ Institute of Collective Health, Federal University of Bahia, Salvador, BA, Brazil
- ⁵Center for Health Sciences, Federal University of Recôncavo da Bahia, Santo Antônio de Jesus, BA, Brazil
- ⁶Department of Exact Sciences, State University of Feira de Santana, Feira de Santana, BA, Brazil
- ¹³ ⁷ Institute of Mathematics and Statistics, Federal University of Bahia, Salvador, BA, Brazil
- ⁸ Epidemiology and Population Health, London School of Hygiene and Tropical Medicine, London, UK
- 15 Corresponding author: Natanael J Silva. Centre for Data and Knowledge Integration for Health,
- 16 Oswaldo Cruz Foundation. Edf. Tecnocentro, Sl 315. Rua Mundo, 121. Trobogy, Salvador, BA,
- 17 41745-715, Brazil. Phone number: +55 79 99839-3991. Email: <silva_natanael@hotmail.com>.
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20 Abstract

21 **Objectives**: To investigate the combined association of obesity, diabetes mellitus (DM), and 22 cardiovascular disease (CVD) with severe COVID-19 outcomes in adult and elderly inpatients. 23 Design: Cross-sectional study based on registry data from Brazil's influenza surveillance system. 24 Setting: Public and private hospitals across Brazil. 25 **Participants:** Eligible population included 21,942 inpatients aged \geq 20 years with positive RT-PCR test for SARS-CoV-2 until Jun 9th, 2020. 26 27 Main outcome measures: Severe COVID-19 outcomes were non-invasive and invasive mechanical 28 ventilation use, ICU admission, and death. Multivariate analyses were conducted separately for adults 29 (20-59 years) and elders (\geq 60 years) to test the combined association of obesity (without and with 30 DM and/or CVD) and degrees of obesity with each outcome. 31 Results: A sample of 8,848 adults and 12,925 elders were included. Among adults, obesity with DM 32 and/or CVD showed higher prevalence of invasive (PR 3.76, 95%CI 2.82-5.01) and non-invasive 33 mechanical ventilation use (2.06, 1.58-2.69), ICU admission (1.60, 1.40-1.83), and death (1.79, 1.45-34 2.21) compared with the group without obesity, DM, and CVD. In elders, obesity alone (without DM 35 and CVD) had the highest prevalence of ICU admission (1.40, 1.07-1.82) and death (1.67, 1.00-2.80). 36 In both age groups, obesity alone and combined with DM and/or CVD showed higher prevalence in all outcomes than DM and/or CVD. A dose-response association was observed between obesity and 37 38 death in adults: class I 1.32 (1.05-1.66), class II 1.41 (1.06-1.87), and class III 1.77 (1.35-2.33). 39 Conclusions: The combined association of obesity, diabetes, and/or CVD with severe COVID-19 outcomes may be stronger in adults than in elders. Obesity alone and combined with DM and/or CVD 40 41 had more impact on the risk of COVID-19 severity than DM and/or CVD in both age groups. The study also supports an independent relationship of obesity with severe outcomes, including a dose-

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43 response association between degrees of obesity and death in adults.

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44 Article summary

45 Strengths and limitations of this study:

46	٠	This is the first study that describes the independent and combined relationship of obesity
47		with COVID-19 severity in Brazil, one of the biggest epicenters of the pandemic worldwide.
48	•	The study was based on registry data of a large nationwide sample of patients admitted, due
49		to severe SARS-CoV-2 infection, to public and private hospitals across the country.
50	•	The large sample size and data availability allowed us to analyze the combined association of
51		obesity, diabetes and cardiovascular disease with severe COVID-19 outcomes, separately by
52		age groups and controlled by important confounding variables, e.g. underlying comorbidities.
53	•	The cross-sectional study design does not allow causal inference, and generalization of results
54		must be cautious since only hospitalized cases of severe COVID-19 were included.
55	•	As the study used routinely collected data, which has not been designed primarily for research
56		purposes, it may bring well-known limitations related to missing, underestimation, and

57 potential misclassification.

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58 Introduction

The coronavirus disease 2019 (COVID-19) pandemic, caused by the severe acute respiratory 59 60 syndrome coronavirus 2 (SARS-CoV-2), as of 13 May 2021, has already reached more than 160 61 million infected people and more than 3.3 million deaths in all continents.¹ Individuals with advanced age and chronic diseases, including cardiometabolic diseases, are considered groups at major risk for 62 complications and severe illness from COVID-19.^{2,3} Obesity has been shown as an independent risk 63 factor for COVID-19 disease.⁴⁻⁶ High body mass index (BMI) has been mentioned as a significant 64 risk factor for COVID-19, according to early clinical reports from China,⁷ Italy,⁸ France,⁹ Mexico,¹⁰ 65 and United States of America.¹¹ Several studies have demonstrated that obesity is leading to 66 considerably worse COVID-19 outcomes, especially greater risk of hospital and intensive care unit 67 68 (ICU) admission, invasive mechanical ventilation, and death.¹¹⁻¹⁴ The COVID-19 pandemic is rapidly spreading worldwide, especially in the Americas, where obesity 69

is already a prevalent and important public health problem.¹⁵⁻¹⁶ Brazil is currently one of the biggest 70 71 epicenters of the COVID-19 pandemic worldwide, with more than 15.2 million cases and 425 72 thousand deaths until May 13, 2021.¹ In 2018, the prevalence of adult overweight and obesity in Brazil was estimated at 55.7% and 19.8%, respectively.¹⁷ This obesogenic profile of the Brazilian 73 74 population contributes, among other factors, to the high prevalence of obesity-related diseases such as type 2 diabetes mellitus (DM) and cardiovascular diseases (CVD), in the country.¹⁸ The fact that 75 76 individuals with obesity also have more comorbidity diseases, which are either risk factors for COVID-19 severity and death, makes obesity particularly ominous in COVID-19 disease.¹⁰⁻¹³ 77

Several characteristics that can influence the clinical evolution of individuals infected with COVID-19, such as obesity, have been independently documented.^{5-6,19} However, evidence is yet unclear on the combined effect that obesity and obesity-related comorbidities play in COVID-19 severity, especially, in different age groups. We aimed in this study to investigate the combined association of obesity, diabetes, and cardiovascular disease with mechanical ventilation use, ICU admission, and

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death in a large sample of adult and elderly patients hospitalized with COVID-19 in Brazil. We also
explored the independent association between degrees of obesity and the mentioned outcomes.

85 Methods

86 Study Design and Population

87 This is a cross-sectional study based on registry data from SIVEP-Gripe (Sistema de Informação de Vigilância Epidemiológica da Gripe), an influenza surveillance system of Brazil's Ministry of Health. 88 89 The study used the publicly available dataset of SIVEP-Gripe, which includes de-identified data on cases of severe acute respiratory syndrome across public and private hospitals in Brazil.²⁰ These data 90 91 were obtained through the Rede CoVida's integrated data platform that has been built with official, 92 open, and authorized data for the production of knowledge about the COVID-19 pandemic. Our study 93 population was composed of patients aged 20 years or older, hospitalized for severe acute respiratory 94 syndrome, with positive RT-PCR test for SARS-CoV-2, and final diagnosis for COVID-19 until Jun 95 9th, 2020. Only cases with complete data on demographic characteristics and comorbidities and plausible BMI values were included in the study. 96

97 The study was conducted according to the guidelines laid down in the Declaration of Helsinki. As the 98 study exclusively used publicly available de-identified data, ethics approval by a research ethics 99 committee and informed consent are waived per Resolution n. 466/2012 of the National Health 100 Council of Brazil's Commission of Ethics in Research.

101 Exposure Variable

102 Obesity was defined as BMI equal to or greater than 30 kg/m^2 , according to the cutoff points proposed 103 by the World Health Organization²¹ and the Pan American Health Organization²² for adults and 104 elders, respectively. BMI was calculated by health professionals in the hospital from directly 105 measured or patient self-reported height and weight. Guidelines for the collection and analysis of 106 anthropometric data in health services have been previously standardized by the Ministry of Health.²³ 107 BMI values <12 or >70 kg/m² were considered implausible and excluded.²⁴ Information on the

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108 existence of diabetes and any chronic cardiovascular disease was obtained from dichotomous
 109 questions (yes/no), which were answered based on patient or family's report or medical diagnosis.

110 We created a polytomous four-category variable to evaluate the separate and combined exposure of obesity, diabetes and cardiovascular disease: none/reference (no existence of obesity, diabetes and 111 112 cardiovascular disease), OB (only existence of obesity), OB + DM and/or CVD (existence of obesity with diabetes and/or cardiovascular disease), and DM and/or CVD (existence of diabetes and/or 113 114 cardiovascular disease). We also analyzed obesity in adults according to the following degrees of severity based on WHO reference²¹: no obesity ($<30 \text{ kg/m}^2$), obesity class I ($\geq 30-34.9 \text{ kg/m}^2$), obesity 115 class II (> 35-39.9 kg/m²), and obesity class III (> 40 kg/m²). Due to the unavailability of BMI cutoff 116 117 points to classify the degree of obesity in elders, this analysis was only performed for adults.

118 Outcome Variables

The severe COVID-19 outcomes were mechanical ventilation use, ICU admission, and death. Information on the use of mechanical ventilation by the patient was obtained and analyzed as a polytomous three-category variable (no use/ use of non-invasive ventilation/ use of invasive ventilation). ICU admission was obtained and analyzed as a dichotomous variable (no/ yes). Death was analyzed as a dichotomous variable based on the patient's endpoint outcome (cure/ death).

124 Covariates

Demographic and comorbidity information were selected as descriptive and confounding variables.² Age in years was calculated from birth and notification dates. Sex was obtained as a dichotomous variable (female/ male). The preexistence of each comorbidity was also obtained as a dichotomous variable (no/ yes): chronic pulmonary disease, asthma, chronic kidney disease, chronic hematologic disease, neurological disease, chronic liver disease, and immunodeficiency/ immunosuppression.

130 Statistical Analysis

All analyses were subdivided into adults (≥ 20 and < 60 years) and elders (≥ 60 years). For descriptive analyses, absolute and relative frequencies were calculated for the demographic and comorbidity

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133 variables according to the main exposure variable. Multinomial logistic regression models were 134 conducted to test the association of obesity (without and with diabetes and/or CVD) with non-invasive and invasive mechanical ventilation use. To test the association of this exposure variable with ICU 135 136 admission and death, simple logistic regression models were performed. Same models were analyzed considering the degree of obesity as the main exposure variable for adults. Crude and adjusted 137 138 estimates were interpreted based on the prevalence ratio (PR) and 95% confidence intervals (95% CI). 139 These estimates were obtained from logistic models using delta method, function 'prLogisticDelta', 140 which is implemented in R and available in the package 'prLogistic'. Adjusted models included the following list of confounding variables: sex, age (years), and the preexistence of chronic pulmonary 141 142 disease, asthma, kidney disease, hematologic disease, neurological disease, liver disease, and immunodeficiency/ immunosuppression. The models that tested the degrees of obesity were also 143 144 adjusted for DM and CVD. All analyses were performed using Stata version 15.1 (Stata Corporation, College Station, USA) and R version 3.6.1 (R Foundation for Statistical Computing, Austria). 145

146 Patient and Public Involvement

147 As the study exclusively used publicly available de-identified data, it was not possible to involve 148 patients or the public in the design, or conduct, or reporting, or dissemination plans of our research.

149 **Results**

During the study period, 21,942 individuals registered in the SIVEP-Gripe were \geq 20 years old, 150 hospitalized, tested positive for SARS-CoV-2, and had complete demographic and comorbidity 151 152 information (Figure 1). Of these, 169 (0.8%) were excluded due to implausible values of BMI. Of 153 the 21,773 individuals included in the study, 8,848 (40.3%) were adults aged between 20-59 years, 154 and 12,925 (59.6%) were elders aged 60 years or older. Since some patients were still hospitalized 155 on the study endpoint date, information for some outcomes were incomplete. The study samples included in the analysis of each outcome were 8,075 adults and 11,829 elders for mechanical 156 157 ventilation, 8,414 adults and 12,222 for ICU admission, and 6,565 adults and 9,943 elders for death.

158 Based on demographic and clinical characteristics, the analytical samples in each outcome were very

159 similar to the overall study population and the excluded samples (**Supplementary Table 1**).

The prevalence of obesity was 9.7% in adults and 3.5% in elders. The frequency of obesity without and with DM and/or CVD was respectively 4.6% and 5.1% in adults and 0.7% and 2.8% in elders. Non-invasive and invasive mechanical ventilation were respectively required by 45.0% and 21.2% of adults and 47.0% and 30.0% of elders. ICU admission was needed by 35.4% of adults and 43.6% of elders. Death occurred in 31.1% of adult and 63.0% of elderly patients (**Table 1-2**).

165 In the adjusted analyses for adults, obesity alone (without DM and CVD) was associated with an 166 increased prevalence of invasive (PR 2.69, 95%CI 1.98-3.65) and non-invasive mechanical 167 ventilation need (PR 2.13, 95% CI 1.64-2.78), ICU admission (PR 1.31, 95% CI 1.13-1.53), and death (PR 1.33, 95% CI 1.05-1.69) when compared with the group without obesity, DM, and CVD. Obesity 168 169 with DM and/or CVD was associated with an even higher prevalence of invasive mechanical 170 ventilation (PR 3.76, 95% CI 2.82-5.01) and non-invasive ventilation use (PR 2.06, 95% CI 1.58-2.69), 171 ICU admission (PR 1.60, 95% CI 1.40-1.83), and death in adults (PR 1.79, 95% CI 1.45-2.21). The 172 subgroup of adults with DM and/or CVD showed in general the lowest prevalence ratios for all 173 analyzed outcomes than the subgroups with the presence of obesity alone or combined (Table 3).

Among elders, obesity without DM and CVD increased independently the prevalence of ICU admission by 40% (95% CI 1.07-1.82) and death by 67% (1.00-2.80). To a lesser extent, obesity with DM and/or CVD was also associated with an increased prevalence of invasive mechanical ventilation

177 need (PR 1.66, 95% CI 1.22-2.27), ICU admission (PR 1.37, 95% CI 1.19-1.59), and death (PR 1.39,

178 95%CI 1.07-1.80). Elders with DM and/or CVD had the lowest prevalence ratios for the analyzed

179 outcomes than the subgroups of elders with obesity alone or combined (**Table 3**).

180 In the analyses by the degree of obesity, we did not observe much difference in the prevalence of

adverse outcomes, except for the prevalence of death that increased with the severity of obesity: Class

182 I 1.32 (95%CI 1.05-1.66), Class II 1.41 (1.06-1.87), and Class III 1.77 (1.35-2.33) (**Table 4**).

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183 Discussion

184 This is the first study that describe the relationship of obesity and COVID-19 in Brazil, based on a 185 large nationwide sample of adults and elders tested positive for SARS-CoV-2 and admitted to public and private hospitals. Our results highlights that obesity with DM and/or CVD was associated with 186 187 higher rates of invasive mechanical ventilation use, ICU admission, and death in adults, while obesity alone (without DM and CVD) was associated with higher rates of ICU admission and death among 188 189 elders. In both age groups, obesity alone and obesity combined with DM and/or CVD had more 190 impact on the risk of all severe COVID-19 outcomes than the subgroup with DM and/or CVD. The 191 study also supports the independent association of obesity with the analyzed outcomes and a doseresponse association between degrees of obesity and death in adults. 192

193 Some mechanisms related to the role of obesity and related diseases in worsening the clinical 194 condition of patients affected by SARS-CoV-2 have been pointed out: i) greater body weight causes less elasticity of the chest wall and less total compliance of the respiratory system, leading to a 195 196 restriction of the ventilation and the excursion of the diaphragm, making difficult the airway 197 management in patients with obesity;²⁵ ii) obesity is associated with sleep apnea syndrome and 198 chronic obstructive pulmonary disease, which lead to surfactant dysfunction and impede the proper 199 functioning of the airways;²⁶ iii) obesity is a metabolic and inflammatory disease, which is associated 200 with the development or worsening of other chronic and endocrine comorbidities (e.g. type 2 diabetes, hypertension, dyslipidemia and CVD) that can modify innate and adaptive immune responses, 201 202 making the immune system more vulnerable to infections and less responsive to antivirals and 203 antimicrobial drugs;¹⁶ iv) glycemic decompensation, common in patients with obesity, is associated with impaired ventilation function.²⁶ 204

It is important to note that the COVID-19 pandemic imposes a double burden of disease, especially among the elderly individuals, since the prevalence of diabetes, hypertension, cardiovascular diseases, and other comorbidities associated with COVID-19 severity increases with age.^{3,27} However, our study suggests that obesity combined with diabetes and/or cardiovascular disease may

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209 offer higher risk of COVID-19 severity for adults although the overall prevalence of diseases and 210 rates of ICU admission and mortality were higher in elders. Obesity alone seemed to provide higher 211 risk of severe outcomes, especially death, in elders.

212 Few studies to-date have explored the combined and additional effect of obesity on COVID-19 213 severity.^{13,28} A study investigated the patterns of multimorbidity among fatal cases of COVID-19 in Colombia.²⁸ Similar to our study, the authors found that obesity alone or with other diseases was 214 215 associated with a higher risk of COVID-19 fatality among young people. Furthermore, a population-216 based study in Mexico observed that the addition of obesity to any number of comorbidities significantly increased the risk of COVID-19 lethality.¹³ Using a causally ordered mediation analysis, 217 this study also found that 49.5% of the effect of diabetes on COVID-19 lethality was mediated by 218 219 obesity, particularly in early-onset cases < 40 years of age.

Other studies also suggest that obesity is independently associated with severe outcomes of COVID-19, regardless of age and other associated comorbidities.¹¹⁻¹⁴ A large study in Mexico¹³ showed that patients with obesity had higher rates of ICU admission and were more likely to be intubated in relation to patients without obesity. This study also found a five-fold increased risk of mortality due to COVID-19 in patients with obesity.¹³ In a hospital-based study in France, it was observed that BMI > 35 kg/m² was associated with the need for invasive mechanical ventilation.¹⁴

226 Few studies to-date have similarly found a dose-response association between degrees of obesity and COVID-19 death.²⁹ Based on care records of 17,278,392 UK adults, the study showed that the risk 227 228 of COVID-19 death increases independently with the degree of obesity: 30-34.9 kg/m² (HR 1.05), 229 35-39.9 kg/m² (1.40), and \geq 40 kg/m² (2.66).²⁹ Other studies have evidenced the association of obesity 230 with COVID-19 complications and death among adults.^{12,30} A hospital-based study in New York City showed that morbid obesity (BMI \ge 40 kg/m²) is strongly and independently associated with death in 231 hospitalized patients younger than 50 years.³⁰ Another study in New York City found a similar dose-232 response relationship between degrees of obesity and acute and critical care.¹² Patients less than 60 233 years old with BMI between 30 and 34.9 kg/m² (obesity class I) were 2.0 and 1.8 times more likely 234

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to be respectively admitted for acute care (general hospital admission) and critical care (ICU admission or invasive ventilator) compared to individuals with BMI < 30 kg/m^2 . Patients of the same age group with BMI $\ge 35 \text{ kg/m}^2$ (obesity class II and III) showed 2.2 and 3.6 more chances of being hospitalized for acute and critical care, respectively.¹²

239 Strengths and limitations

240 One of the greatest strengths of the study was the use of SIVEP-Gripe dataset. Because severe acute respiratory syndrome is a condition of compulsory notification in both public and private hospitals,³¹ 241 we have a nationwide representative sample of patients hospitalized for severe COVID-19 in Brazil. 242 243 In addition, the large sample sizes allowed us to analyze adults and elders separately, as well as the 244 degrees of obesity which dose-response association with death was evidenced. The availability of important confounding variables (sex, age, and preexisting comorbidities) to control the estimated 245 246 associations, as well as hospital outcomes and mortality of COVID-19, was another differential of the study. Only patients with positive RT-PCR test for SARS-CoV-2 and final diagnosis for COVID-247 248 19 were included which gives greater precision on the studied population. The availability and use of 249 data from health surveillance systems may be a lesson from Brazil that other countries can learn for 250 obtaining routine and timely data to guide health systems and research in preparing and responding 251 to pandemics before and during their course.

252 The study also has some limitations that must be considered. Because this is a cross-sectional study, 253 a causal association cannot be inferred. As we used routinely collected data, which has not been 254 designed primarily for research purposes, it may bring well-known limitations related to missing, 255 underestimation, and potential misclassification. Obesity prevalence may have been underestimated 256 due to the completeness of obesity and BMI data. Previous studies using SIVEP-Gripe data have also found a low prevalence of obesity in this population.^{32,33} Better routine collection of height and weight 257 258 data is still needed in clinical practice. Also, we believe that health professionals have adopted more the one method to collect weight and height information for BMI calculation, such as the patient's 259 260 self-report and direct measure. Therefore, in addition to BMI which implausible values were checked

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261 and excluded, the classification of obesity was also confirmed from a dichotomous variable on the presence of obesity (no/yes). Although it is known that BMI does not distinguish between fat and 262 263 lean body mass, and thus may lead to misclassification bias, BMI has been shown as a strong predictor 264 of excess body fat and has been widely used in epidemiological studies.¹⁵ Information for some outcomes were incomplete because some patients were still hospitalized on the study endpoint date. 265 However, that did not represent a potential selection bias to our study. The analytical samples in each 266 267 outcome had similar demographic and clinical characteristics than the overall study population and the excluded samples (Supplementary Table 1). Data on ethnicity/race was very incomplete, and thus 268 269 was not included in the analysis. Additional studies are needed to further explore the relationship 270 between socioeconomic characteristics and obesity in severe disease. Finally, the generalization of 271 results must be cautious since the study included only hospitalized cases of COVID-19.

272 Conclusions

The combined association of obesity, diabetes, and/or cardiovascular disease with severe COVID-19 273 274 outcomes, especially ICU admission and death, may be stronger in adult than in elderly inpatients. In 275 both age groups, obesity alone and obesity combined with DM and/or CVD had more impact on the 276 risk of all severe COVID-19 outcomes than the subgroup with DM and/or CVD. The study also 277 supports an independent relationship of obesity with the severe outcomes, including a dose-response 278 association between degrees of obesity and death in adults. These findings suggest important 279 implications for the clinical care of patients with obesity and severe COVID-19, such as the increased 280 need of critical care and higher risk of death among these patients. Our study also supports the 281 inclusion of people with obesity, independently of other preexisting comorbidities and age, in the high-risk and vaccine priority groups for protection from SARS-CoV-2 infection. 282

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286 Author Contributions

NJS, RCRS, and RLF designed the study and analysis strategy. NJS, CASTS, and MYTI obtained, documented, and described the data. AJFF, CSST, ASR, FJOA, and IRF carried out the literature search. NJS and EJP performed the data analysis. NJS, RCRS, AJFF, CSST, ASR, FJOA, IRF, ESP and MLB contributed to data interpretation. NJS, AJFF, CSST, ASR, FJOA, and IRF drafted the manuscript. RCRS, ESP, MYTI, and MLB critically revised the manuscript. All authors read and approved the final manuscript.

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300 Competing Interests

301 None declared.

302 Patient Consent for Publication

303 Not required.

304 Data Availability Statement

305 Data is freely available without restriction at <u>https://opendatasus.saude.gov.br/dataset/bd-srag-2020</u>.

306 Code book and analytic code will be made available upon request from the corresponding author.

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Figure legends

Figure 1. Selection of the study population from SIVEP-Gripe.

SIVEP-Gripe: Influenza Epidemiological Surveillance Information System.

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OB + DMDM and/or Total OB None and/or CVD CVD % % % % % n n n n n Overall 100.0 409 8848 3161 35.7 4.6 452 5.1 4826 54.6 Sex Female 3774 42.7 1511 40.0 165 4.4 199 5.3 1899 50.3 Male 5074 57.4 1650 32.5 244 4.8 253 5.0 2927 57.7 Age 1976 188 9.5 5.2 < 40 years 22.3 1064 53.9 102 622 31.5 \geq 40 years 6872 77.7 2097 30.5 221 3.2 350 5.1 4204 61.2 Chronic pulmonary disease 96.1 34.9 388 435 5.1 4710 No 8502 2969 4.6 55.4 21 17 Yes 346 3.9 192 55.5 6.1 4.9 116 33.5 Asthma 8184 92.5 33.3 383 4.7 414 5.1 4659 56.9 No 2728 Yes 664 7.5 433 65.2 26 3.9 38 5.7 167 25.2 Chronic kidney disease No 8297 93.8 2958 35.7 399 4.8 434 5.2 4506 54.3 Yes 6.2 203 36.8 10 1.8 18 3.3 320 58.1 551 Chronic hematologic disease No 8710 98.4 3081 35.4 406 4.7 445 5.1 4778 54.9 Yes 138 58.0 3 2.2 5.1 48 34.8 1.6 80 7 Chronic neurological disease No 8588 97.1 3014 35.1 406 4.7 442 5.2 4726 55.0 Yes 260 2.9 147 56.5 3 1.2 10 3.9 100 38.5 **Chronic liver disease** No 8684 98.2 3083 35.5 406 4.7 443 5.1 4752 54.7 1.9 9 5.5 74 45.1 Yes 164 78 47.6 3 1.8 **Immunosuppression** 393 440 No 8276 93.5 2777 33.6 4.8 5.3 4666 56.4 Yes 572 6.5 384 67.1 16 2.8 12 2.1 160 28.0 **Mechanical ventilation*** 1144 2727 33.8 42.0 93 3.4 88 3.2 1402 51.4 No 3634 45.0 1178 32.4 192 5.3 190 5.2 2074 57.1 Non-invasive Invasive 1714 21.2 529 30.9 101 5.9 150 8.8 934 54.5 **ICU admission*** No 5438 64.6 2025 37.2 235 4.3 222 4.1 2956 54.4 Yes 2976 1590 35.4 1007 33.8 163 5.5 216 7.3 53.4 Death* No 4525 68.9 1699 37.6 211 4.7 200 4.4 2415 53.4 2040 640 31.4 92 4.5 140 6.9 Yes 31.1 1168 57.3

Table 1. Demographic characteristics, comorbidities, hospitalization outcomes and death according to the combined exposure of obesity, diabetes, and/or cardiovascular diseases in adults with severe COVID-19.

OB: obesity (BMI \geq 30 kg/m²), DM: diabetes mellitus, CVD: cardiovascular disease, ICU: intensive care unit. * Mechanical ventilation (n=8075), ICU admission (n=8414), and death (n=6565).

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OB + DMDM and/or OB Total None and/or CVD **CVD** % % % % % n n n n n Overall 12925 100.0 2837 21.9 91 0.7 358 2.8 9639 74.6 Sex Female 5968 46.2 0.9 209 3.5 1232 20.6 52 4475 75.0 Male 6957 53.8 1605 23.1 39 0.6 149 2.1 5164 74.2 Age 9355 2011 77 0.8 309 3.3 74.4 < 80 years 72.4 21.5 6958 \geq 80 years 3570 27.6 826 23.1 14 0.4 49 1.4 2681 75.1 Chronic pulmonary disease 85 2.7 No 11885 92.0 2494 21.0 0.7 325 8981 75.6 Yes 1040 8.1 343 33.0 0.6 3.2 63.3 6 33 658 Asthma No 12474 96.5 2687 21.5 90 0.7 336 2.7 9361 75.0 Yes 451 3.5 150 33.3 1 0.2 22 4.9 278 61.6 Chronic kidney disease No 11882 91.9 2608 22.0 85 0.7 311 2.6 8878 74.7 Yes 1043 8.1 229 22.0 6 0.6 47 4.5 761 73.0 Chronic hematologic disease 98.5 0.7 354 9532 No 12728 2751 21.6 91 2.8 74.9 Yes 197 43.7 0 0.0 4 2.0 107 54.3 1.5 86 Chronic neurological disease No 11871 91.9 2511 21.2 89 0.8 338 2.9 8933 75.3 Yes 1054 8.2 326 30.9 2 0.2 20 1.9 706 67.0 Chronic liver disease 87 12734 98.5 2777 21.8 0.7 353 2.8 9517 74.7 No Yes 191 1.5 60 31.4 4 2.1 5 2.6 122 63.9 **Immunosuppression** No 12303 95.2 2558 20.8 87 0.7 342 2.8 9316 75.7 Yes 622 4.8 279 44.9 4 0.6 16 2.6 323 51.9 **Mechanical ventilation*** 23.0 23.0 18 0.7 70 No 2725 626 2.6 2011 73.8 Non-invasive 5557 47.0 21.0 38 0.7 2.5 4214 1164 141 75.8 Invasive 3547 30.0 767 21.6 29 0.8 133 3.8 2618 73.8 **ICU admission*** 6898 41 No 56.4 1578 22.9 0.6 168 2.4 5111 74.1 Yes 1107 44 0.8 3992 5324 43.6 20.8 181 3.4 75.0 Death* 95 74.5 No 3684 37.1 823 22.3 21 0.6 2.6 2745 1407 43 Yes 6259 63.0 22.5 0.7 173 2.8 4636 74.1

Table 2. Demographic characteristics, comorbidities, hospitalization outcomes and death according to the combined exposure of obesity, diabetes, and/or cardiovascular diseases in elders with severe COVID-19.

OB: obesity (BMI \geq 30 kg/m²), DM: diabetes mellitus, CVD: cardiovascular disease, ICU: intensive care unit. * Mechanical ventilation (n=11829), ICU admission (n=12222), and death (n=9943).

		Non-invasive mechanical ventilation*				Invasive mechanical ventilation*					
	Main exposure variable	Crude model		Adjusted model #		Crude model		Adjusted model #			
		PR	95%CI	PR	95%CI	PR	95%CI	PR	95%CI		
Adults 20-59 years	None	1.00		1.00		1.00		1.00			
	OB	2.00	1.54-2.60	2.13	1.64-2.78	2.35	1.74-3.17	2.69	1.98-3.65		
	OB + DM and/or CVD	2.10	1.61-2.73	2.06	1.58-2.69	3.69	2.78-4.89	3.76	2.82-5.01		
	DM and/or CVD	1.44	1.29-1.60	1.35	1.20-1.51	1.44	1.26-1.64	1.32	1.14-1.52		
Elders ≥ 60 years	None	1.00		1.00		1.00		1.00			
	OB	1.14	0.64-2.01	1.22	0.69-2.16	1.31	0.72-2.39	1.43	0.78-2.61		
	OB + DM and/or CVD	1.08	0.80-1.47	1.15	0.84-1.55	1.55	1.14-2.11	1.66	1.22-2.27		
	DM and/or CVD	1.13	1.01-1.26	1.14	1.01-1.27	1.06	0.94-1.20	1.10	0.97-1.24		
			ICU admission**				Death***				
		Crude model		Adjusted model #		Crude model		Adjusted model #			
		PR	95%CI	PR	95%CI	PR	95%CI	PR	95%CI		
Adults 20-59 years	None	1.00		1.00		1.00		1.00			
	OB	1.23	1.08-1.40	1.31	1.13-1.53	1.11	0.92-1.33	1.33	1.05-1.69		
	OB + DM and/or CVD	1.48	1.33-1.65	1.60	1.40-1.83	1.50	1.30-1.74	1.79	1.45-2.21		
	DM and/or CVD	1.05	0.99-1.12	1.03	0.95-1.12	1.19	1.10-1.29	1.16	1.03-1.30		
Elders ≥ 60 years	None	1.00		1.00		1.00		1.00			
	OB	1.26	1.02-1.55	1.40	1.07-1.82	1.06	0.89-1.27	1.67	1.00-2.80		
	OB + DM and/or CVD	1.26	1.13-1.41	1.37	1.19-1.59	1.02	0.93-1.12	1.39	1.07-1.80		
	DM and/or CVD	1.06	1.01-1.12	1.11	1.04-1.18	1.00	0.96-1.03	1.05	0.95-1.16		

Table 3. Combined association of obesity, diabetes, and/or cardiovascular disease with non-invasive and invasive mechanical ventilation use, intensive care unit admission, and death in adult and elderly patients hospitalized with severe COVID-19.

OB: obesity (BMI \geq 30 kg/m²), DM: diabetes mellitus, CVD: cardiovascular disease, ICU: intensive care unit, PR: prevalence ratio, 95% CI: 95% confidence interval. * Crude and adjusted multinomial logistic regression models for mechanical ventilation use in adults (n=8075) and elders (n=11829).

** Crude and adjusted logistic regression models for ICU admission in adults (n= 8414) and elders (n=12222).

*** Crude and adjusted logistic regression models for death in adults (n=6565) and elders (n=9943).

[#] Adjusted for sex, age in years, pulmonary disease, asthma, kidney disease, hematologic disease, neurological disease, liver disease, and immunosuppression.

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Table 4. Independent association of degrees of obesity with non-invasive and invasive mechanical ventilation, intensive care unit admission, and death in hospitalized adults with severe COVID-19.

	Non-invasive mechanical ventilation*						Invasive mechanical ventilation*				
Main exposure variable	Crude model		Adjusted model #		Crude model		Adjusted model #				
	PR	95%CI	PR	95%CI	PR	95%CI	PR	95%CI			
No obesity ($< 30 \text{ kg/m}^2$)	1.00		1.00		1.00		1.00				
Obesity class I (\geq 30-34.9 kg/m ²)	1.78	1.35-2.33	1.91	1.45-2.51	2.59	1.93-3.47	3.00	2.22-4.05			
Obesity class II (\geq 35-39.9 kg/m ²)	1.44	1.04-2.00	1.58	1.14-2.19	2.10	1.47-2.99	2.47	1.72-3.54			
Obesity class III ($\geq 40 \text{ kg/m}^2$)	1.70	1.19-2.44	1.88	1.31-2.69	2.51	1.71-3.70	3.00	2.03-4.45			
	ICU admission**			Death**							
	Crude model		Adjusted model #		Crude model		Adjusted model #				
	PR	95%CI	PR	95%CI	PR	95%CI	PR	95%CI			
No obesity ($< 30 \text{ kg/m}^2$)	1.00		1.00		1.00		1.00				
Obesity class I (\geq 30-34.9 kg/m ²)	1.31	1.17-1.47	1.42	1.23-1.64	1.11	0.94-1.31	1.32	1.05-1.66			
Obesity class II (\geq 35-39.9 kg/m ²)	1.34	1.16-1.54	1.46	1.23-1.74	1.16	0.95-1.42	1.41	1.06-1.87			
Obesity class III ($\geq 40 \text{ kg/m}^2$)	1.32	1.14-1.54	1.45	1.20-1.74	1.33	1.10-1.59	1.77	1.35-2.33			

Degrees of obesity defined by the WHO cutoff points.

PR: prevalence ratio, 95% CI: 95% confidence interval.

* Crude and adjusted multinomial logistic regression models for mechanical ventilation use (n=8075).

** Crude and adjusted logistic regression models for ICU admission (n=8414) and mortality (n=6565).

[#] Adjusted for sex, age in years, diabetes mellitus, cardiovascular disease, pulmonary disease, asthma, kidney disease, hematologic disease, neurological disease, liver disease, and immunosuppression.

