1 2	Research Letter				
3	Post-COVID-19 Outcomes and Exercise Rehabilitation				
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The COVID-19 pandemic has caused global health, social, and economic system challenges. In an effort to try and reduce transmission rates, most countries have varying levels of societal 'lockdowns' and social restrictions in place. This creates a unique challenge for the promotion of physical activity and exercise, which we know has profound physical and mental health benefits. Although there was initial promise of increased population *interest* in physical activity and exercise at the beginning of the COVID-19 pandemic, ¹ recent large-scale data from over 455,000 people has demonstrated a 27% decrease in average daily steps within 30-days of the pandemic declaration.²

It may therefore be more important now than ever to facilitate physical activity and exercise promotion during and post-COVID-19. Despite, recent collaborative efforts developing post-COVID-19 guidelines for athletes returning to exercise,³ limited evidence is available for the impact of exercise and cardiac rehabilitation (CR) on clinical outcomes post-COVID-19. Secondary prevention through comprehensive CR has been recognised as the most cost-effective intervention to ensure favourable outcomes across a wide spectrum of cardiovascular diseases.⁴ Given there is a high prevalence of cardiovascular disease among patients with COVID-19, and >7% experience COVID-19 induced myocardial injury,⁵ CR following COVID-19 infection warrants investigation. The objective of this study was therefore to compare mortality, hospitalisation, and cardiovascular comorbidity between patients with cardiovascular disease and COVID-19 with and without an electronic medical record (EMR) of CR or exercise programmes.

This retrospective observational study was conducted in October 2020 with anonymised data provided by TriNetX, a global federated health research network with access to EMRs from participating academic medical centres, specialty physician practices, and community hospitals, predominantly in the United States. Patients with COVID-19 were identified via Centers for Disease Control and Prevention (CDC) coding using ICD-10-CM codes, or specific laboratory Logical Observation Identifiers Names and Codes.⁶ All patients were aged ≥18 years with COVID-19 recorded in EMRs between January 20, 2020 (date COVID-19 first confirmed in the US)⁷ and May 26, 2020 (to allow 4-month follow-up). CR was identified from ICD-10-CM codes Z71.82 (Exercise counselling), HCPCS code S9472 (CR program, non-physician provider, per diem), or CPT code 1013171 (Physician or other qualified health care professional services for outpatient CR). Correspondingly, these CR and exercise programme codes were excluded in the propensity score-matched controls. At the time of the search, 33 participating healthcare organisations had data available for patients meeting the study inclusion criteria. Thus, following propensity score matching, the cohort consisted of patients with cardiovascular disease and a diagnosis of COVID-19; who either were referred for CR and exercise

programmes (due to cardiovascular disease) within 3-months of a COVID-19 diagnosis (intervention) or were not referred (control).

Baseline characteristics were compared using chi-squared tests or independent-sample t-tests. Using logistic regression, CR and exercise patients were 1:1 propensity score-matched with controls for age, sex, race, acute myocardial infarction (AMI), heart failure, hypertensive disease, diabetes mellitus, chronic kidney disease, cerebrovascular disease, cardiovascular procedures (e.g. cardiography, echocardiography, cardiac catheterisation, cardiac devices, electrophysiological procedures), and cardiovascular medications (e.g. beta-blockers, antiarrhythmics, diuretics, antilipemic agents, antianginals, calcium channel blockers, ACE inhibitors). These variables were chosen because they are established risk factors for AF and/or mortality or were significantly different between the two cohorts. Logistic regression produced odds ratios (OR) with 95% confidence intervals (CI) for mortality, hospitalisation, AMI, stroke, and heart failure at 4-months following a COVID-19 diagnosis, comparing CR and exercise with propensity score-matched controls. Statistical significance was set at *P*<0.05.

In total, 400,383 patients with COVID-19 met the inclusion criteria for the control group and 643 patients with COVID-19 met the inclusion criteria for the CR and exercise cohort. Compared to controls, the CR and exercise cohort were generally older, had less females, and more cardiovascular comorbidities (Table 1). Following propensity score-matching, cohorts were well balanced for age, race, sex, comorbidities, cardiovascular medications and cardiovascular procedures (p>0.05; Table 1).

 Using the propensity score-matched cohort, and excluding patients with outcomes outside the measurement window, mortality at 4-months from COVID-19 diagnosis was proportionally lower with 1.6% (n=10 of 639 patients) in the CR and exercise cohort compared to 6.4% (n=41 of 638 patients) in the controls (OR 0.23, 95% CI 0.12-0.47). Re-hospitalisations were also proportionally lower with 15.1% (n=97 out of 643 patients) in the CR and exercise cohort compared to 30.8% (n=198 out of 643 patients) in the controls (OR 0.4, 95% CI 0.3-0.53). No differences were found for AMI (OR 1, 95% CI 0.42-2.48), stroke (0.95, 95% CI 0.39-2.31), or heart failure (OR 0.96. 95% CI 0.4-2.34).

Several limitations are of note. Firstly, the characterisation of COVID-19, health conditions, and CR and exercise programmes were based on ICD codes from EMRs, and reporting of conditions with ICD codes may vary by patient characteristics and healthcare organisations. Indeed, we do not know the severity of individual COVID-19 cases, which may have affected the results. However, before propensity score matching, there was no difference in relative mortality between the cohorts. Thus, it may not be illness

severity that differentiated patients receiving CR or not within this cohort. We also do not know details of the CR interventions, including whether they were comprehensive, multicomponent or exercise-only, which limits the ability to identify active 'intervention ingredients.' Due to closures in many traditional (centre-based) CR programmes, evaluation of different types of CR is needed, particularly frameworks that are adapted to COVID-19 delivery such as 'cardiac telerehabilitation'.⁹ Another important caveat, an EMR of CR and exercise does not necessarily provide information as to whether a patient attended, the intervention type and dose, or intervention adherence. We could also not determine the influence of attending different healthcare organizations due to data privacy restrictions. Finally, although we were able to match patients for important co-morbidities and demographic factors, residual confounding may present.

In summary, the present study of over 1200 patients with cardiovascular disease demonstrated that CR and exercise programmes following COVID-19 is associated with significantly lower odds of mortality and re-hospitalisation at 4-months, when compared to propensity score-matched patients without CR or exercise programmes. The provision of exercise rehabilitation for cardiovascular patients following a COVID-19 diagnosis is therefore a promising entity and warrants further investigation.

115 **Disclosures** 116 Benjamin JR Buckley, Stephanie L Harrison, Ian D Jones, and Nefyn Williams: None declared. Elnara 117 Fazio-Eynullayeva and Paula Underhill are employees of TriNetX Inc. Gregory YH Lip: consultant for Bayer/Janssen, BMS/Pfizer, Medtronic, Boehringer Ingelheim, Novartis, Verseon and Daiichi-Sankyo 118 119 and speaker for Bayer, BMS/Pfizer, Medtronic, Boehringer Ingelheim, and Daiichi-Sankyo. No fees are 120 directly received personally. 121 **Funding** 122 No specific funding was received for this study. TriNetX Inc. funded the acquisition of the data used. 123 124 Authorship 125 BJRB and GYHL contributed to the conception or design of the work. BJRB contributed to the 126 acquisition, analysis, and interpretation of data for the work. BJRB drafted the manuscript. SLH, EFE, 127 128 PU, IGJ, NW, and GYHL critically revised the manuscript. All gave final approval and agree to be

accountable for all aspects of work ensuring integrity and accuracy.

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Table 1. Baseline characteristics $%(n)^*$ of the COVID-19 populations with and without CR and exercise before and after propensity score matching.

	Initial populations			Propensity score matched populations		
	COVID-19 without	COVID-19 with	<i>P</i> -value	COVID-19 without	COVID-19 with	<i>P</i> -value
	CR (n=400,383)	CR (n=643)		CR (n=643)	CR (n=643)	
Age (years); mean (SD)	47.8 (20.2)	59.4 (18.5)	<0.001	60.3 (18.4)	59.4 (18.5)	0.348
Female	57.2 (229,022)	36.7 (236)	< 0.001	37.9 (244)	36.7 (236)	0.645
Race ^a						
White	63.1 (252,745)	76.8 (494)	<0.001	76.8 (494)	76.8 (494)	1
Black or African American	17 (68,120)	17.3 (111)	0.867	17.7 (114)	17.3 (111)	0.826
Unknown	16.7 (66,945)	4.2 (27)	< 0.001	3.9 (25)	4.2 (27)	0.777
Hypertensive Diseases	6.7 (26,774)	72 (463)	<0.001	53.3 (343)	72 (463)	<0.001
Diabetes Mellitus	21.6 (86,335)	70.5 (453)	< 0.001	74.8 (481)	70.5 (453)	0.08
Heart Failure	4.6 (18,513)	38.4 (247)	< 0.001	40.9 (263)	38.4 (247)	0.362
Acute Myocardial Infarction	1.3 (5,016)	35.9 (231)	< 0.001	34.5 (222)	35.9 (231)	0.599
Chronic Kidney Disease	9.9 (39,515)	33.1 (213)	< 0.001	33.7 (217)	33.1 (213)	0.813
Cerebrovascular Diseases	3.4 (13,784)	18.5 (119)	< 0.001	18.1 (117)	18.5 (119)	0.829
Cardiovascular Procedures ^b	5.2 (20,806)	18.5 (119)	< 0.001	18.2 (117)	18.5 (119)	0.885
Cardiovascular Medications ^c	38.3 (153,191)	90.7 (583)	<0.001	91 (585)	90.7 (583)	0.847

^{*}Values are % (n) unless otherwise stated. Baseline characteristics were compared using a chi-squared test for categorical variables and an independent-sample t-test for continuous variables. aData are taken from structured fields in the electronic medical record systems of the participating healthcare organizations, therefore, there may be regional or country-specific differences in how race categories are defined. bCardiovascular procedures include cardiography, echocardiography, catheterization, cardiac devices, electrophysiological procedures. Cardiovascular medications include beta-blockers, antiarrhythmics, diuretics, antilipemic agents, antianginals, calcium channel blockers, ACE inhibitors.

CR; cardiac rehabilitation and exercise programmes, SD; standard deviation.