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Characterization of the epidemiological curve of the 1<sup>st</sup> wave of the pandemic - study of the determinants for death and hospitalization due to COVID-19 in Portugal

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**1 TITLE**

2 Characterization of the epidemiological curve of the 1<sup>st</sup> wave  
3 of the pandemic - study of the determinants for death and  
4 hospitalization due to COVID-19 in Portugal  
5

**6 RUNNING HEAD**

7 Determinants for death and hospitalization due to COVID-19  
8

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42

**43 ABSTRACT**

44 COVID-19 is an infectious disease caused by the SARS-CoV-2 virus that emerged in  
45 China and has since spread rapidly to all countries in the world. The aim of this study is  
46 to characterize the peak of the first wave of the pandemic in Portugal using some  
47 demographic and clinical determinants. The database studied contains epidemiological  
48 surveillance data of COVID-19 from Portugal until June 30, 2020. The peak of the  
49 pandemic was determined considering the number of diagnoses, deaths, and  
50 hospitalizations over time, and the estimated period for the first wave was between  
51 March 19 and April 24. Multivariable logistic regression models were performed to  
52 estimate the Odds Ratio (OR) and the respective 95% confidence intervals (95% CI)  
53 for this period and for each of the variables considered in relation to both study  
54 outcomes: mortality (5.8%) and hospitalization (18.8%). The main risk factors  
55 considered for the mortality outcome were: Age Group ( $\geq 80$  years: OR = 11.98; 65-79  
56 years: OR = 4.06; reference group:  $<64$  years), Hospitalization (OR = 6.48) and  
57 Comorbidities (OR = 5.74). For the outcome hospitalization, the main risk factors were:  
58 Age Group ( $\geq 80$  years: OR = 8.54; 65-79 years: OR = 3.90; reference group:  $<64$   
59 years), male gender (OR= 1.58) and Comorbidities (OR = 5.19). The proposed models  
60 presented high area under the curve (AUC) results (mortality: AUC=91.1%; and  
61 hospitalization: AUC=84.5%), with small amplitudes in the 95% CI. The present study  
62 demonstrated that, overall, the major risk factors associated with worse prognostics of  
63 COVID-19 were advanced age (over 65 years), and the existence of comorbidities. For  
64 the risk of hospitalizations, the male gender was also a significant risk factor.  
65

## 66 Introduction

67 COVID-19 is an infectious disease caused by the SARS-CoV-2 virus that first appeared  
68 in late 2019 in Wuhan, China and has since spread rapidly to all countries around the  
69 world. In most cases, individuals who contract this virus show only mild to moderate  
70 symptoms, however, in individuals over the age of 60 or who have some comorbidity,  
71 there is a greater predisposition for the development of more serious conditions of the  
72 disease or even death (1,2).

73 Mortality, hospitalizations, and ICU admissions are often used as clinical outcomes for  
74 assessing disease progression and severity. Age is referred in many studies as one of  
75 the most relevant risk factors for determining the clinical outcome in patients infected  
76 with the SARS-CoV-2 virus (2–4). The existence of comorbidities, in particular  
77 hypertension, diabetes and coronary heart disease is also associated with severe  
78 illnesses and worse prognosis in patients with COVID-19 (2,3,5). Although there is no  
79 consensus among the scientific community, some studies also consider that gender  
80 has an influence on the outcome of infected individuals (6).

81 In a meta-analysis by K. Dorjee et al (2020), seventy-seven studies comprising 38906  
82 hospitalized patients were included, and was shown that individuals aged > 65  
83 represented 85% (95% CI: 80–89) of deaths from COVID-19 (7). Furthermore,  
84 individuals aged > 60 also had a summary relative risk of 3.61 (95% CI: 2.96–4.39) for  
85 the occurrence of death and 1.57 (95% CI: 1.36–1.80) for the development of severe  
86 disease, being considered as a risk factor for both outcomes. In M. A. Barek et al.  
87 (2020), a meta-analysis was carried out with fifty-five studies from January 1, 2020 to  
88 May 23, 2020, including 10014 patients with SARS-CoV-2 infection (8). It was shown  
89 that individuals with comorbidities had an Odds Ratio of 3.13 (95% CI: 2.26–4.32),  
90 presenting a greater risk for the development of severe disease.

91 Although there are some previous studies regarding the epidemiological surveillance  
92 data of COVID-19 in Portugal, none of these studies specifically address the peak of  
93 the first wave of the pandemic, instead, they analyze the data as a whole (9). This

94 study is particularly relevant in obtaining more specific information about the  
95 characteristics of the population that constitutes the epidemiological curve, a phase  
96 with special characteristics in which the growth in the number of cases is much higher  
97 (or even exponential). This information can also be useful in future waves of the  
98 pandemic, allowing for the comparison of different epidemiological peaks and inferring  
99 about the measures that could result in better clinical outcomes.

100 Therefore, the aim of this study is to characterize the peak of the first wave of the  
101 pandemic by showing the impact of available demographic and clinical determinants  
102 associated to the outcome of mortality and hospitalization.

103

## 104 **Methods**

### 105 ***Study Design***

106 An observational retrospective study was conducted including all reported cases of  
107 COVID-19 until June 30, 2020 in Portugal.

### 108 ***Data Source***

109 The database includes anonymized epidemiologic surveillance data provided by the  
110 General Health Directorate of Portugal (DGS) after attaining an authorization for the  
111 treatment of data by academics. This authorization was granted after request and  
112 submission of a form and an ethical committee authorization to perform research on  
113 the dataset (10). The data were collected via SINAVE (National System for  
114 Epidemiological Surveillance), a platform used for notification of epidemiological  
115 surveillance data corresponding to confirmed and validated cases of COVID-19 in  
116 Portugal until June 30, 2020.

### 117 ***General Characteristics and Outcomes***

118 The outcomes considered were mortality and hospitalization, the first being the primary  
119 outcome. The mortality outcome was defined from the date of death provided in the  
120 database. Data provided by SINAVE include individual's demographic (age, sex,  
121 region) and clinical characteristics (Hospitalizations, ICU admissions, Comorbidities).

122 Age was categorized into age groups: <64 years, 65-79 years and  $\geq 80$  years, the last  
123 two considered as possible risk factors. Similarly, geographic locations were  
124 categorized into five regions: "Lisbon and Tagus Valley (LTV)", "North", "Center",  
125 "South" and "Islands"; according to the information provided by DGS (11). The  
126 "Islands" region includes individuals from Madeira and Azores islands. The data on  
127 hospitalizations and comorbidities comprised individuals with an "Unknown" status that,  
128 for the purposes of this study, we considered as missing values. In addition,  
129 observations representing outliers relative to the dates of diagnosis and hospitalization  
130 were also excluded.

131 Considering that the first reported case of COVID-19 in Portugal occurred on March 2,  
132 2020, the database was filtered to include only diagnosis dates as of this date and  
133 hospitalization dates after February 1, 2020. Moreover, despite the fact the database  
134 includes observations until June 30, 2020, the last recorded date of death was May 24  
135 of the same year. Therefore, in order to normalize the peak curve estimation for the  
136 three parameters, the database was truncated only to comprise observations with  
137 diagnosis and hospitalization dates prior to May 25, 2020.

### 138 ***Statistical Analysis***

139 For the epidemiological curves, we generated line plots with the absolute and absolute  
140 cumulative curves and relative frequencies for the dates of diagnosis, hospitalization,  
141 and death. The median value for the period of time associated to diagnosis was used  
142 to determine the peak of the 1<sup>st</sup> wave of the pandemic of COVID-19 in Portugal.

143 Descriptive statistics, such as absolute and relative frequencies, were calculated for all  
144 categorical variables. The chi-square test was also performed between the levels of the  
145 categorical variables (including Yates's continuity correction).

146 The database was then divided into training (70%) and test (30%) subsets for analysis  
147 (12). After the division, the proportions of each outcome were verified in both datasets  
148 (training and test) to ensure that they are similar to those in the complete dataset.

149 Multivariable logistic regression models were performed using the training database

150 and applying generalized linear models with a binomial distribution and logit link  
151 function to estimate the odds ratios (OR) and 95% confidence intervals (95% CI) for  
152 each outcome considered. Multicollinearity was assessed through calculation of the  
153 VIF (variance inflation factor). Using the test subset, we evaluated the performance of  
154 the model by determining the Area Under the Curve (AUC) and the respective 95%  
155 confidence interval.

156 The significance level was set at 5% and the statistical analysis performed using  
157 software R version 3.6.1 and RStudio version 1.2.5001 and the packages “pROC”,  
158 “ResourceSelection” and “car” and also “dplyr” and “ggplot2” for graphic support.

159

## 160 **Results**

### 161 ***Determination of the Epidemic Peak***

162 To determine the peak of the pandemic, a total of 14476 individuals were included from  
163 March 1 to May 24, 2020. Figure 1A), along with the incidence and cumulative  
164 incidence curves, shows the median number of diagnoses during the period under  
165 analysis (median = 133). The peak of the curve is defined by the period in which the  
166 number of diagnoses was higher than the median value, and this corresponds to the  
167 period between March 19 and April 24. Using the same methodology, based on Figure  
168 1B), the peak of hospitalizations was defined between March 11 and May 2,  
169 (corresponding to the time period in which the daily number of hospitalizations was  
170 greater than 17). The peak of deaths among infected with COVID-19 during the first  
171 wave of the pandemic (Figure 1C)) was likewise defined between March 25 and May 6  
172 (corresponding to the time period in which the daily number of deaths was greater than  
173 9). We can observe that there is a time lag between the peak of diagnosis (April 24),  
174 hospitalizations (May 2), and deaths (May 6).

### 175 ***Characterization of the Infected Population***

176 The descriptive statistics includes all individuals diagnosed with COVID-19 between  
177 March 19 and April 24, corresponding to the first wave considering the number of

178 diagnosis (n=10296). As shown in Table 1, 5902 (57.32%) women and 4394 (42.68%)  
179 men were included in this exploratory analysis. Moreover, 7632 (74.13%) individuals  
180 were under 64 years old, 1480 (14.37%) were between 65 and 79 years and 1184  
181 (11.50%) were 80 years or over. Regarding geographic regions, the distribution of  
182 COVID-19 infections between regions was 24.57% in LTV, 57.80% in the north region,  
183 13.89% in the center, 1.09% in the south and 2.65% in the islands. Considering the  
184 distribution of infection rates per 100,000 habitants were 68.70 in LTV (2530 individuals  
185 from a population of 3,682,860), 160.51 in the north of Portugal (5951 individuals from  
186 a population of 3,573,961), 87.92 in the center (1430 individuals from a population of  
187 1,626,462), 12.36 in the south (112 individuals from a population of 906,060) and 52.93  
188 in both Madeira and Azores Islands (273 individuals from a population of 496,921). The  
189 overall proportion of deaths in the data set was 5.6% (n=578), the proportion of  
190 hospitalizations were 18.8%, and 44.77% of the infected individuals presented at least  
191 one comorbidity.

192 For the mortality endpoint, it was possible to notice a reduced lethality in several  
193 groups, especially in individuals aged up to 64 years old (0.71%), with no comorbidities  
194 (0.40%) or hospitalizations (1.35%). On the other hand, individuals aged 80 and over  
195 are those with the highest lethality (30.60%), followed by individuals that were  
196 hospitalized with COVID-19 (23.97%) and those with any comorbidity (12.04%). The  
197 South region also presents a higher lethality (10.71%) when compared to the other  
198 Portuguese regions.

199 Considering the outcome hospitalization, it is possible to verify that the incidence is  
200 considerably higher in every analyzed group compared to the mortality endpoint, as  
201 expected. The relative frequency of hospitalizations reaches a maximum value of  
202 59.46% for individuals aged over 80 and a minimum of 4.84% for individuals without  
203 comorbidities (see Table 1). It is also possible to see a very high incidence in the South  
204 region (39.29%), this being the third highest incidence, preceded by individuals aged  
205 between 65 and 79 (41.15%).

## 206 ***Determination of Risk Factors for Mortality and Hospitalization***

207 The multivariable logistic regression analysis for the outcomes mortality and  
208 hospitalization are presented in Table 2. For both outcomes, individuals aged 80 or  
209 more are the ones with the highest risk for the occurrence of death and hospitalization  
210 of approximately 12.0 and 8.5 times, respectively, when compared to individuals under  
211 64 years. The existence of comorbidities also proved to be an important risk factor for  
212 the occurrence of both outcomes (Mortality: OR = 5.74, 95% CI: 3.33-10.64 and  
213 Hospitalization: OR = 5.19, 95% CI: 4.36-6.21). For the mortality outcome, individuals  
214 that have been hospitalized with COVID-19 also present a higher risk (OR=6.48, 95%  
215 CI: 4.87-8.71) for the occurrence of death when compared to those not hospitalized.  
216 Male gender is considered significant only for the outcome hospitalization, with an  
217 associated risk that is 1.6 times higher than that of female individuals. Likewise, the  
218 region was also considered to be significant only for the outcome hospitalization. The  
219 South region presents a risk of hospitalizations among those infected with COVID-19,  
220 1.9 times higher than the LTV region. On the other hand, the North, Center, and Island  
221 regions have a lower risk of hospitalization compared to the reference region (OR =  
222 0.60, 95% CI: 0.51-0.71; OR = 0.59, 95% CI: 0.46-0.74; and OR = 0.47, 95% CI: 0.28-  
223 0.76, respectively).

## 224 ***Performance Evaluation of the Regression Models***

225 The roc curves presented in Figure 2 show a good performance for both models, with  
226 AUC = 0.911, 95% CI: 0.920-0.945 for the death predictor model and AUC = 0.845,  
227 95% CI: 0.828-0.864 for the hospitalization predictor model.

228

## 229 **Discussion**

230 Although, currently, COVID-19 is an extremely addressed topic all over the world, in  
231 Portugal, there are few articles that analyze the epidemiological surveillance data made  
232 available by DGS, especially those of June 30. This study only addresses the peak of  
233 the first wave of the pandemic, instead of analyzing the whole available data, being

234 unique in this sense. This can provide particularly relevant and specific information  
235 about the characteristics of the infected population during this phase of exponential  
236 growth of the pandemic. Also, it was especially relevant to define the main risk factors  
237 for both the occurrence of deaths and hospitalizations among those infected.

238 The first obstacle faced during the present study was the determination of the peak of  
239 the first wave of the pandemic, since there is no consensual date described in the  
240 literature. Therefore, to do so, we studied the epidemiological curves, analyzed the  
241 behavior of the cumulative curves, and used the median for delimiting the peak of the  
242 pandemic for each of the specified clinical outcomes (13,14). It was also possible to  
243 identify, a lag of approximately 12 days between the end of the peak of diagnoses and  
244 deaths from COVID-19. This is slightly above the average lag between daily COVID-19  
245 cases and deaths reported by R. Jin et al. (2021), of approximately 8 days (SD= 4  
246 days) for nineteen regions. However, these results are similar in some included  
247 countries such as Switzerland (15). The peak of the pandemic was defined based on  
248 the diagnosis wave so that we were able to have a control group for both outcomes.

249 In this study, the main risk factors established for both outcomes included old age (over  
250 65 years) and the existence of comorbidities, which is concordant with other previously  
251 published articles addressing this matter (9). For the mortality outcome, hospitalization  
252 was also considered as a risk factor. In the study by PJ Nogueira et al. (2020), the risk  
253 factors obtained for mortality were: age (despite being more stratified, it is possible to  
254 verify a progressive increase in the OR with increasing age: 0–55 years:  
255 Reference.group 66–70 years: OR = 20.4; 71–75 years: OR = 34.0; 76–80 years OR =  
256 50.9; 81–85 years: OR = 70.7; 86–90 years: OR = 83.2); the existence of comorbidities  
257 (with the OR calculated individually for each pathology); and also the male gender (OR  
258 = 1.47) that in our study was only considered as statistically significant for the outcome  
259 hospitalization (9).

260 Advanced age proved to be one of the main risk factors for both mortality and  
261 hospitalization with COVID-19 at the peak of the first wave of the pandemic.

262 Furthermore, this risk proved to be greater with increasing age. Individuals over the  
263 age of 65 are, in general, associated with worse prognosis (both hospitalization and  
264 mortality) being this risk even greater for individuals over 80 years of age (OR=11.98  
265 for mortality; OR=8.54 for hospitalization). In Z. Zheng et al. (2020) age over 65 years  
266 old, was one of the main risk factors reported for disease progression in patients with  
267 COVID-19 with an OR = 6.06, 95% CI: 3.98-9.22 (16). This can be particularly serious  
268 in a country such as Portugal that has an extremely aged population with more than  
269 2.2 million (22.0%) being over 65 years (data from 2019) (17).

270 The existence of comorbidities was another factor considered to have a major influence  
271 in determining the clinical outcome in patients infected with COVID-19. The existence  
272 of preconditions has been described as an important factor in determining the clinical  
273 outcome of patients with COVID-19 (16,18,19). In this study, even though the dataset  
274 provides information regarding some individual comorbidities, only the general variable  
275 was analyzed, since the individual data had several missing values that could give rise  
276 to biased estimates that do not reflect the real situation.

277 Although, in most studies, hospitalization is considered only as a clinical outcome (e.g.  
278 RC Menezes Soares, 2020), in this study, we considered it as a risk factor for the  
279 occurrence of death (20). A higher lethality was shown in infected patients who have  
280 been hospitalized. On the other hand, this outcome can also be considered as a  
281 confounding factor since hospitalized patients usually present some characteristics  
282 such as older age or comorbidities that can be the real risk factors for the occurrence of  
283 death.

284 The gender variable showed significant results only regarding the outcome  
285 hospitalization (16). According to the present study, males have a 1.58 higher risk of  
286 hospitalization when compared to females. Similarly, V.Jain et al. reported being male  
287 as a non-significant risk factor for COVID-19 ICU hospitalization (OR=1.15, 95% CI:  
288 0.89-1.48) (19).

289 Finally, taking into account the distinct regions, significant results were also detected  
290 regarding hospitalizations of infected individuals. In the North, Center, and Islands the  
291 risk was significantly lower when compared to the reference region, LTV (OR = 0.60,  
292 OR = 0.59, and OR = 0.47, respectively). In contrast, the South region had a  
293 significantly higher risk of hospitalization compared to LVT (OR = 1.91). To our  
294 knowledge, no other published studies present odds risk results about regions,  
295 representing a novelty and interesting information for public health decision makers.  
296 However, these results must be carefully interpreted since there are several factors, in  
297 addition to those included in the analysis, that may influence the decision to hospitalize  
298 a patient. For instance, the number of hospitalizations may be related to the specific  
299 guidelines defined for each hospital, the number of available beds for this purpose and  
300 the irregular distribution of the pandemic in Portugal, especially during this first wave.  
301 For example, the greater risk of hospitalizations in regions where there are a smaller  
302 number of infected individuals (e.g., South). In this situation the number of available  
303 beds may be higher and the decision to hospitalize may not be so restrictive.  
304 Therefore, the region should not be directly interpreted as a risk factor for the  
305 occurrence of hospitalization without further information regarding other potential  
306 confounding factors.

307 The main limitation of our study is related to the lack of consistency in data registration,  
308 which can lead to the existence of some abnormalities. When the data was made  
309 available, an alert was made by the Portuguese DGS to the fact that the total number  
310 of cases in the file does not coincide with those reported in the DGS daily bulletin since  
311 it is surveillance data from medical notifications. Nevertheless, there are strong  
312 criticisms in the literature regarding the quality of the data provided, namely, the  
313 discrepancy in the proportion of patients infected with comorbidities between the data  
314 made available in April and the data updated on the 30<sup>th</sup> of June, as well as the  
315 extreme increase in the proportion of missing values in this variable (21). In addition to  
316 the quality problems referred by C. Costa-Santos et al. (2020), there are many others

317 reported by some researchers, such as the existence of pregnant men, a 134-year-old  
318 person and more than 4,000 missing data between the April and June database (22).  
319 Moreover, during this study it was possible to find some non-documented  
320 inconsistencies regarding the dates of diagnosis and hospitalization. In some cases,  
321 the presented dates were from before the beginning of the pandemic of COVID-19 in  
322 Portugal (March 2, 2020). Also, there was one month of missing data in the variable  
323 containing the dates of deaths (death dates were only reported until the 24<sup>th</sup> of May). In  
324 order to minimize the impact of these problems in the present study, the database was  
325 truncated so that observations with dates of diagnosis, hospitalization or death outside  
326 the acceptable limits were excluded from the analysis, and the variables of the specific  
327 comorbidities were not used in this study.

328

### 329 **Conclusions**

330 The present study allowed us, initially, to determine the peak of the first wave of the  
331 COVID-19 pandemic in Portugal and also to demonstrate that, in general, the major  
332 risk factors associated with worse prognostics of this disease, during this period, were  
333 advanced age (over 65 years), and the existence of comorbidities. For the risk of  
334 hospitalizations, the male gender was also considered a major factor.  
335 Since this study only addresses a very specific fraction of the COVID-19 cases in  
336 Portugal during the first wave of the pandemic, it may be interesting, in future works, to  
337 perform similar analyzes for subsequent waves and to compare the results obtained  
338 from each analysis. This will allow a phase-specific characterization of the infected  
339 population and determination of the predominant risk factors in each of them.

340

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344

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416

417 **Tables**

418 Table 1: Characterization of the population with COVID-19 during the peak of the 1<sup>st</sup> wave of the pandemic in Portugal for the outcomes  
 419 mortality and hospitalization. All cases of COVID-19 were reported between March 2 and June 30, 2020.

Variables	n(%)	Mortality		Hospitalization	
		Cases(%)	$\chi^2$ Test	Cases(%)	$\chi^2$ Test
<b>Age Group</b>					
<64 years	7632(74.13)	54(0.71)	$X^2(2) = 1825.7$ $p < 0.0001$	627(8.22)	$X^2(2) = 1825.7$ $p < 0.0001$
65-79 years	1480(14.37)	161(10.88)		609(41.15)	
≥ 80 years	1184(11.50)	363(30.66)		704(59.46)	
<b>Gender</b>					
Female	5902(57.32)	287(4.86)	$X^2(1) = 14.393$ $p < 0.0001$	944(15.99)	$X^2(1) = 14.393$ $p = 0.0001$
Male	4394(42.68)	291(6.62)		996(22.67)	
<b>Region</b>					
LTV	2530(24.57)	127(5.02)	$X^2(4) = 14.189$ $p = 0.007$	537(21.23)	$X^2(4) = 14.189$ $p = 0.007$
North	5951(57.80)	339(5.70)		1021(17.16)	
Center	1430(13.89)	93(6.50)		308(21.54)	
South	112(1.09)	12(10.71)		44(39.29)	
Islands	273(2.65)	7(2.56)		30(10.99)	
<b>Hospitalization</b>					
No	8356(81.16)	113(1.35)	$X^2(1) = 1515.7$ $p < 0.0001$	-	-
Yes	1940(18.84)	465(23.97)		-	-
<b>Comorbidities</b>					
No	5686(55.23)	23(0.40)	$X^2(1) = 648.19$ $p < 0.0001$	275(4.84)	$X^2(1) = 648.19$ $p < 0.0001$
Yes	4610(44.77)	555(12.04)		1665(36.12)	

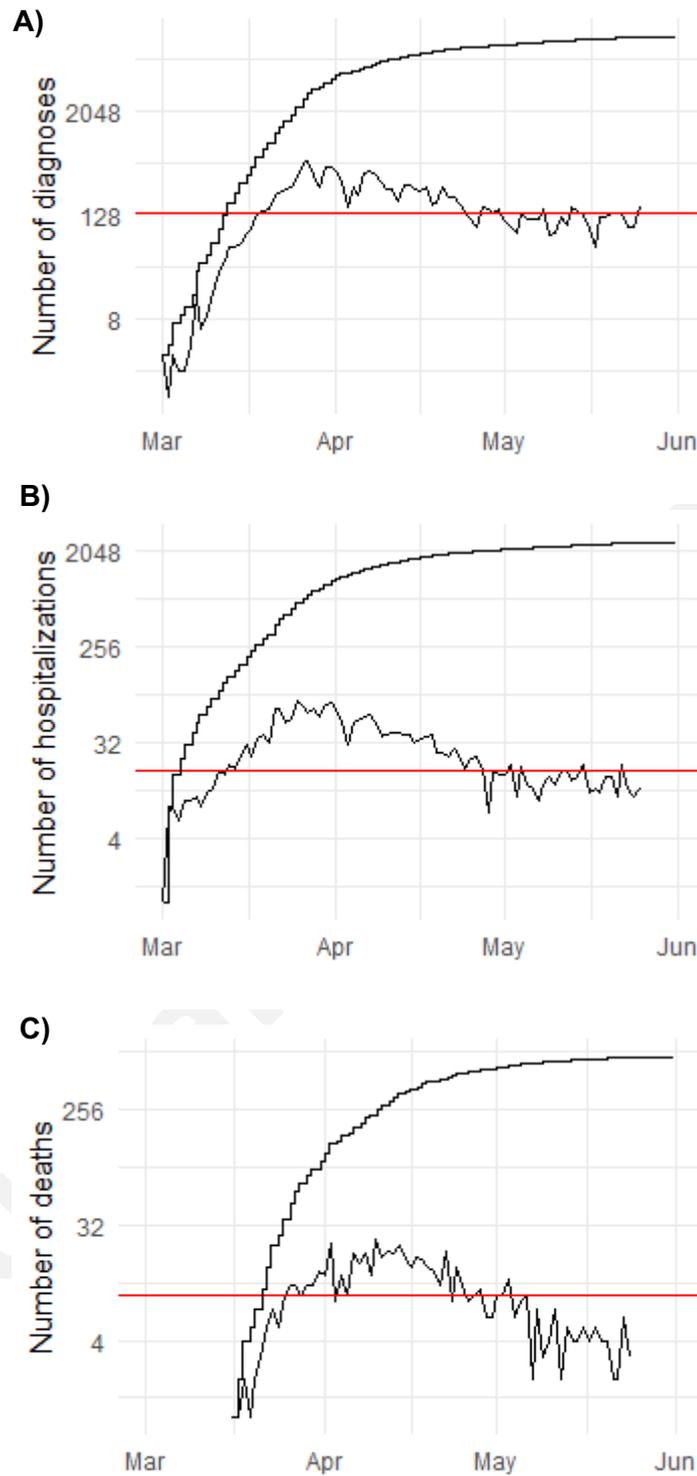
420 LTV: Lisbon and Tagus Valley; OR: Odds Ratio; 95%CI: 95% Confidence Interval;

421 Table 2: Analysis of multivariable logistic regression for mortality and hospitalization outcomes in individuals infected with COVID-19 at the peak  
 422 of the 1<sup>st</sup> wave of the pandemic in Portugal. All cases of COVID-19 were reported between March 2 and June 30, 2020.

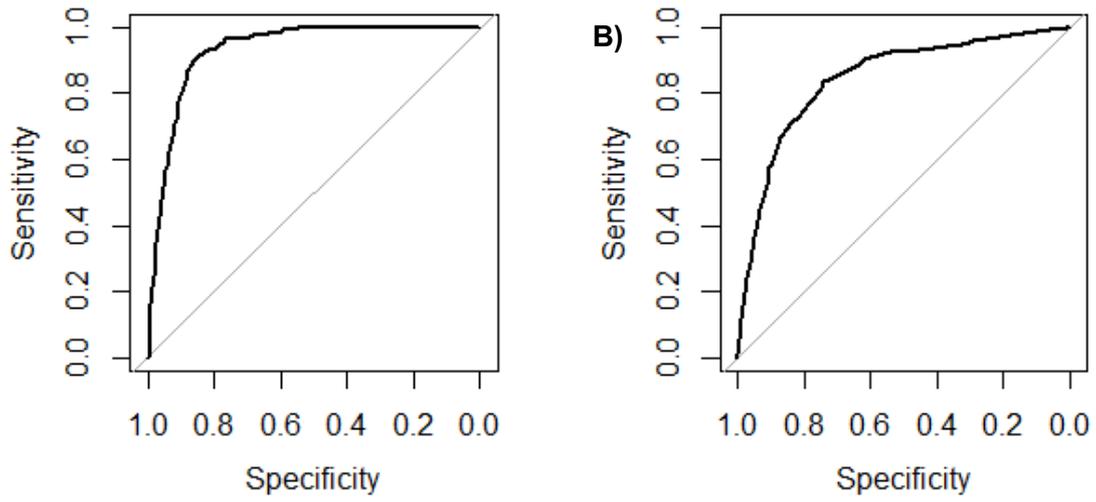
Variables	Mortality(n=7207)		Hospitalization(n=7207)	
	OR	95%CI	OR	95%CI
<b>Age Group</b>				
<64 years (Ref.G)	1.000		1.000	
65-79 years	4.064 ***	2.762; 6.085	3.899 ***	3.287; 4.628
≥ 80 years	11.978 ***	8.291; 17.689	8.537 ***	7.065; 10.335
<b>Gender</b>				
Female (Ref.G)	1.000			
Male	1.245	0.976; 1.590	1.575 ***	1.368; 1.813
<b>Region</b>				
LTV (Ref.G)	1.000			
North	1.243	0.925; 1.683	0.602 ***	0.510; 0.710
Center	1.000	0.675; 1.476	0.586 ***	0.464; 0.738
South	1.301	0.493; 3.196	1.912 *	1.027; 3.506
Islands	0.685	0.196; 1.833	0.466 **	0.275; 0.763
<b>Hospitalization</b>				
No (Ref.G)	1.000			
Yes	6.479 ***	4.874; 8.711	-	-
<b>Comorbidities</b>				
No (Ref.G)	1.000		1.000	
Yes	5.735***	3.331; 10.642	5.193 ***	4.356; 6.212

423 LTV: Lisbon and Tagus Valley; OR: Odds Ratio; 95%CI: 95% Confidence Interval; Ref. G.: Reference group;

424 Significance codes: 0 '\*\*\*' 0.001 '\*\*' 0.01 '\*' 0.05 '.' 0.1 ' ' 1

425 **Figures**

426  
 427 Figure 1: Evolution of the COVID-19 pandemic in Portugal between March 1 and May  
 428 24 including cumulative curves considering: A) number of diagnosis (median=133); B)  
 429 number of hospitalizations (median=17) and C) number of deaths (median=9).



430

431

432 Figure 2: ROC curves with representation of sensitivity and specificity for regression

433 models A) to predict mortality and B) to predict hospitalizations.