



Article Vulnerability Predictors of Post-Vaccine SARS-CoV-2 Infection and Disease—Empirical Evidence from a Large Population-Based Italian Platform

Giovanni Corrao ^{1,2}, Matteo Franchi ^{1,2,*}, Danilo Cereda ³, Francesco Bortolan ³, Olivia Leoni ³, Catia Rosanna Borriello ³, Petra Giulia Della Valle ³, Marcello Tirani ³, Giovanni Pavesi ³, Antonio Barone ⁴, Michele Ercolanoni ⁴, Jose Jara ⁴, Massimo Galli ^{5,6} and Guido Bertolaso ⁷

- ¹ National Centre for Healthcare Research and Pharmacoepidemiology, University of Milano-Bicocca, 20126 Milan, Italy; giovanni.corrao@unimib.it
- ² Unit of Biostatistics, Epidemiology and Public Health, Department of Statistics and Quantitative Methods, University of Milano-Bicocca, 20126 Milan, Italy
- ³ Directorate General for Health, Lombardy Region, 20124 Milan, Italy; danilo_cereda@regione.lombardia.it (D.C.); francesco_bortolan@regione.lombardia.it (F.B.); olivia_leoni@regione.lombardia.it (O.L.); catia_rosanna_borriello@regione.lombardia.it (C.R.B.); dellavalle_petra_stg@regione.lombardia.it (P.G.D.V.); marcello_tirani@regione.lombardia.it (M.T.); giovanni_pavesi@regione.lombardia.it (G.P.)
- ⁴ Azienda Regionale per l'Innovazione e gli Acquisti (ARIA) S.p.A., 20124 Milan, Italy; attonia harang@ariagna.it (A.B.); michala argalanani@ariagna.it (M.F.); iaga jarg@ayt ariag
 - antonio.barone@ariaspa.it (A.B.); michele.ercolanoni@ariaspa.it (M.E.); jose.jara@ext.ariaspa.it (J.J.)
 - Infectious Diseases Unit, Luigi Sacco Hospital, 20157 Milan, Italy; massimo.galli@unimi.it
 - Department of Biomedical and Clinical Sciences, University of Milan, 20157 Milan, Italy
- ⁷ Vaccination Campaign Management, Lombardy Region, 20124 Milan, Italy; bertolaso1@gmail.com
 * Correspondence: matteo.franchi@unimib.it; Tel.: +39-02-6448-5832

Abstract: We aimed to identify individual features associated with increased risk of post-vaccine SARS-CoV-2 infection and severe COVID-19 illness. We performed a nested case–control study based on 5,350,295 citizens from Lombardy, Italy, aged ≥ 12 years who received a complete anti-COVID-19 vaccination from 17 January 2021 to 31 July 2021, and followed from 14 days after vaccine completion to 11 November 2021. Overall, 17,996 infections and 3023 severe illness cases occurred. For each case, controls were 1:1 (infection cases) or 1:10 (severe illness cases) matched for municipality of residence and date of vaccination completion. The association between selected predictors (sex, age, previous occurrence of SARS-CoV-2 infection, type of vaccine received, number of previous contacts with the Regional Health Service (RHS), and the presence of 59 diseases) and outcomes was assessed by using multivariable conditional logistic regression models. Sex, age, previous SARS-CoV-2 infection, type of vaccine and number of contacts with the RHS were associated with the risk of infection and severe illness. Moreover, higher odds of infection and severe illness were significantly associated with 14 and 34 diseases, respectively, among those investigated. These results can be helpful to clinicians and policy makers for prioritizing interventions.

Keywords: SARS-CoV-2; COVID-19; vaccines; vulnerability; predictors

1. Introduction

The emergence of novel SARS-CoV-2 variants [1] and the decreasing trend in the titers of antibodies in vaccinated individuals [2] have raised public health concerns regarding the efficacy and duration of protection induced by first-generation vaccines [3]. The persistence of neutralizing antibodies and the degree of protection they confer remain largely unknown. Hence, understanding the risk of both infection with SARS-CoV-2 and severe clinical manifestations of COVID-19 after vaccination is completed provides an avenue to assess the path to protection against COVID-19 [4]. Finally, identifying the



Citation: Corrao, G.; Franchi, M.; Cereda, D.; Bortolan, F.; Leoni, O.; Borriello, C.R.; Della Valle, P.G.; Tirani, M.; Pavesi, G.; Barone, A.; et al. Vulnerability Predictors of Post-Vaccine SARS-CoV-2 Infection and Disease—Empirical Evidence from a Large Population-Based Italian Platform. *Vaccines* **2022**, *10*, 845. https://doi.org/10.3390/ vaccines10060845 5

Academic Editor: S. Louise Cosby

Received: 18 April 2022 Accepted: 24 May 2022 Published: 26 May 2022

Publisher's Note: MDPI stays neutral with regard to jurisdictional claims in published maps and institutional affiliations.



Copyright: © 2022 by the authors. Licensee MDPI, Basel, Switzerland. This article is an open access article distributed under the terms and conditions of the Creative Commons Attribution (CC BY) license (https:// creativecommons.org/licenses/by/ 4.0/). predictors of post-vaccine SARS-CoV-2 infection and COVID-19 disease is mandatory for prioritizing interventions.

With the aim to shed light on this field, we leveraged the integrated platform of the vaccination campaign of Lombardy, the largest Italian region, including almost nine million candidates for vaccination (i.e., beneficiaries of the Regional Health Service (RHS) aged 12 years or older). Using this observational database, we explored demographic and clinical factors associated with both increased risk of post-vaccine SARS-CoV-2 infection and severe COVID-19 illness.

2. Materials and Methods

The target population includes 5,351,085 beneficiaries of the Regional Health Service aged 12 years or older, who completed a vaccination program (i.e., two doses of vaccine provided by Pfizer, Moderna or Oxford-AstraZeneca, or one dose of vaccine by Janssen) from 17 January to 31 July 2021. The 790 citizens who experienced SARS-CoV-2 infection and/or COVID-19 hospital admission or death within 14 days after vaccine completion were excluded. The remaining 5,350,295 citizens entered the study cohort and were followed from 14 days after vaccine completion (under the assumption that immune coverage is achieved 2 weeks after receiving the vaccine [5]) to outcome occurrence (see after), death for a cause different from COVID-19, emigration, or 11 November 2021, whichever occurred earliest (follow-up).

A population-based platform was realized since starting vaccination campaign by means of record linking (i) the COVID-19 vaccination registry (collecting date, type, and dose of vaccine dispensed), (ii) the registry of confirmed diagnosis of SARS-CoV-2 infection (collecting ascertained infections and hospital admissions, emergency-room access and deaths due to COVID-19), and (iii) the health care utilization database (collecting various types of information, including causes of death, inpatient diagnoses supplied by public or private hospitals, and outpatient drug dispensation). All these different data may be interconnected through a deterministic record linkage because a single individual identification code is used in all databases. To preserve privacy, each identification code was deidentified automatically, with this inverse process being allowed only for the RHS on request from judicial authorities. Further details of the health care databases used in the context of COVID-19 in Lombardy have been reported [6].

A nested case–control design was adopted by separately listing cases who during follow-up experienced the first occurrence of either (i) infection documented by nasopharyngeal swab testing positive for SARS-CoV-2 via a PCR test in any clinical setting regardless of the presence of symptoms; or (ii) COVID-19 hospital admission, including admission to an intensive care unit, or death. These were denoted infection and severe illness cases, respectively. The date of outcome occurrence was denoted the index date. For each case patient, one (infection cases) or ten (severe illness cases) controls were randomly selected from the study cohort who had not experienced the outcomes at the index date, to be matched for municipality of residence and date of vaccination completion.

The following information were retrieved at the individual level: gender, age at cohort entry, previous occurrence of infection from SARS-CoV-2, type of vaccine received (categorized as mRNA-based and adenovirus-vectored vaccines), and medical pathway traced from contacts with the RHS during 2018 and 2019. The latter comprised categories of the number of contacts with the RHS, and the presence/absence of 59 diseases/conditions (candidate predictors) traced though hospital admissions and drug prescriptions. The list of candidate predictors included practically all nosologic categories and was prepared taking into consideration morbidity and mortality predictors reported by selected systematic reviews and meta-analyses [7–9], as well as in a population-based cohort study [10]. The list of candidate predictors, and the corresponding codes, are reported in Supplementary Table S1.

With the aim of investigating the strength of association between the above reported factors and the odds of experiencing the outcome of interest, conditional logistic regression

was fitted by including all these covariates in a unique model. With the aim of flexibly modelling, the dose–response relationship between age and the odds of the considered outcomes, restricted cubic splines were used with four knots, and the results were presented as a nonlinear trend in odds ratio, with 95% confidence bands, using 40 years old as reference age [11]. Subsequently, with the aim of investigating the association between each candidate predictor and the outcome of interest, conditional logistic regression was fitted by including one condition (which is entered in the model as a dichotomous variable, with a value of 1 or 0 according to whether the specific condition was or was not recorded at least during the years 2018 and 2019) while adjusting for the above considered covariates. Only conditions affecting at least 10 cases of either infection or severe illness were included in this analysis.

3. Results

Among the 5,350,295 citizens included into the study cohort, 46.9% were men, their mean age was 57.7 years (SD 18.0 years) and 76.9% of them received an mRNA-based vaccine. Cohort members accumulated 24,849,267 person-months of observation (on average almost 4.6 months for each of them) and generated 17,996 infections and 3023 severe illnesses (incidence rates being 7.2 and 1.2 cases per 10,000 person-months, respectively). The 17,996 infection cases were matched with as many controls, while the 3023 severe illness cases were matched with 30,230 controls.

Figure 1 shows that the relationship between age and considered outcomes had opposite patterns. The odds of SARS-CoV-2 infection reached the highest peak at the age of 30 years, followed by decreasing values until 60 years and relatively stable ones afterwards. Conversely, the lowest values in odds of severe COVID-19 were reached around the age of 20 years, followed by increasing values which reached the highest peak around the age of 95 years.

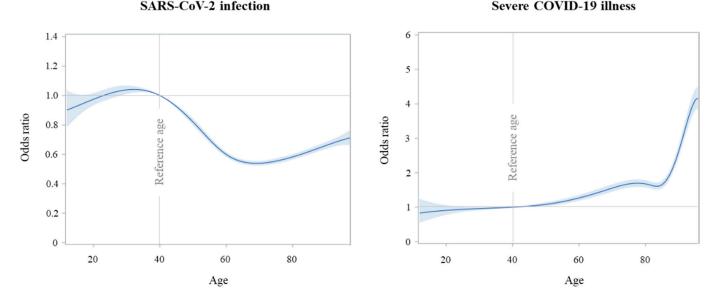


Figure 1. Flexibly modelling the relationship between age at vaccine completion and the odds of post-vaccine SARS-CoV-2 infection (**left panel**) and severe COVID-19 illness (**right panel**).

Other risk factors of both post-vaccine SARS-CoV-2 infection and severe COVID-19 illness are pictured in Figure 2. Male gender significantly increased the odds of severe illness. A trend towards increasing odds of both infection and severe illness was observed as the number of contacts with the RHS increased. Having had a previous SARS-CoV-2 infection was a significant protective factor against both post-vaccine infection and severe illness. Having been vaccinated with an mRNA-based product was a protective factor against infection.

	Cases N (%)	Controls N (%)	OR (95% CI)								
Sex: female	10,023 (55.7)	10,164 (56.5)	Reference								
Sex: male	7973 (44.3)	7832 (43.5)	1.03 (0.99-1.08)								
Conctacts with NHS <5	7432 (41.3)	7258 (40.3)	Reference								
Conctacts with NHS 5-100	8392 (46.6)	8815 (49.0)	1.06 (1.01-1.12)							•	
Conctacts with NHS >100	2172 (12.1)	1923 (10.7)	1.43 (1.31-1.56)								
No previous COVID-19 infection	17,824 (99.0)	16,957 (94.2)	Reference								
Previous COVID-19 infection	172 (1.0)	1039 (5.8)	0.15 (0.13-0.18)	_							
Vaccine type: mRNA	14,432 (80.2)	14,571 (81.0)	Reference								
Vaccine type: adenovirus	3564 (19.8)	3425 (19.0)	1.33 (1.24–1.44)							_	
				0.12	0.18	0.25	0.35	0.50	0.71	1.0	1.4

SARS-CoV-2 infection

OR (95% CI)

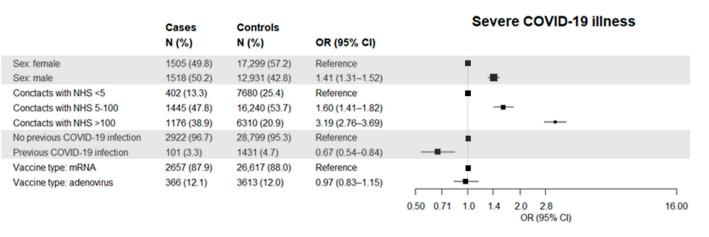


Figure 2. Forest plots showing the association between selected features of the study cohort (citizens who completed scheduled vaccine plan) and the odds of post-vaccine SARS-CoV-2 infection (**top panel**) and severe COVID-19 illness (**bottom panel**). Squares represents the point estimates (i.e., the odds ratios) and the straight line represents the 95% confidence interval.

Figure 3 shows the association strengths between 49 candidate predictors which affected at least 10 cases of infection. Significant higher odds of infection were associated with 14 diseases/conditions, i.e., the 29% of the investigated factors. The most associated disease/conditions were chronic kidney disease (OR = 1.80, 95% CI 1.38 to 2.35), dementia/Alzheimer's disease (OR = 1.62, 1.27 to 2.05), and transplantation (OR = 1.48, 1.05 to 2.08).

Similarly, Figure 4 shows the associations between 43 candidate predictors which affected at least 10 cases of severe illness. Among these, 34 significantly increased the odds of severe illness, i.e., the 79% of the investigated factors. The most associated disease/conditions were chronic kidney disease (OR = 2.95, 95% CI 2.32 to 3.76), acute respiratory infections (OR = 2.84, 1.80 to 4.47), and other mental disorders (OR = 2.53, 1.59 to 4.04).

Bipolar disorders

	Cases	Controls	
	N (%)	N (%)	OR (95% CI)
Chronic kidney disease	170 (0.9)	100 (0.6)	1.80 (1.38-2.35)
Dementia / Alzheimer	188 (1.0)	131 (0.7)	1.62 (1.27-2.05)
Transplantation	95 (0.5)	60 (0.3)	1.48 (1.05-2.08)
Other diseases of the respiratory system	384 (2.1)	351 (2.0)	1.40 (1.19–1.64)
Other diseases of the musculoskeletal system	429 (2.4)	335 (1.9)	1.38 (1.19–1.61)
Heart failure	204 (1.1)	152 (0.8)	1.36 (1.09–1.69)
Other mental disorders	62 (0.3)	48 (0.3)	1.31 (0.89–1.95)
Autoimmune haemolytic anaemias	2004 (11.1)	1621 (9.0)	1.29 (1.20-1.39)
Disorders of fluid and acid-base balance	51 (0.3)	49 (0.3)	1.28 (0.85-1.93)
Valvular diseases	74 (0.4)	58 (0.3)	1.28 (0.89-1.85)
Other disorders of endocrine diseases	102 (0.6)	89 (0.5)	1.24 (0.92-1.66)
Gout	764 (4.2)	643 (3.6)	1.23 (1.10-1.39)
Chronic Obstructive Pulmonary Disease, Asthma	1927 (10.7)	1592 (8.8)	1.23 (1.14-1.32)
Acute respiratory infections	39 (0.2)	34 (0.2)	1.22 (0.76-1.96)
Arrhythmia	640 (3.6)	559 (3.1)	1.20 (1.06-1.36)
Chronic pain	707 (3.9)	610 (3.4)	1.18 (1.05–1.32)
Coronary and peripheral vascular disease	1612 (9.0)	1499 (8.3)	1.16 (1.08–1.26)
Corticosteroids		2121 (11.8)	1.16 (1.08–1.24)
	2310 (12.8)		
Vascular disease	65 (0.4)	57 (0.3)	1.15 (0.79–1.66)
Diseases of the skin and subcutaneous tissues	257 (1.4)	226 (1.3)	1.14 (0.95–1.37)
Acute myocarial infacrtion	424 (2.4)	379 (2.1)	1.13 (0.97–1.31)
Malignant neoplasm	599 (3.3)	571 (3.2)	1.12 (0.99-1.26)
nsulin therapy	422 (2.3)	357 (2.0)	1.12 (0.96-1.31)
Psychosis	504 (2.8)	479 (2.7)	1.11 (0.97-1.27)
Cerebrovascular diseases	185 (1.0)	183 (1.0)	1.11 (0.89-1.39)
Obesity	40 (0.2)	39 (0.2)	1.09 (0.69-1.72)
Depression	1943 (10.8)	1866 (10.4)	1.08 (1.00-1.16)
Other diseases of the circulatory system	401 (2.2)	388 (2.2)	1.08 (0.93-1.25)
	· ·		· · ·
Other diseases of the digestive system	463 (2.6)	444 (2.5)	1.08 (0.94–1.24)
Diabetes without insulin therapy	997 (5.5)	969 (5.4)	1.06 (0.96–1.17)
Other diseases of the nervous system	131 (0.7)	135 (0.8)	1.06 (0.83-1.37)
Oral anticoagulant agents	842 (4.7)	822 (4.6)	1.06 (0.95-1.18)
Chronic and acute pancreatitis	21 (0.1)	21 (0.1)	1.06 (0.57-1.98)
Parkinson's disease and parkinsonism	197 (1.1)	194 (1.1)	1.04 (0.84-1.28)
Drug addition	15 (0.1)	10 (0.1)	1.03 (0.45-2.32)
Epilepsy and recurrent seizures	386 (2.1)	363 (2.0)	1.03 (0.88-1.19)
Symptoms, signs and ill-defined conditions	223 (1.2)	230 (1.3)	1.02 (0.84-1.24)
Disorders of the eye and adnexa	59 (0.3)	62 (0.3)	1.01 (0.70–1.47)
Other diseases of the blood	26 (0.1)	23 (0.1)	0.99 (0.55–1.76)
Hypertension	2770 (15.4)	2934 (16.3)	0.97 (0.91-1.04)
Other diseases of the genitourinary system	395 (2.2)	425 (2.4)	0.97 (0.84-1.12)
Benign neoplasm	139 (0.8)	149 (0.8)	0.96 (0.76-1.22)
Inflammatory bowel diseases	331 (1.8)	345 (1.9)	0.96 (0.82-1.12)
Dyslipidaemia	3037 (16.9)	3238 (18.0)	0.94 (0.88-1.00)
Glaucoma	468 (2.6)	515 (2.9)	0.94 (0.82-1.08)
Hypothyroidism	955 (5.3)	1049 (5.8)	0.92 (0.84-1.02)
Liver cirrhosis and other liver chronic diseases	29 (0.2)	33 (0.2)	0.84 (0.50-1.42)
Cystic Fibrosis	42 (0.2)	55 (0.3)	0.67 (0.44-1.02)
	42 (0.2)	33 (0.3)	0.07 (0.44-1.02)

29 (0.2)

41 (0.2)

Figure 3. Forest plots showing the association between 49 diseases/conditions members of the study cohort (citizens who completed scheduled vaccine plan) suffered from and the odds of post-vaccine SARS-CoV-2 infection. Odds ratios were estimated by using conditional logistic regressions, by including one condition at a time, while adjusting for age, sex, number of contacts with the Regional Health Service, previous COVID-19 infection and vaccine type. The 49 diseases/conditions are sorted based on decreasing values of the odds ratio. Squares represents the point estimates (i.e., the odds ratios) and the straight line represents the 95% confidence interval.

0.35

0.50

0.71

1.0

OR (95% CI)

1.4

4.0

0.66 (0.41-1.08)

	Cases	Controls					
	N (%)	N (%)	OR (95% CI)				
Chronic kidney disease	113 (3.7)	289 (1.0)	2.95 (2.32-3.76)				
Acute respiratory infections	30 (1.0)	69 (0.2)	2.84 (1.80-4.47)				•
Other mental disorders	27 (0.9)	88 (0.3)	2.53 (1.59-4.04)				•
Transplantation	33 (1.1)	156 (0.5)	2.34 (1.57-3.48)				
Liver chronic diseases	16 (0.5)	70 (0.2)	2.23 (1.26-3.93)				
Heart failure	173 (5.7)	488 (1.6)	2.21 (1.83-2.67)				_
Other diseases of the respiratory system	215 (7.1)	891 (2.9)	1.98 (1.68-2.34)			-	
Vascular disease	43 (1.4)	142 (0.5)	1.93 (1.35-2.76)				
Insulin therapy	238 (7.9)	916 (3.0)	1.87 (1.59-2.19)			_ -	
Cerebrovascular diseases	112 (3.7)	453 (1.5)	1.83 (1.47-2.29)				
Psychosis	269 (8.9)	1155 (3.8)	1.79 (1.54-2.08)			_ _	
Disorders of fluid and acid-base balance	41 (1.4)	153 (0.5)	1.71 (1.19-2.47)				
Dementia / Alzheimer	100 (3.3)	418 (1.4)	1.71 (1.36-2.16)			_	
Other diseases of the digestive system	183 (6.1)	877 (2.9)	1.70 (1.44-2.02)				
Autoimmune haemolytic anaemias	773 (25.6)	4121 (13.6)	1.68 (1.52-1.85)				
Other diseases of the genitourinary system	164 (5.4)	775 (2.6)	1.67 (1.39-2.00)				
Symptoms, signs and ill-defined conditions	115 (3.8)	534 (1.8)	1.64 (1.33-2.04)				
Other disorders of endocrine diseases	37 (1.2)	190 (0.6)	1.59 (1.10-2.29)		_		
Valvular diseases	42 (1.4)	189 (0.6)	1.52 (1.07-2.16)		-		
Gout	425 (14.1)	2051 (6.8)	1.48 (1.31-1.67)				
Acute myocarial infaction	268 (8.9)	1153 (3.8)	1.48 (1.28-1.72)				
Oral anticoagulant agents	565 (18.7)	2802 (9.3)	1.47 (1.32-1.64)			_	
Other diseases of the nervous system	45 (1.5)	259 (0.9)	1.46 (1.05-2.03)				
Corticosteroids	609 (20.1)	4011 (13.3)	1.43 (1.29–1.58)				
Malignant neoplasm	238 (7.9)	1460 (4.8)	1.41 (1.21-1.63)				
Other diseases of the circulatory system	207 (6.8)	1022 (3.4)	1.41 (1.20-1.66)				
Depression	676 (22.4)	4234 (14)	1.40 (1.27-1.55)			_	
Cystic Fibrosis	22 (0.7)	116 (0.4)	1.38 (0.86–2.20)			_	
Chronic Obstructive Pulmonary Disease, Asthma	510 (16.9)	3320 (11)	1.37 (1.23–1.52)				
Arrhythmia	355 (11.7)	1811 (6.0)	1.33 (1.17–1.52)				
Coronary and peripheral vascular disease	521 (17.2)	3391 (11.2)	1.32 (1.19–1.47)				
Diseases of the skin and subcutaneous tissues			1.32 (1.19-1.47)			_	
Epilepsy and recurrent seizures	81 (2.7)	498 (1.6)				-	
	133 (4.4)	839 (2.8)	1.29 (1.06–1.57)				
Chronic pain	291 (9.6)	1741 (5.8)	1.27 (1.11-1.46)		_		
Parkinson's disease and parkinsonism	108 (3.6)	591 (2.0)	1.26 (1.02-1.57)			-	
Other diseases of the musculoskeletal system	103 (3.4)	735 (2.4)	1.16 (0.93–1.44)		-		
Benign neoplasm and carcinoma in situ	24 (0.8)	211 (0.7)	1.14 (0.74–1.76)				
Diabetes without insulin therapy	426 (14.1)	2704 (8.9)	1.12 (0.99–1.26)			_	
Hypothyroidism	248 (8.2)	2102 (7.0)	1.03 (0.89–1.18)		-		
Hypertension	984 (32.6)	7646 (25.3)	1.02 (0.94-1.12)		-		
Dyslipidaemia	1128 (37.3)	8348 (27.6)	0.97 (0.89-1.06)		-		
Glaucoma	179 (5.9)	1417 (4.7)	0.90 (0.76-1.07)		-		
Inflammatory bowel diseases	83 (2.7)	798 (2.6)	0.86 (0.68–1.09)		-		
					1		1
				0.71	1.0	1.4	4.0
						OR (95% CI)	

Figure 4. Forest plots showing the association between 43 diseases/conditions members of the study cohort (citizens who completed scheduled vaccine plan) suffered from and the odds of severe COVID-19 illness. Odds ratios were estimated by using conditional logistic regressions, by including one condition at a time, while adjusting for age, sex, number of contacts with the Regional Health Service, previous COVID-19 infection and vaccine type. The 43 diseases/conditions are sorted based on decreasing values of the odds ratio. Squares represents the point estimates (i.e., the odds ratios) and the straight line represents the 95% confidence interval.

4. Discussion

The current study based on real-world data from more than 5 million people who completed vaccination against COVID-19 identified an extensive set of factors increasing the risk of post-vaccine SARS-CoV-2 infection and/or severe COVID-19 illness. Factors such as age younger than 40 years, frequent contacts with the RHS, absence of previous ascertained infection, having received an adenovirus-vectored vaccine, and several conditions including gout, anemias, mental disorders, organ transplantation, chronic cardiovascular, respiratory and kidney diseases, and disease of the skin and musculoskeletal systems, significantly increased the risk of SARS-CoV-2 infection. Factors such as old age, male gender, frequent contacts with the RHS, and diseases/conditions affecting practically almost all the organs and systems significantly increased the risk of severe COVID-19 illness. This may provide a useful reference for establishing priority in the booster vaccination programs, as well as for access to future treatment options, such as monoclonal antibodies.

Our study provides the following additional results. One, the opposite pattern of the dose–response relationship between age and the risk of SARS-CoV-2 infection and/or severe COVID-19 illness likely depends on the higher occasion of contagion for younger citizens, as well as the higher frailty of older citizens, making them on average more vulnerable to the development of the severe and fatal clinical manifestations of the COVID-19 infection [12]. Two, the observed higher risk of severe illness among males is another widely expected finding. Consistently, it has been reported that despite the number and age of males and females with SARS-CoV-2 infection being comparable, males tend to display more severe disease [13–15]. Although several factors have been speculated to account for the disparity, including differences in biology, behavior, occupation, and immune response [16,17], the underlying mechanisms are still unclear [13]. Three, having received an adenovirus-vectored vaccine offered lower protection against the SARS-CoV-2 infection than having received an mRNA-based vaccine. Although our study does not provide information on underlying mechanisms, differential patterns of immunogenicity from available vaccine platforms have been reported, with antibody responses being 2.9-fold higher following the mRNA-based vaccine than the adenovirus-vectored vaccine [18]. Four, our study provides further evidence that the risk of post-vaccine SARS-CoV-2 infection is strongly reduced among individuals who already experienced SARS-CoV-2 infection than naïve individuals. With respect to the available evidence, however, our study goes beyond the comparison of immune response in recovered and naïve individuals [19–26], extending such evidence to the protective action of previous infection against the post-vaccine reinfection [27]. Finally, several conditions and diseases of which vaccinated citizens suffered strongly affected their risk of post-vaccine infection and illness. It is interesting that while not even a one-third of the investigated diseases affected the risk of infection, almost four in five of them, belonging to all systems and organs, were strongly involved in the risk of severe disease. This confirms the now established notion that alterations in the structure and function of virtually all organs and systems of the body may adversely affect resistance to the COVID-19 disease [10].

The present study had several points of strength. One, this study provides the largest and most robust available evidence of the post-vaccine risk factors of infection of COVID-19 and its clinical consequences. Two, this study was based on a very large population and included all ages that were regarded as suitable for the COVID-19 vaccination. This allowed a large accumulation of person-months, which means that although post-vaccine infections and cases of severe illness are very rare events, this study was sufficiently powered to address its primary goal.

Limitations are that the predictors of COVID-19 we searched for are restricted to those routinely collected and available in the administrative databases, i.e., hospital admissions and drugs dispensed. However, additional predisposing factors may impact the risk of COVID-19 infection and severe illness. For example, a recent study conducted in Italy supported a role of the ABO blood type in the development of symptomatic disease with a higher risk in subjects with blood type A and a protective effect of blood types B and O [28]. In addition, our system for tracking diseases did not capture the severity of associated comorbidities. Furthermore, health services and treatments supplied by private providers were not captured by our analysis. Moreover, misdiagnosis (due to poor accuracy in reporting diagnoses and comorbidities) and upcoding in hospital records (sometimes in pursuit of higher reimbursements) might have underestimated the prevalence of patients affected by the considered conditions. Finally, outcome misclassification may have affected this study, because not all citizens in whom the infection occurred were tracked and some patients with severe symptoms might have been treated at home.

5. Conclusions

In conclusion, by a large population-based platform accomplished for monitoring trend and impact of vaccine campaign in the largest Italian region, we identified an extensive set of factors increasing the risk of SARS-CoV-2 infection and/or severe COVID-19

illness. Factors such as age younger than 40 years, frequent contacts with the RHS, absence of previous ascertained infection, having received an adenovirus-vectored vaccine, and several conditions including gout, anemias, mental disorders, organ transplantation, chronic cardiovascular, respiratory and kidney diseases, and disease of the skin and musculoskeletal systems, significantly increased the risk of SARS-CoV-2 infection. Factors such as elderly, male gender, frequent contacts with the RHS, and diseases/conditions belonging to all the considered nosologic districts, strongly increased the risk of severe COVID-19 illness. This suggests that post-vaccine vulnerability to severe clinical manifestations of SARS-CoV-2 infection may be mainly affected by clinical frailty, possibly due to comorbidities, rather (other) than to specific disorders. Our study confirms that both SARS-CoV-2 infections and severe COVID-19 illness may occur after the vaccine cycle is completed, although with low incidence. These findings would support efforts to maximize both vaccine uptake with two doses and fulfilment with individual protection measures. Clinicians and policy makers can use our results for prioritizing interventions, while researchers can utilize our findings to develop prognostic models that could eventually facilitate decision making.

Supplementary Materials: The following supporting information can be downloaded at: https://www.mdpi.com/article/10.3390/vaccines10060845/s1, Table S1: List of candidate conditions for predicting the risk of experiencing post-vaccine SARS-CoV-2 infection and severe fatal forms of COVID-19 infection.

Author Contributions: Conceptualization, G.C., D.C., O.L., C.R.B., P.G.D.V., M.T., M.G. and G.B.; methodology, G.C. and M.F.; software, M.F. and J.J.; formal analysis, M.F. and J.J.; resources, F.B. and G.P.; data curation, A.B. and M.E.; writing—original draft preparation, G.C.; writing—review and editing, all authors; supervision, G.C.; funding acquisition, G.C. All authors have read and agreed to the published version of the manuscript.

Funding: This study was supported by grants from the Fondazione Cariplo ("Chronic diseases management after the COVID-19 epidemic trigger. Capturing data, generating evidence, suggesting actions for health protection. The CHANCE Project") and from the Italian Ministry of the Education, University and Research ('PRIN' 2017, project 2017728JPK; Modelling Effectiveness, Costeffectiveness, and Promoting Health Care Value in the Real World: the MOTIVE Project). The funding sources had no role in the design of this study, the collection, analysis and interpretation of the data, or the decision to approve publication of the finished manuscript.

Institutional Review Board Statement: According to Italian law, studies based entirely on registry data do not require approval from an ethics review board.

Informed Consent Statement: Not applicable.

Data Availability Statement: The data that support the findings of this study are available from the Lombardy region, but restrictions apply to the availability of these data, which were used under license for the current study, and so are not publicly available. Data are, however, available from the Lombardy region upon reasonable request.

Conflicts of Interest: Giovanni Corrao received research support from the European Community (EC), the Italian Agency of Drugs (AIFA) and the Italian Ministry for University and Research (MIUR). He took part in a variety of projects that were funded by pharmaceutical companies (i.e., Novartis, GSK, Roche, AMGEN and BMS). He also received honoraria as a member of the advisory board to Roche.

References

- Davies, N.G.; Abbott, S.; Barnard, R.C.; Jarvis, C.I.; Kucharski, A.J.; Munday, J.D.; Pearson, C.A.B.; Russell, T.W.; Tully, D.C.; Edmunds, W.J.; et al. Estimated transmissibility and impact of SARS-CoV-2 lineage B.1.1.7 in England. *Science* 2021, 372, eabg3055. [CrossRef] [PubMed]
- Widge, A.T.; Rouphael, N.G.; Jackson, L.A.; Anderson, E.J.; Roberts, P.C.; Makhene, M.; Beigel, J.H. Durability of responses after SARS-CoV-2 mRNA-1273 vaccination. N. Engl. J. Med. 2020, 384, 80–82. [CrossRef] [PubMed]
- He, Q.; Mao, Q.; An, C.; Zhang, J.; Gao, F.; Bian, L.; Li, C.; Liang, Z.; Xu, M.; Wang, J. Heterologous prime-boost: Breaking the protective immune response bottleneck of COVID-19 vaccine candidates. *Emerg. Microbes Infect.* 2021, 10, 629–637. [CrossRef]

- Overbaugh, J. Understanding protection from SARS-CoV-2 by studying reinfection. *Nat. Med.* 2020, 26, 1680–1681. [CrossRef] [PubMed]
- Dagan, N.; Barda, N.; Kepten, E. BNT162b2 mRNA COVID-19 Vaccine in a Nationwide Mass Vaccination Setting. N. Engl. J. Med. 2021, 384, 1412–1423. [CrossRef]
- Mancia, G.; Rea, F.; Ludergnani, M.; Apolone, G.; Corrao, G. Renin-Angiotensin-Aldosterone System Blockers and the Risk of COVID-19. N. Engl. J. Med. 2020, 382, 2431–2440. [CrossRef] [PubMed]
- Izcovich, A.; Ragusa, M.A.; Tortosa, F. Prognostic factors for severity and mortality in patients infected with COVID-19: A systematic review. *PLoS ONE* 2020, 15, e0241955. [CrossRef]
- Wynants, L.; Van Calster, B.; Collins, G.S. Prediction models for diagnosis and prognosis of COVID-19 infection: Systematic review and critical appraisal. *BMJ* 2020, 369, m1328. [CrossRef]
- Ebrahimi, M.; Malehi, A.S.; Rahim, F. COVID-19 Patients: A Systematic Review and Meta-Analysis of Laboratory Findings, Comorbidities, and Clinical Outcomes Comparing Medical Staff versus the General Population. *Osong Public Health Res. Perspect.* 2020, 11, 269–279. [CrossRef]
- 10. Corrao, G.; Rea, F.; Carle, F. Stratification of the risk of developing severe or lethal COVID-19 using a new score from a large Italian population: A population-based cohort study. *BMJ Open* **2021**, *11*, e053281. [CrossRef]
- 11. Durrleman, S.; Simon, R. Flexible regression models with cubic splines. Stat. Med. 1989, 8, 551–561. [CrossRef] [PubMed]
- 12. Turke, P.W. Five reasons COVID-19 is less severe in younger age-groups. *Evol. Med. Public Health* **2020**, *9*, 113–117. [CrossRef] [PubMed]
- 13. Galasso, V.; Pons, V.; Profeta, P.; Becher, M.; Brouard, S.; Foucault, M. Gender differences in COVID-19 attitudes and behavior: Panel evidence from eight countries. *Proc. Natl. Acad. Sci. USA* **2020**, *117*, 27285–27291. [CrossRef] [PubMed]
- 14. Jin, J.M.; Bai, P.; He, W.; Wu, F.; Liu, X.F.; Han, D.M. Gender differences in patients with COVID-19: Focus on severity and mortality. *Front. Public Health* **2020**, *8*, 152. [CrossRef]
- 15. Peckham, H.; de Gruijter, N.M.; Raine, C.; Radziszewska, A.; Ciurtin, C.; Wedderburn, L.R. Male sex identified by global COVID-19 meta-analysis as a risk factor for death and ITU admission. *Nat. Commun.* **2020**, *11*, 6317. [CrossRef]
- Gadi, N.; Wu, S.C.; Spihlman, A.P.; Moulton, V.R. What's Sex Got to Do With COVID-19? Gender-based differences in the host immune response to Coronaviruses. *Front. Immunol.* 2020, 11, 2147. [CrossRef]
- 17. Takahashi, T.; Ellingson, M.K.; Wong, P.; Israelow, B.; Lucas, C.; Klein, J. Sex differences in immune responses That Underlie COVID-19 Disease Outcomes. *Nature* 2020, *588*, 315–320. [CrossRef]
- 18. Parry, H.; Bruton, R.; Stephens, C.; Brown, K. Differential immunogenicity of BNT162b2 or ChAdOx1 vaccines after extendedinterval homologous dual vaccination in older people. *Immun. Ageing* **2021**, *18*, 34. [CrossRef]
- Prendecki, M.; Clarke, C.; Brown, J. Effect of previous SARS-CoV-2 infection on humoral and T-cell responses to single-dose BNT162b2 vaccine. *Lancet* 2021, 397, 1178–1181. [CrossRef]
- 20. Saadat, S.; RikhtegaranTehrani, Z.; Logue, J. Binding and neutralization antibody titers after a single vaccine dose in health care workers previously infected with SARS-CoV-2. *JAMA* **2021**, *325*, 1467–1469. [CrossRef]
- Bradley, T.; Grundberg, E.; Selvarangan, R.; LeMaster, C.; Fraley, E.; Banerjee, D.; Belden, B.; Louiselle, D.; Nolte, N.; Biswell, R.; et al. Antibody responses after a single dose of SARS-CoV-2 mRNA vaccine. *N. Engl. J. Med.* 2021, 384, 1959–1961. [CrossRef] [PubMed]
- 22. Manisty, C.; Otter, A.D.; Treibel, T.A. Antibody response to first BNT162b2 dose inpreviously SARS-CoV-2- infected individuals. *Lancet* 2021, 397, 1057–1058. [CrossRef]
- Krammer, F.; Srivastava, K.; Alshammary, H.; Amoako, A.A.; Awawda, M.H.; Beach, K.F.; Bermúdez-González, M.C.; Bielak, D.A.; Carreño, J.M.; Chernet, R.L.; et al. Antibody responses in seropositive persons after a single dose of SARS-CoV-2 mRNA vaccine. N. Engl. J. Med. 2021, 384, 1372–1374. [CrossRef] [PubMed]
- 24. Lozano-Ojalvo, D.; Camara, C.; LopezGranados, E. Differential effects of the second SARS-CoV-2 mRNA vaccine dose on T cell immunity in naive and COVID-19 recovered individuals. *Cell Rep.* **2021**, *36*, 109570. [CrossRef]
- 25. Fraley, E.; LeMaster, C.; Geanes, E. Humoral immune responses during SARS-CoV-2 mRNA vaccine administration in seropositive and seronegative individuals. *BMC Med.* **2021**, *19*, 169. [CrossRef]
- 26. Velasco, M.; Galán, M.I.; Casas, M.L.; Pérez-Fernández, E.; Martínez-Ponce, D.; González-Piñeiro, B.; Castilla, V.; Guijarro, C.; Alcorcón COVID-19 Working Group. Impact of previous coronavirus disease 2019 on immune response after a single dose of BNT162b2 severe acute respiratory syndrome coronavirus 2 vaccine. *Open Forum Infect. Dis.* 2021, *8*, ofab29. [CrossRef]
- 27. Ontañón, J.; Blas, J.; de Cabo, C. Influence of past infection with SARS-CoV-2 on the response to the BNT162b2 mRNA vaccine in health care workers: Kinetics and durability of the humoral immune response. *EBioMedicine* **2021**, *73*, 103656. [CrossRef]
- 28. Negro, P.; Congedo, M.; Zizza, A.; Guido, M.; Sacquegna, G.; Pulito, G.; Lobreglio, G. Role of ABO blood system in COVID-19: Findings from a southern Italian study. *Transfus. Med.* 2021; *Epub ahead of print*.