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## The impact of vaccination on transmission and death by COVID-19: an observational study in Portugal's biggest primary care cluster

Tedim, S., Pinho-Bandeira, T., Leitão, R., Silva, C., Pinheiro, S., Afreixo, V., Oliveira, A.

1 **The impact of vaccination on transmission and death by COVID-19: an observational study in Portugal's**  
2 **biggest primary care cluster"**

3

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12 **Abstract:**

13 Vaccines are a key tool to manage the COVID-19 pandemic by preventing infection,  
14 hospitalization, severe disease, or death. In Portugal, information on vaccine effectiveness in real-  
15 life settings is still limited. Therefore, the main goal of this study is to evaluate the association  
16 between vaccination against COVID-19 and mortality and transmissibility in the population of the  
17 biggest Primary Care Cluster in Portugal, ACES Baixo Vouga (ACES BV).

18 A retrospective, observational study including all reported cases of COVID-19 in ACES BV  
19 between December 2020 and September 2021 was conducted (N=18,415). Anonymized data on  
20 demographic, clinical, epidemiological characteristics and outcomes of interest of the COVID-19  
21 confirmed cases were collected. To model vaccination's association with death, a logistic  
22 regression analysis was performed. To estimate the effect of vaccination on the number of  
23 secondary cases, a zero-inflated negative binomial model was used.

24 Of 18,415 confirmed cases included in this study, 1,981 (10.8%) were vaccinated. A complete  
25 vaccination scheme against COVID-19 (OR=0.22, CI95 0.09-0.47) and female sex (OR=0.42, CI95  
26 0.30-0.57) protected against death, while age (OR=1.12, CI95 1.10-1.13), comorbidities (OR=4.14,  
27 CI95 2.27- 8.34) and the presence of symptoms (OR=1.72, CI95 2.27-8.34) increased the odds of  
28 death. A complete vaccination scheme (RR 0.63, CI95 0.49–0.81) decreased the risk for the  
29 number of secondary cases in the model without outliers.

30 It is vital to monitor the vaccination effects in the real world and to better understand the  
31 characteristics of COVID-19 vaccine-induced immunity.

32 **Keywords:**

33 COVID-19; Vaccination; Observational study; Mortality; Infectious Disease Transmission.

34  
35 **Introduction:**

36 The coronavirus disease (COVID-19), caused by the Severe Acute Respiratory Syndrome  
37 Coronavirus 2 (SARS-CoV-2), was first reported in patients with atypical pneumonia, in December  
38 2019, in China. These cases were epidemiologically linked with an animal market in Wuhan, Hubei  
39 province (1). On January 30, 2020, the outbreak was declared by the World Health Organization  
40 (WHO) a Public Health Emergency of International Concern (PHEIC) (2). Portugal has a population  
41 of 10,347,892 people (3) and had its first detected case reported on March 2, 2020, reaching  
42 406,051 cases and 6,830 deaths by December 29, 2020, and 1,054,673 cases and 17,853 deaths  
43 by September 10, 2021(4,5). Baixo Vouga Primary Care Cluster (ACES BV) comprises 11  
44 municipalities and is Portugal's biggest Primary Care Cluster, considering its registered users  
45 (assigned or not to a family medicine physician). According to the national official records (last  
46 updated on September 2021), ACES BV accounts for 390,144 users (6). The first confirmed case  
47 of COVID-19 in this ACES occurred on March 8, 2020.

48 The virulence of COVID-19 refers to the degree of the disease's pathogenicity, expressed as the  
49 ratio of severe disease cases over the total cases (case fatality ratio (CFR)). For this study, we  
50 only consider death as a criterion of severity. A recent meta-analysis, showed an overall pooled  
51 CFR of 10.0% (95% confidence interval, CI95 8.0-11.0) for COVID-19 (7). Hospitalized patients  
52 presented higher risk of death (13.0%, CI95 9.0-17.0) compared to non-hospitalized (1.0%, CI95  
53 1.0-3.0), and being admitted in the Intensive Care Unit (ICU) presented a CFR of 37.0% (CI95  
54 24.0-51.0). Older patients (over 50 years old) presented a CFR of 19.0% (CI95 13.0-24.0) (7).

55 Besides age and clinical status, other risk factors have been associated with higher risks of death.  
56 Some comorbidities presented high Hazard Ratio (HR) or Odds Ratio (OR) associated with fatal  
57 COVID-19, as diabetes (HR 1.2-2.0), obesity (OR 1.5-1.75), heart failure (HR 1.3-3.3), chronic  
58 obstructive pulmonary disease (HR 1.12-2.2), dementia (HR 1.4-7.7), liver cirrhosis (OR 3.2-5.9)  
59 and active cancer (OR 1.6-4.7) (8). Some studies have described older age groups, male sex,  
60 living in a more socio-economically deprived community as relevant risk factors for death by  
61 COVID-19 (9,10). A large study concluded that patients of female sex had significantly lower odds  
62 of in-hospital mortality than males, as well as fewer admissions to the ICU and less need for  
63 mechanical ventilation (11).

64 In Portugal, increasing age was, at the beginning of the pandemic, the most relevant risk factor for  
65 hospitalization, ICU admission and death (12). Hospitalization and ICU admissions had a relevant  
66 increase in risk in 60-69 and 70-79-year-old people (12). Comorbidities also have an impact on  
67 clinical outcomes, but this risk was smaller than age and varied for different outcomes. Still,  
68 cardiovascular disease and chronic kidney disease were also found to represent a higher risk for  
69 both ICU admission and death (12).

70 SARS-CoV-2 prevention and control measures depend on controlling person-to-person viral  
71 transmission. The number of secondary cases that arise from an index case is a commonly used  
72 indicator. To allow the determination of risk, secondary attack rates are more useful, but they are  
73 sometimes hard to estimate since their denominator refers to all the exposed people. Certain  
74 settings of enclosed spaces and overcrowding present with high frequencies of contacts between  
75 individuals. A meta-analysis showed a pooled secondary attack rate of 0.7% (CI95 0.4%-1.0%) for  
76 healthcare settings and 18.1% (CI95 15.7%-20.6%) for households. Symptomatic index cases  
77 presented higher secondary attack rates than asymptomatic cases (RR 3.23, CI95 1.46, 7.14) (13).  
78 Vaccines are a key tool to manage the COVID-19 pandemic. They aim to prevent COVID-19  
79 infection, hospitalization, severe disease, or death, by triggering an immune response. Thanks to  
80 an unprecedented effort, information sharing, and bureaucracy reduction, it was possible to

81 produce several vaccines against COVID-19 in a record timespan. In Portugal, vaccination started  
82 on December 27, 2020 (14).

83 As of September 2021, Portugal has 4 available vaccines: SPIKEVAX® (15), VAXZEVRIA® (16),  
84 Janssen® (17), and COMIRNATY® (18). A meta-analysis that assessed the vaccine effectiveness,  
85 for all the four previously mentioned vaccines, found that they prevented any infection 66.9% of the  
86 times (CI95 58.4–73.6) (19). When the outcome was symptomatic infection, the pooled vaccine  
87 effectiveness was 75.7% (CI95 69.3–80.8), as for prevention of severe disease and hospitalization  
88 was 93.8% (CI95 83–98) (19).

89 Guidelines for operating the community vaccination centers and administration of different  
90 vaccines have been released by the Directorate-General of Health (DGS) (15–18,20,21). The  
91 prioritization started by the following groups, in three arms: (1) healthcare workers (HCW), (2)  
92 people living or working at nursing homes (NH), and (3) general population aged 50 or more, with  
93 comorbidities (heart failure, cardiovascular disease cardiac disease, kidney failure, chronic  
94 obstructive pulmonary disease), starting by the older ones. At NH, people were vaccinated against  
95 COVID-19 even if they have had a recent infection (less than six months). By September 12, 2021,  
96 Portugal had 8,983,915 people (85% of the population) with at least one dose of the vaccine and  
97 8,273,795 people (80% of the population) fully vaccinated against COVID-19 (22). In ACES BV,  
98 75.6% of its population was vaccinated with at least one dose and 59.9% was fully vaccinated (23).  
99 By that time, in the whole country, people aged 65 or older were approximately 100% fully  
100 vaccinated (22).

101 There is a lack of information on vaccine efficacy in real-life settings in Portugal. Only one  
102 multicentric study (24), that included Portugal, has assessed vaccine effectiveness so far, through  
103 a convenience sample gathered from a sentinel network of physicians. We aim to evaluate the  
104 effectiveness of COVID-19 vaccination on mortality and transmissibility of the SARS-CoV-2 in the  
105 population of ACES BV. As far as we know, this is the first observational study providing such data  
106 in this country.

107

**108 Methods:***109 Study design and data sources*

110 An observational study including all confirmed cases of COVID-19 in ACES BV reported to the  
111 Public Health Unit (PHU) between 29 December 2020 and 10 September 2021 was conducted (N  
112 = 18,415). *Note that we did not consider reinfection cases.* The main outcomes were the number of  
113 secondary cases and death. Secondary anonymized data was extracted from the local database of  
114 the Public Health Unit of ACES BV on September 10, 2021, including all COVID-19 confirmed  
115 cases whose information was gathered during the epidemiological investigation.

*116 Case definitions*

117 A confirmed case of COVID-19 was defined as anyone with: (1) a positive result for SARS-CoV-2  
118 RNA (*by Reverse transcription polymerase chain reaction RT-PCR*) in nasopharyngeal and/or  
119 oropharyngeal specimens; *or* (2) a positive result in a SARS-CoV-2 antigen test, performed under  
120 the DGS Standard *number* 019/2020 (25).

121 A vaccinated person was defined as someone who got administered one or two doses of the  
122 available vaccines in Portugal, while a non-vaccinated did not receive any dose. A complete  
123 scheme was considered when a person got: (1) two doses of COMIRNATY®, SPIKEVAX® or  
124 VAXZEVRIA®; *or* (2) one dose of Janssen®. An incomplete scheme refers to a single dose of  
125 COMIRNATY®, SPIKEVAX® or VAXZEVRIA®.

126 The number of secondary cases is the number of COVID-19 confirmed cases generated by a  
127 unique infector (a previously confirmed case), according to the epidemiological investigation  
128 undertaken by the PHU.

*129 Risk factors*

130 The following variables were included: vaccination status, age, sex, comorbidities, symptoms,  
131 healthcare worker (HCW), institution (NH or school).

*132 Statistical analysis*

133 A descriptive analysis was performed to characterize the study sample of the confirmed COVID-19  
134 cases and the distribution of the outcomes. Qualitative variables were reported as counts and

135 percentages. Quantitative variables were reported as means and standard deviations (sd). To test  
136 the different allocations between the two groups (vaccinated and non-vaccinated) chi-square was  
137 used for qualitative variables and Wilcoxon Mann-Whitney for quantitative variables. Lilliefors test  
138 was used to assess normality.

139 Death was modelled using a logistic regression model. First, univariate models were calculated  
140 using each co-variable (risk factor) as predictor. Considering the risk factors identified in previous  
141 literature, stepwise selection based on AIC (Akaike information criterion) was applied to obtain the  
142 final multivariate model. Only main effects (main associations) were considered. The same process  
143 was used for the number of secondary cases using a zero-inflated negative binomial model.

144 Unknown classifications were removed from the models, resulting in different N depending on the  
145 model.

146 Regression models were compared using the Likelihood-ratio test. To determine models'  
147 robustness, outliers in the models were identified based on standardized Pearson Residual and  
148 removed if the absolute value was higher than three.

149 Observations were assumed to be independent despite possible clustering within the  
150 municipalities. Statistical analysis was performed using R version 4.0.5. All analyses are presented  
151 with 95% confidence intervals (CI95). In statistical hypothesis, a p-value  $<0.05$  is considered as  
152 statistically significant.

153

## 154 **Results:**

### 155 *Descriptive*

156 Descriptive statistics comparing the vaccinated and non-vaccinated populations of infected  
157 individuals (N = 18,415) are presented in Table 1. Considering the population of infected  
158 individuals in ACES BV, the proportion of death in non-vaccinated individuals was 1.66%  
159 compared to 0.86% in individuals with some sort of vaccination. Comorbidities were statistically  
160 different in the non-vaccinated (29.4%) and vaccinated (35.0%). A similar result was observed for

161 sex, where females correspond to 58.3% of vaccinated compared to 53.4% of non-vaccinated.  
162 Accordingly, the mean age is different in non-vaccinated (41.2 years) and vaccinated populations  
163 (51.2 years). Individuals who died from COVID-19 have a mean age of 82.4 years (sd 11.8)  
164 compared to 41.6 years (sd 21.9) of the remaining infected. The distribution for the number of  
165 secondary cases (Figure 1) reached higher values for the non-vaccinated with symptoms (range 0  
166 to 31). In the groups referring to the individuals without vaccination (range 0 to 31) and an  
167 incomplete scheme (range 0 to 19), having symptoms appeared to be associated with a higher  
168 number of secondary cases, when compared to not having symptoms (range 0 to 8 and 0 to 4  
169 respectively). This was no longer visible in the complete scheme group, where the maximum  
170 number of secondary cases is very close for both the symptomatic (7) and non-symptomatic group  
171 (5).

#### 172 *Mortality*

173 Results for the univariate model considering death as the outcome (Table 2) showed that having  
174 started vaccination (OR 0.51, CI95 0.30-0.81) and being female (OR 0.64, CI95 0.51-0.81) both  
175 protected from death, while having associated comorbidities (OR 38.6, CI95 22.0-75.5) and  
176 working or living in an NH institution (OR 6.17, CI95 4.76-7.94) were risk factors. Age (OR 1.12,  
177 CI95 1.11-1.13) also presented as a risk factor, while presenting symptoms is a protective factor  
178 (OR 0.63, CI95 0.50-0.81). In the multivariate analysis, of the initially considered variables, HCW  
179 and institution were not selected for the optimized model. Considering the remaining variables, the  
180 behavior (the tendency of the effect size) was consistent except for the presence of symptoms,  
181 which changed from protective to a risk factor (OR 1.69, CI95 1.17-2.49). Also, the effect of  
182 comorbidities decreased in the multivariate model (OR 4.15, CI95 2.27-8.35).

183 An alternative model tested vaccination as a three-class variable (complete, incomplete and non-  
184 vaccinated) and the fit was similar to the two-class model (AIC of 1,266.8). All OR had the same  
185 order of magnitude and tendency. Having a complete (OR 0.55, CI95 0.27-0.99) or incomplete (OR  
186 0.41, CI95 0.16-0.84) scheme showed to be a protective factor against death when compared to



187 non-vaccinated. However, only a complete scheme was statistically significant. A sensitivity  
188 analysis to the exclusion of outliers showed both models are robust to outliers' exclusion.

## 189 **Discussion:**

190 As expected, according to previous literature, our results showed that older people, male sex, and  
191 people with comorbidities had a higher risk of mortality [5], with risk of death increasing 6% for  
192 each year of life. Additionally, belonging to an institution, when adjusted for confounders, did not  
193 appear to play an important role in mortality.

194 These results have some limitations that should be considered. The analysis was made using the  
195 cumulative COVID-19 confirmed cases in ACES Baixo Vouga and did not consider the timely  
196 variation of the epidemic's characteristics in that area – e.g. incidence, transmissibility, prevalence  
197 of variants with different virulence, and the characteristics of the affected population in each phase  
198 (age, comorbidities).

### 200 *Number of secondary cases*

201 The first approach used to model the number of secondary cases was a Poisson model. However,  
202 it was not adequate due to overdispersion. Furthermore, the distribution for the number of  
203 secondary cases is negatively skewed presenting a large incidence of zero (Figure 2). In these  
204 cases, zero-inflated models are more adequate, as they provide a better fit (26,27). Zero-inflated  
205 negative binomial was considered better when compared to the Zero-inflated Poisson, as proven  
206 by the result of the likelihood ratio test comparing both models ( $\chi^2(1)=720.89$ ,  $p < 0.001$ ) (28). Uni-  
207 variate analysis (Table 3) showed that the relative risk (RR) for the number of secondary cases  
208 was lower in vaccinated individuals when compared to non-vaccinated (RR 0.83, CI95 0.70–0.99).  
209 Age had a RR close to 1 (RR 0.99, CI95 0.99–0.99), despite being statistically significant its effect  
210 has no practical meaning. Having symptoms presented as a risk factor for the number of  
211 secondary cases (RR 1.35, CI95 1.16–1.58) while the relative risk is lower for individuals who have  
212 comorbidities (RR 0.87, CI95 0.78-0.98). Being an HCW was not associated with the outcome in a

213 statistically significant way (RR 0.82, CI95 0.64–1.04), as well as being part of an NH (RR 1.21,  
214 CI95 0.96–1.52) or a school (RR 1.05, CI95 0.91–1.21).

215 In the multivariable model (M1), vaccination, comorbidities, symptoms, HCW and institution were  
216 selected to predict the number of secondary cases deriving from a unique infector. Having  
217 symptoms increased the risk of the outcome (RR 1.44, CI95 1.21–1.71), corresponding to a small  
218 increase in the risk when compared to the univariate analysis. In this model, the protective effect of  
219 comorbidities is no longer statistically significant (RR 0.94, CI95 0.85-1.03). Despite the results in  
220 the univariate analysis ( $p$ -value > 0.05), HCW and institution were selected to the adjusted model,  
221 using AIC to select variables. HCW (RR 0.77, CI95 0.62–0.95) and school (RR 0.97, CI95 0.84–  
222 1.12) were protective factors for the outcome. The latter showed an opposite tendency to the one  
223 on the univariate analysis, however, it was not statistically significant. Institutionalization in an NH  
224 (RR 1.46, CI95 1.17–1.81) increased the risk of the outcome, which is consistent with the  
225 univariate model. In M1, vaccination decreased the risk of the outcome (RR 0.89, CI95 0.78–1.04),  
226 but was no longer statistically significant.

227 As before, a similar model (M2) was calculated using vaccination as a three-class variable (Table  
228 4). The models were very similar in what comes to fitness. All co-variables presented the same  
229 behavior. Presenting symptoms was a risk factor (RR 1.44, CI95 1.21-1.71) as well as being part of  
230 an NH (RR 1.48, CI95 1.18–1.86). Being an HCW decreased the risk of the outcome (RR 0.76,  
231 CI95 0.61–0.95). Being associated with a school was not statistically significant (RR 0.97, CI95  
232 0.83–1.12), as well as having comorbidities (RR 0.93, CI95 0.85-1.03). Both complete (RR 0.81,  
233 CI95 0.67–1.01) and incomplete (RR 0.97, CI95 0.79–1.19) vaccination schemes were protective  
234 when compared with non-vaccinated individuals. Models' sensitivity to outliers was tested, resulting  
235 in model M3 (two-class vaccination) and M4 (three-class vaccination). In both cases, the results  
236 agreed with univariate analysis. Any vaccination (RR 0.72, CI95 0.61–0.84), or a complete scheme  
237 (RR 0.63, CI95 0.49–0.81) or incomplete scheme (RR 0.73, CI95 0.59-0.90), were statistically  
238 significant when compared with non-vaccination. Other covariables had very similar behavior in  
239 both models. Symptoms in M3 (RR 2.69, CI95 2.14–3.38) and M4 (RR 2.20, CI95 1.80–2.68), and

240 comorbidities in M3 (RR 0.75, CI95 0.68-0.83) and in M4 (RR 0.75, CI95 0.68-0.82) were  
241 statistically significant, while HCW, NH and school were not.

## 242 **Discussion:**

243 This study was performed in the early phases of vaccination against COVID-19 in Portugal and  
244 used data from 18,415 confirmed cases, from which 1,981 were vaccinated. In the infected  
245 population, HCWs, as well as members of an NH, have a higher proportion of vaccinated  
246 individuals whereas in schools most infected individuals are not vaccinated, which is concordant  
247 with the Portuguese vaccination plan phases (21). The **mean** age and the proportion of  
248 comorbidities of the infected are higher in the vaccinated than that of the non-vaccinated  
249 individuals. These results might be a reflex of the vaccination phases where older people with  
250 comorbidities were prioritized (15). The proportion of deaths is lower in the vaccinated group, as  
251 well as the **mean** number of secondary cases generated.

252 Associations between the vaccination status and the two main outcomes (death and number of  
253 secondary cases) were identified. For death, complete vaccination showed a protective association  
254 after adjustment for confounding factors, with an OR of 0.22 (CI95 0.09-0.47), which is in line with  
255 previous literature (19). For the number of secondary cases, complete vaccination presented a  
256 nearly statistically significant protective effect with an RR of 0.81 (CI95 0.65–1.01). This  
257 association presented as significant when removing outliers (RR 0.63, CI95 0.49–0.81). These  
258 results are coherent with other studies that analyzed the same association (19).

259 When analyzing death as an outcome, age, comorbidities, and the presence of symptoms  
260 presented as risk factors, while being of the female sex was protective. Vaccination in general was  
261 protective against death which is consistent with the results found in the literature (29). Analyzing  
262 particularly the vaccination scheme, only complete vaccination is statistically significant. These  
263 results are consistent in all models proposed. The only variable for which the behavior (direction of  
264 the effect size) differentiates from the univariate (protective factor) to the multivariate model (risk  
265 factor) is the presence of symptoms. This happens in both models: for two and three-class status

266 of vaccination, indicating that other variables are confounding factors regarding the presence of  
267 symptoms. However, it is important to highlight that this variable includes a great variety of  
268 symptoms ranging from anosmia to dyspnea and is not consistently filled by PHU staff and may be  
269 associated with a memory bias due to retrospective report from patients. The analysis could have  
270 been performed considering a category for each symptom, but data was not robust enough and  
271 misclassification would be very probable. Future research should analyze confounding  
272 associations between symptoms and death.

273 In M1 and M2 models, used to describe the number of secondary cases, vaccination status, as a  
274 two or three-class variable, was selected. In all models under analysis, vaccination decreases the  
275 risk of the outcome. Having symptoms was always a significant risk factor. Being an HCW was a  
276 protective factor for the outcome number of secondary cases deriving from a unique infector in all  
277 models. Being part of an NH institution was a risk factor in all analyses except for the model  
278 considering the three-class vaccination without outliers. Being part of a school presented an RR  
279 around 1 and was never statistically significant. These covariables were not statistically significant  
280 in the univariate analysis as well as in both models without outliers (M3 and M4). Having  
281 comorbidities was in all models a protective factor, however, it was only significant in the univariate  
282 analysis and the models without outliers. Further research is needed for the effect of these  
283 covariables on the number of secondary cases deriving from one infector, especially to understand  
284 its effect on individuals' behavior to comprehend transmission patterns.

285 Generally, the results when using a three-class variable for vaccination (complete, incomplete or  
286 non-vaccinated) were consistent with the classification as a two-class variable. Using a three-class  
287 variable allows for a more detailed explanation of the effect of vaccines on the outcomes.

288 A major strength of our study is that it assessed the COVID-19 vaccination effectiveness in a real  
289 setting, estimating its effect on SARS-CoV-2 death and transmissibility (number of secondary  
290 cases). As far as we know, this is the first study in Portugal aiming to evaluate the impact of the  
291 COVID-19 vaccination on mortality and transmissibility of the SARS-CoV-2 at a local level (ACES),  
292 in this case in Baixo Vouga, the biggest primary Care Cluster in Portugal. However, some

293 limitations can be raised. Data collection was conditioned to the available human resources thus  
294 local or general peaks of incidence, where a massive number of cases had to be registered  
295 simultaneously, led to inconsistent data collection and consequent decrease of its quality. For  
296 example, the type of comorbidities was under registered in situations related to outbreaks in NH.  
297 The same happened during periods of high incidence for the description of symptoms. This  
298 conditioned the use of the data related to the type of symptoms and type of comorbidities in the  
299 analysis. Further studies are needed to explore the mechanisms involved in the confounding effect  
300 of symptoms and comorbidities in the main associations. To do so, reliable data should be  
301 available, which derives from reinforcement or reorganization of the resources that perform the  
302 epidemiological investigation. Contact tracing was also affected in situations where a lot of cases  
303 had to be registered simultaneously. Most cases in our dataset did not generate any secondary  
304 infections (N=13 968) and our data had a high frequency of zeros, which could underestimate our  
305 main association. Zero-inflated models were used to try to overcome this limitation /adapt to this  
306 situation and obtain a more precise estimate. These models accommodate the existence of false  
307 zeros resulting from observational errors (27).

308 Data robustness and reliability depends on trustful notification systems and in-depth  
309 epidemiological investigation. Future studies must consider the importance of having reliable  
310 databases that consistently report epidemiological links to assess transmissibility. Additionally,  
311 upcoming research should consider different pandemic phases, circulating viral variants, and the  
312 heterologous schedules with different vaccines, as well as the recent homologous or heterologous  
313 booster which is being administered in many European countries. Some herd immunity might  
314 already exist in some areas, but efforts should be done to keep stable settings and avoid future  
315 lockdowns.

316

317 **Ethics committee and informed consent:**

318 This study used a secondary data source, containing anonymous information. It was conducted in  
319 accordance with the Declaration of Helsinki.

320

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433 **Tables:**434 **Table 1:** Descriptive statistics considering the infected population, n= 18,415.

Variable	Vaccinated		p-value		
	No N=16,434	Yes N=1,981			
<b>Scheme</b>					
Complete	0	0.00%	1078	55.10%	
Incomplete	0	0.00%	880	44.90%	
Non-vaccinated	16,434	100%	0	0.00%	
<b>Number secondary cases</b>	0.45	1.05	0.36	0.94	<0.001
<b>Death:</b>					0.009
No	16,161	98.30%	1,964	99.10%	
Yes by COVID-19	273	1.66%	17	0.86%	
<b>Age:</b>	41.2	22.4	51.2	19.9	<0.001
<b>Gender:</b>					<0.001
Female	8,780	53.40%	1,154	58.30%	
Male	7,654	46.60%	827	41.70%	
<b>Comorbidities:</b>					<0.001
No	10,004	70.60%	1,172	65.00%	
Yes	4,172	29.40%	632	35.00%	
<b>Symptoms:</b>					0.882

No	4,027	24.50%	489	24.70%
Yes	12,407	75.50%	1,492	75.30%
<b>HCW:</b>				<0.001
No	15,875	96.60%	1,831	92.40%
Yes	559	3.40%	150	7.57%
<b>Institution:</b>				<0.001
NH	872	5.31%	298	15.00%
School	2,623	16.00%	107	5.40%
No	12,939	78.70%	1,576	79.60%

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Qualitative variables as counts and percentages and quantitative variables as means and standard deviations. To test the homogeneity of the two groups chi-square was used for qualitative variables and Wilcoxon Mann-Whitney test for quantitative variables. Lilliefors test was used to assess normality.  
\*unknown/NA individuals classified as vaccinated but without information on vaccination scheme.  
NH-nursing homes; HCW- healthcare workers

**Table 2:** Results for logistic regression models proposed to describe death (N= 18,415). Reference levels for categorical co-variables are male, no comorbidities, no symptoms, not an HCW and not institutionalized. The selection of the multivariate model was based on the best AIC.

a) Two-class vaccination classified model. n= 18,407.

Variable	Univariate			Multivariate		
	OR	CI95	p-value	OR	CI95	p-value
<b>Vaccinated (Yes)</b>	0.51	0.30, 0.81	<b>0.008</b>	0.3	0.15-0.53	<b>&lt;0.001</b>
<b>Age</b>	1.12	1.11, 1.13	<b>&lt;0.001</b>	1.12	1.10-1.13	<b>&lt;0.001</b>
<b>Sex (Female)</b>	0.64	0.51, 0.81	<b>&lt;0.001</b>	0.42	0.30-0.57	<b>&lt;0.001</b>
<b>Comorbidities (Yes)</b>	38.6	22.0, 75.5	<b>&lt;0.001</b>	4.15	2.27-8.35	<b>&lt;0.001</b>
<b>Symptoms (yes)</b>	0.63	0.50, 0.81	<b>&lt;0.001</b>	1.69	1.17-2.49	<b>0.006</b>
<b>HCW (yes)</b>	0	0.00, 0.00	0.953			
<b>Institution (NH)</b>	6.17	4.76, 7.94	<b>&lt;0.001</b>			
<b>Institution (School)</b>	0	0.00, 0.00	0.962			

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NH-nursing homes; HCW- healthcare workers.

b) Three-class vaccination model, n= 18,384.

Variable	Univariate			Multivariate		
	OR	CI95	p-value	OR	CI95	p-value
<b>Scheme (Complete)*</b>	0.55	0.27- 0.99	0.068	0.22	0.09- 0.47	<b>&lt;0.001</b>
<b>Scheme (Incomplete)*</b>	0.41	0.16- 0.84	<b>0.03</b>	0.46	0.17- 1.00	0.075
<b>Age</b>	1.12	1.11- 1.13	<b>&lt;0.001</b>	1.12	1.10- 1.13	<b>&lt;0.001</b>
<b>Sex (Female)</b>	0.64	0.51- 0.81	<b>&lt;0.001</b>	0.42	0.30- 0.57	<b>&lt;0.001</b>
<b>Comorbidities (Yes)</b>	38.6	22.0- 75.5	<b>&lt;0.001</b>	4.14	2.27- 8.34	<b>&lt;0.001</b>
<b>Symptoms (Yes)</b>	0.63	0.50- 0.81	<b>&lt;0.001</b>	1.72	1.19- 2.53	<b>0.005</b>
<b>HCW (Yes)</b>	0	0.00- 0.00	0.953			

<b>Institution (NH)</b>	6.17	4.76- 7.94	<b>&lt;0.001</b>
<b>Institution (School)</b>	0	0.00- 0.00	0.962

\*Vaccination classified as complete scheme, incomplete scheme or non-vaccinated (reference level).

NH-nursing homes; HCW- healthcare workers.

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**Table 3:** Zero-inflated negative binomial model for the number of secondary cases, considering vaccination yes and non-vaccinated. Univariate and multivariate model (M1) n= 15,975.

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Variable	Univariable			Multivariate (M1)		
	RR	CI95	p-value	RR	CI95	p-value
Count Model						
<b>Vaccinated (Yes)</b>	0.83	(0.70 – 0.99)	<b>0.036</b>	0.88	(0.76 – 1.03)	0.119
<b>Age</b>	0.99	(0.99 – 0.99)	<b>&lt;0.001</b>			
<b>Sex (Female)</b>	1.05	(0.95 - 1.15)	<b>0.372</b>			
<b>Comorbidities</b>	0.87	(0.78 – 0.98)	<b>&lt;0.001</b>	0.94	(0.85 – 1.03)	0.189
<b>Symptoms (Yes)</b>	1.35	(1.16 – 1.58)	<b>&lt;0.001</b>	1.44	(1.21 – 1.71)	<b>&lt;0.001</b>
<b>HCW (Yes)</b>	0.82	(0.64 – 1.04)	0.097	0.77	(0.62 – 0.95)	<b>0.015</b>
<b>Institution (NH)</b>	1.21	(0.96 – 1.52)	0.1	1.49	(1.18 – 1.87)	<b>0.001</b>
<b>Institution (School)</b>	1.05	(0.91 – 1.21)	0.5	0.97	(0.84 – 1.12)	0.673
				AIC	27435.9	

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NH-nursing homes; HCW- healthcare workers.

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**Table4:** Zero-inflated negative binomial model for the number of secondary cases, considering 3 levels for vaccination. n= 15,956 (M2).

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Variable	Multivariate (M2)			Without outliers		
	RR	95% CI1	p-value	RR	95% CI1	p-value
<b>Scheme (Complete)</b>	0.81	(0.65 – 1.01)	0.062	0.63	(0.49 – 0.81)	<b>&lt;0.001</b>
<b>Scheme (Incomplete)</b>	0.97	(0.79 – 1.19)	0.746	0.73	(0.59 – 0.90)	<b>&lt;0.001</b>
<b>Comorbidities (Yes)</b>	0.93	(0.85 – 1.03)	0.19	0.75	(0.68 – 0.82)	<b>0.004</b>
<b>Symptoms (Yes)</b>	1.44	(1.21 – 1.71)	<b>&lt;0.001</b>	2.2	(1.80 – 2.68)	<b>&lt;0.001</b>
<b>HCW (Yes)</b>	0.76	(0.61 – 0.95)	<b>0.015</b>	0.84	(0.66 – 1.07)	0.151
<b>Institution (NH)</b>	1.48	(1.18 – 1.86)	<b>&lt;0.001</b>	0.89	(0.71 – 1.12)	0.319
<b>Institution (School)</b>	0.97	(0.83 – 1.12)	0.662	0.92	(0.81 – 1.04)	0.167
	AIC	27418.26		AIC	23726.63	

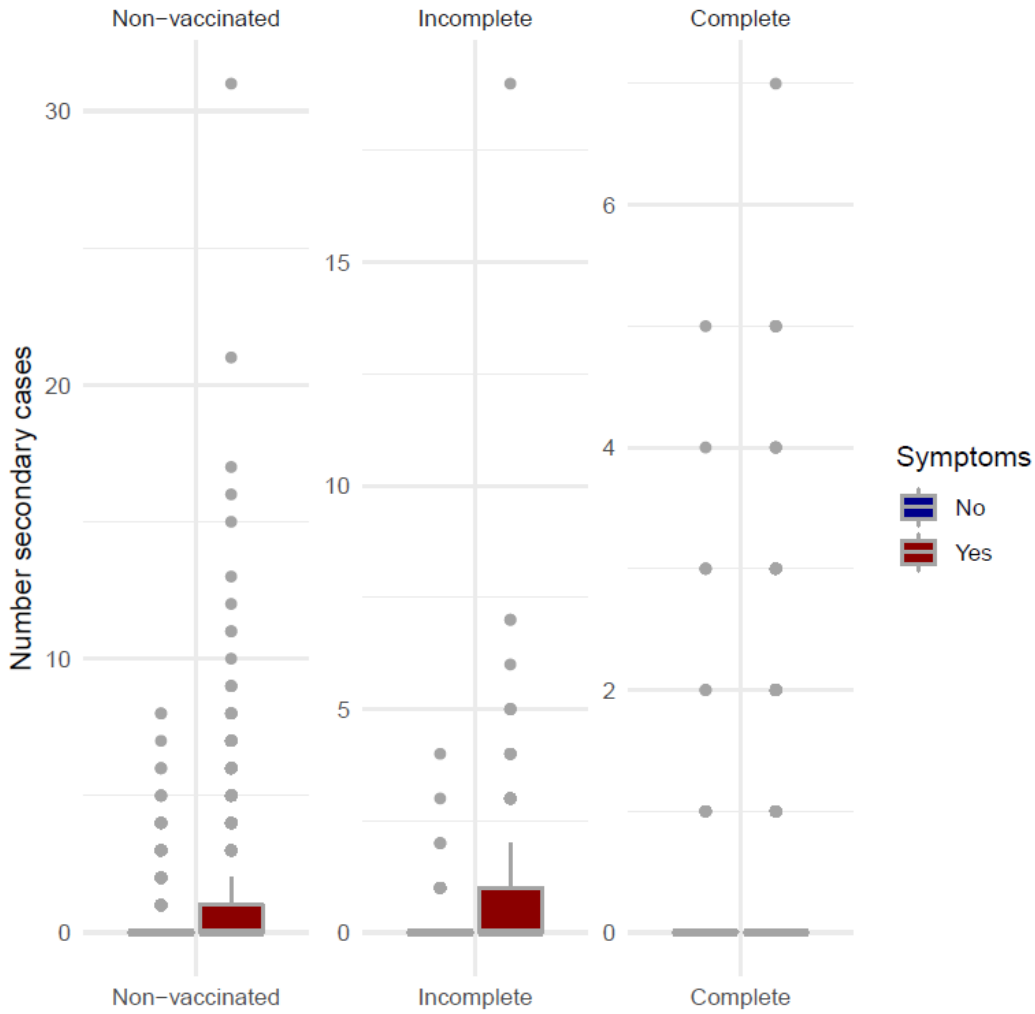
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NH-nursing homes; HCW- healthcare workers.

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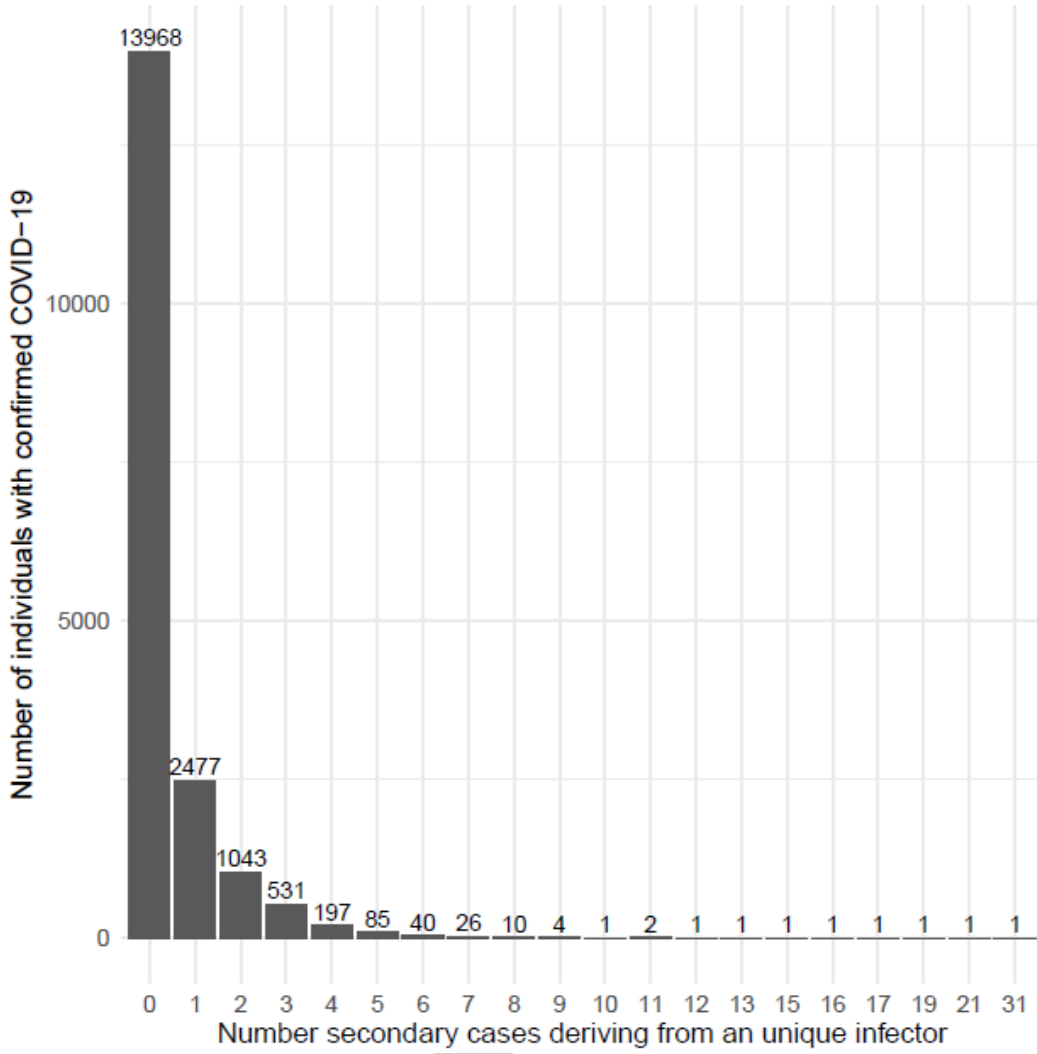
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**Figures:**



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 467 **Figure 1:** Box plot for the number of secondary cases in the non-vaccinated group and the  
 468 incomplete and complete group scheme, categorized by the variable symptoms, n= 18,392 (for 23  
 469 individuals the vaccination scheme was unknown).

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**Figure 2:** Distribution for the number of secondary cases, n=18,415.