

Risk of incident heart failure after COVID-19 recovery: a systematic review and meta-analysis

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Abstract

Patients recovered from COVID-19 have an increased incidence of cardiovascular disease and heart structural changes. The aim of the present manuscript is to assess the risk of incident heart failure (HF) after COVID-19 infection. Data were obtained searching MEDLINE and Scopus for all studies published at any time up to September 1, 2022 reporting the risk of incident HF in COVID-19 recovered patients. The cumulative post-COVID-19 incidence and risk of incident HF were pooled using a random effects model and presented with the corresponding 95% confidence interval (CI). Statistical heterogeneity was measured using the Higgins I^2 statistic. Overall, 21,463,173 patients (mean age 54.5 years, 58.7% males) were analyzed. Among them, 1,628,424 had confirmed COVID-19 infection while the remaining 19,834,749 represented the controls. The mean length of follow-up was 9.2 months. A random effect model revealed a pooled incidence of post COVID-19 HF in 1.1% of cases (95% CI: 0.7–1.6, I^2 : 99.8%). Moreover, recovered COVID-19 patients showed an increased risk of incident HF (HR: 1.90, 95% CI: 1.54–3.24, p < 0.0001, $I^2 = 96.5\%$) in the same follow-up period. Meta-regression showed a direct relationship for the risk of incident HF using age (p = 0.001) and hypertension (HT) (p = 0.02) as moderators, while an inverse association was observed when the follow-up length was adopted as moderating variable (p = 0.01). COVID-19 survivors had an additional 90% risk of developing HF after COVID-19 infection in the long-term period. This risk was directly related with age and previous history of HT especially in the early post-acute phase of the infection.

Keywords COVID-19 · Heart failure · Follow-up

Introduction

Recent analyses have demonstrated an increased incidence of cardiovascular disease and heart structural changes in recovered COVID-19 patients [1]. Although myocardial injury has been identified as a significant pathogenic feature of COVID-19 infection [2–5], associated with worse shortterm prognosis, the long-term cardiovascular outcomes in COVID-19 survivors remain largely unclear. To this regard,

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few studies have investigated the risk of heart failure (HF) during the post-acute phase of COVID-19. Furthermore, a comprehensive assessment of this potential post-acute COVID-19 sequelae is still lacking. The aim of the present manuscript is to assess the risk of incident HF in COVID-19 recovered patients by performing a systematic review and meta-analysis of the available data.

Material and methods

Study design and eligibility criteria

This study followed the Preferred Reporting Items for Systematic Reviews and Meta-analyses (PRISMA) reporting guideline (Supplementary file 1) [6]. Data were obtained searching MEDLINE and Scopus for all studies, either retrospective or prospective, published at any time up to September 1, 2022, and reporting the mid/long-term risk (defined as > 4 months) of incident HF in COVID-19 recovered patients. In the reviewed investigations, recovered COVID-19 subjects were compared to "contemporary cohorts" defined as subjects who did not experience the SARS-CoV-2 infection and developed incident HF in the same follow-up period.

Outcomes

The pooled incidence of incident HF in recovery COVID-19 patients was chosen as the primary outcome. Conversely, the secondary outcome was the risk of incident HF in the same period compared to contemporary cohorts, which were used by reviewed studies as control groups.

Data extraction and quality assessment

The selection of studies to be included in our analysis was independently conducted by two authors (M.Z., C.B.) in a blinded fashion. Any discrepancies in study selection were resolved by consulting a third author (G.R.). The following MeSH terms were used for the search: "Heart failure" AND "COVID-19 sequelae" OR "Heart failure" AND "COVID-19". The full search strategy is presented in the Supplementary file 2. Moreover, we searched the bibliographies of the target studies for additional references. Specifically, inclusion criteria were (i) studies enrolling subjects with previous confirmed COVID-19 infection, and (ii) providing the hazard ratio (HR) and relative 95% confidence interval (CI) for the risk of incident HF after the infection compared to contemporary control cohorts. Conversely, case reports, review articles, abstracts, editorials/letters, and case series with less than 10 participants were excluded. Data extraction was independently conducted by two authors (M.Z., G.R.). Studies were excluded from the meta-analysis if they did not provide data regarding the risk of incident HF, reported as HR and relative 95% CI. after COVID-19 infection. For all studies reviewed, we extracted, when provided, the number of patients enrolled, the mean age, male gender, prevalence of cardiovascular comorbidities such as arterial hypertension (HT), diabetes mellitus (DM), chronic obstructive pulmonary disease (COPD), chronic kidney disease (CKD), obesity, pre-existing HF, cerebrovascular disease, and length of follow-up. The quality of included studies was graded using the Newcastle–Ottawa (NOS) quality assessment scale [7]. Any score \geq 7 qualified as high quality with a low risk of bias, while a score < 5 is categorized as low quality with a high risk of inherent bias. Any score in between is rated as moderate quality [7].

Data synthesis and analysis

Continues variables were expressed as mean while categorical variables were presented as numbers and relative percentages. The cumulative post-COVID-19 incidence of HF (n/N), defined as the ratio between post COVID-19 patients experiencing HF (n) and the number of all recovered COVID-19 patients (N) over the follow-up period, was pooled using a random effects model and presented with the corresponding 95% confidence interval (CI). Similarly, for the secondary outcome, the HRs with the related 95% confidence interval (CI) were pooled using a random-effect model. Furthermore, a predefined sensitivity analysis (leave-one-out analysis) was performed removing one study at the time, to evaluate the stability of our results regarding both the HF incidence and risk. Statistical heterogeneity was measured using the Higgins I^2 statistic and Q value. Specifically, a $I^2 = 0$ indicated no heterogeneity while we considered low, moderate, and high degrees of heterogeneity based on the values of I^2 as < 25%, 25–75%, and above 75% respectively. The presence of potential publication bias was verified by visual inspection of the funnel plot. Due to the low number of the included studies (<10), small-study bias was not examined as our analysis was underpowered to detect such bias. To further appraise the impact of potential baseline confounders, a meta-regression analysis was also performed to explain the observed heterogeneity related to the risk of incident HF, if any. All meta-analyses were conducted using Comprehensive Meta-Analysis software, version 3 (Biostat, USA).

Results

Search results and included studies

A total of 10,908 articles were obtained using our search strategy. After excluding duplicates and preliminary screening, 4431 full-text articles were assessed for eligibility. Among them, 4326 studies were excluded for not meeting the inclusion criteria, leaving 5 retrospective investigations fulfilling the inclusion criteria (Fig. 1) [7–12].

Characteristics of the population and quality assessment

Overall, 21,463,173 patients (mean age 54.5 years, 58.7% males) were included in this analysis [8–12]. Among them, 1,628,424 had confirmed COVID-19 infection while the remaining 19,834,749 represented the controls. The general characteristics of the studies included are presented in Table 2. Although the demographic characteristics and concomitant comorbidities were not systematically recorded in all investigations, the cohorts mainly consisted of middle-aged patients. No data regarding the severity of the infection or vaccination status were provided. The mean length of follow-up was 9.2 months

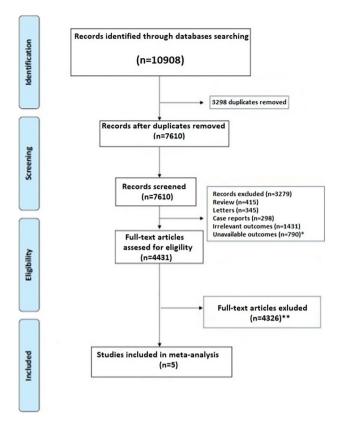


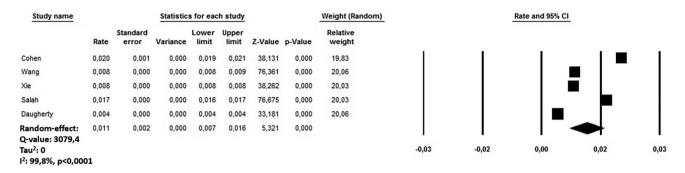
Fig. 1 Flow diagram of selected studies for the meta-analysis according to the preferred reporting items for systematic reviews and metaanalyses (PRISMA)

ranging between 4 and 12 months. The reviewed investigations identified the occurrence of AMI by screening the medical records of enrolled patients using the International Classification of Diseases 10th Revision (ICD-10) codes I50 [8–12]. Quality assessment showed that all studies were of moderate-high quality according to the NOS scale (Table 1).

Pooled incidence of incident heart failure

The cumulative post-acute COVID-19 rate of incident HF in COVID-19 survivors ranged between 0.4 and 2% among the reviewed studies [8–12]. A random effect model revealed a pooled incidence of post COVID-19 HF in 1.1% of cases (95% CI: 0.7–1.6, I^2 : 99.8%) (Fig. 2). The relative sensitivity analysis slightly changed the combined incidence rate, which remained statistically significant across a range from 0.9% of cases (95% CI: 0.5–1.4, I^2 : 99.8%) to 1.3% of cases (95% CI: 0.9–1.8, I^2 : 99.7%), suggesting that no single investigation had an undue impact on the study outcome. The visual inspection of the funnel plot is showed in supplementary file 3, panel A.

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Authors	Sample size Age (year	Age Male (years) <i>N</i> , %	Males N, %	HT N, %	DM N, %	COPD N, %	CKD N, %	HF history Obesity $N, \%$ $N, \%$		Cerebrovascular FW- disease N, % lengt (mor	FW- length (months)	SON
Cohen et al	2,895,943 75.7	75.7	1,227,545 (42.0)	2,081,772 (72.0)	938,043 (32.7)	938,043 (32.7) 578,650 (20)* 528,314 (14.0)	528,314 (14.0)	334,654 (12.0)	478,902 (17.0)	478,902 (17.0) 364,782 (13.0)	4	∞
Wang et al	2,940,988 43.8	43.8	1,241,483 (42.2)	440,998 (14.9) 188,488 (6.4)**	188,488 (6.4)**	51,592 (1.7)	59,177 (2.0)	NR	286,338 (9.7)**	NR	12	7
Xie et al	5,791,407 62.5	62.5	5,228,431 (90.2)	1,525,944 (26.3)	1,321,907 (22.8)	633,000 (10.9) 970,057 (16.7)	970,057 (16.7)	NR	2462.44 (42.5) NR	NR	12	~
Salah et al	587,330	48.5	265,831 (45.2)	265,831 (45.2) 233,721 (39.7) 115,053 (19.5) 37,493 (6.3)*	115,053 (19.5)	37,493 (6.3)*	53,916 (9.1)	0	122.147 (20.7) NR	NR	12	7
Daugherty et al	9,247,505 42.4	42.4	4,640,393 (50.2)	NR	521,699 (5.6) NR	NR	NR	NR	NR	NR	6	9



Discussion

Fig. 2 Forest plots investigating the pooled incidence of post-COVID-19 HF during the follow-up period

Mid-long-term risk of incident HF

After a mean follow-up of 9.2 months, recovered COVID-19 patients presented an increased risk of incident HF (HR: 1.90, 95% CI: 1.54–3.24, p < 0.0001, $l^2 = 96.5\%$) compared to those patients that not experienced COVID-19 infection in the same period (Fig. 3). The funnel plot disclosed the presence of potential publication bias (Supplementary file 3, panel B). The sensitivity analysis confirmed yielded results reporting an HR ranging between 2.04 (95% CI: 1.67–2.49, p < 0.0001, l^2 : 96.7) and 1.80 (95% CI: 1.43–2.25, p < 0.0001, l^2 : 98.7%), indicating that the obtained results were not driven by any single study.

Meta-regression for the risk of incident heart failure

A meta-regression analysis showed a significant direct relationship for the risk of incident HF using age (p=0.001) and HT (p=0.02) as moderators, while an indirect association was observed when the follow-up length was adopted as moderating variable (p=0.01) (Table 2).

Our results, based on a large population of more than 20 million people, demonstrated that COVID-19 recovery subjects had an additional 90% risk of developing HF within 9 months from the acute infection. This risk was directly influenced by age and previous history of HT and resulted higher in the early post-acute phase of the infection, as demonstrated by the meta-regression. Furthermore, the absence of any correlation with other cardiovascular risk factors or comorbidities suggested that the risk of incident HF might manifest even in subjects at relatively low cardiovascular risk. The high heterogeneity observed may be partly explained by the differences in baseline characteristics of the population enrolled, immunization against COVID-19 infection, pre-existing cardiovascular risk factors, or previous HF history. Although sensitivity analysis confirmed the robustness of our results, our estimates should be carefully considered.

Unfortunately, the revised studies did not systematically report data regarding a previous history of HF, as well as no data related to the left ventricular ejection fraction, limiting

Study name		Statisti	cs for ea	ch study		Weight (Random)			Hazard	ratio an	d 95% Cl		
	Hazard ratio	Lower limit	Upper limit	Z-Value	p-Value	Relative weight							
Cohen	1,850	1,608	2,128	8,616	0,000	20,01	1	1	1	1	-	1	1
Wang	2,290	2,197	2,387	39,208	0,000	21,79							
Xie	1,720	1,647	1,796	24,432	0,000	21,77							
Salah	1,450	1,391	1,511	17,589	0,000	21,79				- 11			
Daugherty	2,620	1,911	3,592	5,983	0,000	14,65					┟╴╋	-	
Random-effect	t: 1,904	1,544	2,346	6,034	0,000						•		
Q-value: 224,3 Tau ² : 6,034 I ² :96,5%, p<0,0							0,1	0,2	0,5	1	2	5	10

Fig. 3 Forest plots investigating the long-term risk of incident heart failure after COVID-19 Infection

 Table 2
 Meta-regression analysis for the long-term risk of incident heart failure after COVID-19 infection. CI confidence interval, HT arterial hypertension, DM diabetes mellitus, COPD chronic obstructive pulmonary disease, CKD chronic kidney disease

Moderator	Coeff	95% CI	р
Age (years)	0.006	0.013 to 0.023	0.001
Males (%)	-0.002	-0.016 to 0.011	0.731
HT (%)	0.002	0.005 to 0.011	0.02
DM (%)	-0.013	-0.030 to 0.004	0.143
COPD (%)	-0.005	-0.041 to 0.030	0.759
CKD (%)	-0.015	-0.005 to 0.027	0.480
Obesity (%)	-0.006	-0.028 to 0.015	0.573
Follow-up (months)	-0.004	-0.072 to -0.031	0.01

the possibility to further characterize the reported risk [9–12]. However, to the best of our knowledge, our analysis represents the first attempt to comprehensively assess the risk of incident HF in the post-acute phase of COVID-19 subjects. Notably, we observed that the HF risk was comparable between men and women, although this result had to be cautiously considered. Indeed, the comparison of rates between gender is highly dependent on the age range of the population under study. Furthermore, when the death rate is high from causes other than the disease of interest, the incidence rates of the disease are generally overestimated in traditional Kaplan–Meier survival analysis due to competing risks. Nevertheless, sensitivity analysis confirmed the robustness of our results [13].

The exact pathophysiological mechanism underling the higher risk of HF in COVID-19 survivors has not yet been completely established. The direct viral invasion of cardiomyocytes and subsequent cell death or endothelial cell infection and subsequent dysfunction or the complementmediated coagulopathy and microangiopathy may represent some of potential triggers [14–17]. Indeed, we cannot evaluate if COVID-19 infection represented just a trigger or the underlying cause of HF during the follow-up period.

Our findings are in accordance with the results provided by Zhang et al. [18] which observed an increased risk of HF in COVID-19 survivors within 89 days, but their results were presented as risk ratio and therefore they were not included in our meta-analysis. Indeed, it would be incorrect to pool risk ratio and hazard ratio together since they evaluate different outcomes from different study designs.

Doubtless, our preliminary findings have several implications for daily clinical practice and future research. The HF risk is not limited just to the acute phase of the infection but extends in the medium/long-term period, indicating the need to prevent the infection and to consider post COVID-19 patients at future risk of HF. As consequence, the epidemiology of the disease may change in term of rates of relative hospitalizations and associated outcomes as well as in the related costs for the public health care systems. While clinicians are wondering whether the pandemic will be followed by a cardiovascular after shock [19], our findings, for the first time, provide preliminary comprehensive evidence regarding the higher risk of HF in COVID-19 survivors which emphasizes the need of specific clinical follow-up for these subjects to prevent long-term cardiovascular consequences.

Limitations

Our study has several limitations related to the observational nature of the studies reviewed and their own limitations with all inherited bias. Potential underestimation could derive from detection bias considering that some of the articles reviewed were based on data derived from medical records with relative ICD-19 codes; therefore, we cannot exclude that miscoding may have biased our results. Moreover, sampling bias by the competing risk of death may also have led to underestimation of the real cumulative incidence of HF. Probably, reviewed data may have underestimated the real impact of HF after COVID-19 infection especially during the early phase of the pandemic, for the presence of undiagnosed cases and for patients lost during the follow-up period. Furthermore, we cannot exclude that some bias regarding the diagnosis of HF may derived from the misinterpretation of respiratory symptoms, especially during the recovery phase. However, previous investigations have reported a relatively higher sensitivity, specificity, and positive predictive value for the HF diagnosis using ICD-10 codes [20, 21]. Doubtless, the rates of underling comorbidities, sex ratios, and age distribution in the observed analyses may be different from those present in other regions of the world, limiting the generalizability of our findings. Notably, no data regarding the different treatment strategies administered to enrolled COVID-19 recovered patients as well as the potential influence of vaccinations were provided, limiting the possibility of further sub-analyses. Finally, no data were available regarding the LVEF, limiting the characterization of HF patients [22].

Conclusion

After reviewing a large population of more than 20 million people, we observed that COVID-19 survivors had a higher risk of developing HF after in the long-term period, especially in the early post-acute phase. Our findings suggest that HF represents an important post-acute COVID-19 sequelae that might benefit from an adequate primary prevention against SARS-CoV-2 infection and an appropriate follow-up in COVID-19 patients. **Supplementary Information** The online version contains supplementary material available at https://doi.org/10.1007/s10741-022-10292-0.

Author contribution Zuin Marco: conception; original draft; statistical analysis; data collection. Rigatelli Gianluca: original draft; statistical analysis; data collection; Loris Roncon: data collection, Revision and editing; Gianpaolo Pasquetto: data collection; Claudio Bilato: revision, editing and supervision. All the authors approved the final version of the manuscript.

Data availability Not applicable.

Declarations

Ethics approval Not applicable.

Competing interests The authors declare no competing interests.

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