

Contents lists available at ScienceDirect American Heart Journal Plus: Cardiology Research and Practice

journal homepage: www.sciencedirect.com/journal/ american-heart-journal-plus-cardiology-research-and-practice

Research paper



Thirty-day readmissions among patients with cardiogenic shock who underwent extracorporeal membrane oxygenation support in the United States: Insights from the nationwide readmissions database Check for updates

Abdulelah Nuqali ^{a,1}, Amandeep Goyal ^{a,1}, Prakash Acharya ^a, Ioannis Mastoris ^a, Tarun Dalia ^a, Wan-Chi Chan ^a, Andrew Sauer ^a, Nicholas Haglund ^a, Andrija Vidic ^a, Travis Abicht ^b, Matthew Danter ^b, Kamal Gupta ^a, Joseph E. Tonna ^{c,d}, Zubair Shah ^{a,*}

^a Department of Cardiovascular Medicine, The University of Kansas Health System, University of Kansas School of Medicine, Kansas City, KS, United States of America

^b Department of Cardiothoracic Surgery, The University of Kansas Health System, University of Kansas School of Medicine, Kansas City, KS, United States of America

^c Division of Cardiothoracic Surgery, Department of Surgery, University of Utah Health, Salt Lake City, UT, United States of America

^d Division of Emergency Medicine, Department of Surgery, University of Utah Health, Salt Lake City, UT, United States of America

ARTICLE INFO

Keywords: Extracorporeal membrane oxygenation 30 days readmissions Cardiogenic shock Heart failure NRD

ABSTRACT

Background: There is a paucity of data on readmission rates and predictors of readmissions in cardiogenic shock patients after contemporary Extracorporeal Membrane Oxygenation (ECMO) use. Methods: Using the Nationwide Readmission Database, we included adult patients (≥18 years old) hospitalized between January to November 2016–2018 for cardiogenic shock requiring ECMO support. Thirty-day readmission rates, associated variables, and predictors of readmission were assessed. Results: A total of 10,723 patients underwent ECMO for cardiogenic shock. After excluding patients who died (*n* = 5602; 52%) and who underwent LVAD or OHT during index admission (*n* = 892; 8%), 4229 patients discharged alive were included. Of those, 694 (16.4%) were readmitted within 30 days. The median time to readmission was 10 days. Diabetes mellitus (OR = 1.77; 95% CI 1.32–2.37), chronic liver disease (OR = 1.35; 95% CI 1.03–1.77), and prolonged LOS (≥30 days; OR = 1.38; 95% CI 1.05–1.81) were associated with increased risk of 30-day readmissions while heart failure diagnosis (OR = 0.69; 95% CI 0.50–0.95) and short-term hospital post-discharge care (OR = 0.53; 95% CI 0.28–0.99) conferred a lower risk. Sepsis, followed by congestive heart failure, was the most common readmission diagnoses. *Conclusions:* Patients with CS requiring ECMO support have high mortality and high 30-day readmission rates, with sepsis being the leading cause of readmissions followed by heart failure.

1. Introduction

Cardiogenic shock (CS) is characterized by significant morbidity and mortality ranging between 38 and 75% despite continued improvement in therapeutics, including mechanical circulatory support (MCS) [1,2]. Extracorporeal membrane oxygenation (ECMO) is a high output MCS modality that has been increasingly used in patients with profound CS as a bridge to either recovery or advanced heart failure therapies [3,4]. It has been reported to improve outcomes in CS patients in some retrospective studies, although results have been mixed [5–7]. ECMO remains a complex and resource intensive therapy associated with high rates of complications [2].

Thirty-day risk-standardized readmission rates for specific diagnoses, including heart failure and acute myocardial infarction, are an important, publicly reported metric by the Center for Medicare and Medicaid Services (CMS) as part of the national strategy to provide

https://doi.org/10.1016/j.ahjo.2021.100076

Received 17 October 2021; Accepted 19 November 2021

Available online 6 December 2021

2666-6022/© 2021 Published by Elsevier Inc. This is an open access article under the CC BY-NC-ND license (http://creativecommons.org/licenses/by-nc-nd/4.0/).

Abbreviations: ACS, acute coronary syndrome; CHF, congestive heart failure; CS, cardiogenic shock; ECMO, extracorporeal membrane oxygenation; LOS, length of stay; LVAD, left ventricular assist device; MCS, mechanical circulatory support; OHT, orthotopic heart transplant.

^{*} Corresponding author at: Department of Cardiovascular Medicine, The University of Kansas School of Medicine, 3901 Rainbow Blvd, Kansas City, KS 66160, United States of America.

E-mail address: zhah2@kumc.edu (Z. Shah).

 $^{^{1}\,}$ Drs Nuqali and Goyal have equally contributed to the manuscript.



Flow chart 1. Study population.

incentives to improve the quality of care and prevent readmissions [8,9]. Hospitals have implemented various measures to decrease readmissions, including care coordination and discharge transition planning, medication reconciliation, addressing social determinants of health, and leveraging data to identify high-risk populations [10]. Given the rapid contemporary increased use of ECMO [11,12], especially for CS, there is a need to explore readmission rates and predictors of readmissions that could inform targeted hospital interventions. To address this gap, we sought to assess 30-day readmission rates, predictors of readmission, and outcomes among patients receiving ECMO for CS.

2. Methods

2.1. Data source

Data were obtained using the National Readmission Database (NRD), maintained by the Agency for Healthcare Research and Quality Healthcare Cost and Utilization Project (HCUP). NRD is a database compiled from the HCUP State Inpatient database from twenty-seven states and accounts for about 57% of all US hospitalizations. The NRD contains information about the index admission and a verified patient linkage number that can be used to track subsequent patient readmission across hospitals within a state. Available data include diagnoses and procedures reported using the International Classification of Diseases, tenth revision (ICD-10), and current procedural classification (CPT) codes. Patient-related outcomes include mortality, length of hospitalization (LOS), and readmissions. The database is publicly available and contains de-identified patient information. Hence, this study was deemed exempt by the institutional review board.

2.2. Patient population

Using pertinent ICD-10 codes, we included adult patients (\geq 18 years old) who were hospitalized between January to November from 2016 to 2018 for CS (ICD code R57.0) requiring ECMO support (ICD-10-PCS 5A15223) [13]. Patients who died before their discharge or received advanced heart failure therapies [left ventricular assist device (LVAD) or heart transplant (OHT)] during the index admission were excluded from the study as they were to be a distinct patient cohort with different rates of readmission (Flowchart 1). All readmissions within a period of thirty-day from patient hospital discharge were recorded. Comorbidities were mapped by AHRQ-HCUP using billing codes. Elixhauser comorbidity index was used to quantify the chronic comorbidity burden for the cohort.

2.3. Outcomes

The outcomes of interest included all-cause readmission rates and predictors of readmission within 30 days. Additional outcomes of interest included readmission diagnosis, in-hospital mortality, and LOS.

2.4. Statistical analysis

NRD database provides weights in the variable "DISCWT" used in weighting and stratification methods to produce national estimates. Weights were applied to the unweighted NRD data using "SURVEY" procedures in STATA, producing a nationwide discharge-level estimate for discharges from all hospitals in the USA. Comorbidity burden was assessed by computing the Elixhauser comorbidity measure. It is a set of thirty comorbidities that impact patient outcomes, including mortality. A scoring system developed by van Walraven assigns a score to each comorbidity group that reflects the strength of association of each comorbidity with hospital death. The composite of all these scores forms the Elixhauser score [14]. The Elixhauser score can be further classified into five categories (<0, 0, 1–5, 6–13, and >14) according to the comorbidity burden [15].

Categorical and continuous variables were reported as percentages and mean \pm SD, respectively. Differences in mean and percentage were assessed using the Student's t-test, Pearson chi-squared test, and twoway ANOVA test. We performed univariate logistic regression to compare the differences in baseline characteristics between the patients who did and did not have readmission within 30 days of discharge. Subsequently, the variables with P < 0.2 were considered for multivariable analysis. These variables included hospital size, median household income, comorbidities (diabetes mellitus, congestive heart failure, coronary artery disease, chronic liver disease), comorbidity burden (Elixhauser >14), length of stay during index hospitalization of >30 days, and discharge disposition (short term hospital stay, skilled nursing facility, and home health care). Multivariable logistic regression was performed to delineate the predictors of 30-day readmission. A twosided *p*-value of <0.05 was chosen as a level of statistical significance. Statistical analysis was performed using STATA 13.1 (Stata Corp, College Station, TX).

3. Results

3.1. Study population

A total of 10,723 patients underwent ECMO for cardiogenic shock

Table 1

Baseline characteristics of patients with cardiogenic shock requiring ECMO support discharged alive after index hospitalization.

population $N =$ No $N =$ Yes $N = 694$ Value $N = 694$ Demographics(21.51)(21.74)(20.33)Age \geq 55 years (%)45.946.1644.590.63Female gender (%)37.2437.4136.340.73Median houschold income percentile (%)0.2523.9723.2727.54 -25 25.9723.2726.5026.1026.0826.23 $51-70$ 225.7225.5726.4555 $76-100$ 24.2125.0819.770.66Medicanto21.2821.1122.1219Primary payer (%) U 3.85 U 0.66Medicanto21.2821.1123.940.36Medicante20.1621.6923.940.36Itopic faminsion (%) U U U U Upp of admission (%) U U U U Taching status U U U U Taching status U	Patient characteristics	Total	30 day readmissions		p-
N = 42.9N = 0.694 3535Demographics(21.51)(21.74)(20.33)Age \geq 55 years (%)45.946.1644.590.63Female gender (%)37.2437.4136.340.73Médian household income		population	No	Yes	Value
Bernographics Mean age (years) (SD) 47.62 47.63 47.54 0.96 (21.51) (21.74) (20.33) 6.53 0.73 Median household income percentife (%) 37.24 37.41 36.34 0.73 Median household income percentife (%) 0.25 23.97 23.27 27.54 26-50 26.10 26.08 26.23 51-70 225.72 25.57 26.45 76-100 24.21 25.08 19.7 0.06 0.06 Medicaid 21.28 21.11 22.1 22.7 7.7 9.9 Private insurance 41.44 41.76 39.84 0.76 0.03 Medicaid 21.28 23.94 97.06 0.33 0.65 Teaching status 20.61 8.36 8.36 1.319 0.76 Weekend admission 20.62 3.94 97.06 0.03 0.33 Bed-size 0.91 3.34 9.69 0.24 2.65 <td></td> <td>N = 4229</td> <td>N =</td> <td>N = 694</td> <td></td>		N = 4229	N =	N = 694	
Demographicsvvv <th< td=""><td></td><td></td><td>3535</td><td></td><td></td></th<>			3535		
Mean age (years) (SD) 47.62 47.63 47.63 47.64 0.63 Age ≥ 55 years (%) 45.9 46.16 44.59 0.63 Female gender (%) 37.24 37.41 36.34 0.73 Median household income 7.5 0.63 0-25 25.97 23.57 26.54 0-25 25.70 25.57 26.64 7.6-100 24.21 25.08 19.77 Medicare 29.18 28.49 32.68 Medicaid 21.28 21.11 22.12 Vieta insurance 41.44 41.76 3.84 0.36 Hogital characteristics Tacching staus 2.06 23.94 0.36 Teaching staus 4.64 5.03 2.65 Median 0.91 Bed size 1.32 1.63 3.63 3.73 Standi dham	Demographics				
Age ≥ 5 years (%)45.946.1643.596.63Female gender (%)37.2437.4136.340.73Median houschold income </td <td>Mean age (years) (SD)</td> <td>47.62</td> <td>47.63</td> <td>47.54</td> <td>0.96</td>	Mean age (years) (SD)	47.62	47.63	47.54	0.96
Age ≥ 55 years (%) 45.9 46.16 44.39 0.63 Female gender (%) 37.24 37.41 36.34 0.73 Median household income percentile (%) 22.5 23.97 23.27 27.54 26-50 26.10 26.08 26.23 5 76-100 24.21 25.08 19.77 Medicare 29.18 28.49 32.68 Medicare 29.18 28.49 32.68 Private insurance 41.44 41.76 38.84 Other 4.77 4.96 3.85 Type of admission 22.06 21.69 23.94 0.76 Weekend admission 22.06 21.69 20.94 0.36 Bodsize 0.03 86.40 85.89 88.9 22.65 Comorbidities (%) 14.52 14.65 13.87 0.24 Pysipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.39 31.94 0.02		(21.51)	(21.74)	(20.33)	
Trans genue (vs) 57.24 37.41 50.54 67.53 Median household income percentile (%) 025 23.27 27.54 26-50 26.10 26.08 26.23 51-70 225.72 25.57 26.45 76-100 24.21 25.08 19.77 Medicare 29.18 28.49 32.68 Medicaid 21.28 21.11 22.12 Private insurance 41.44 41.76 39.84 Other 4.77 4.96 3.85 Type of admission (%) E E 13.84 13.97 13.19 0.76 Weekend admission 22.06 21.69 23.04 0.36 Hoginal characteristics Teaching status 2.65 Medium 8.96 8.36 8.36 1.52 Medium 8.96 8.36 8.36 1.42 1.42 0.91 Medium 8.96 2.32 16.67 0.83 1.52 Medium 8.96 2.31 2.76 0.81 Large 8.66 2.32<	Age \geq 55 years (%) Equals gender (%)	45.9	46.16	44.59 36.34	0.63
percentile (%) 0-25 23.97 23.27 25.7 26.45 26-50 26.10 26.08 26.23 51-70 225.72 25.57 26.45 76-100 24.21 25.08 19.77 0 225.72 25.57 26.45 76-100 24.21 25.08 19.77 0 0.06 Medicare 29.18 28.49 32.68 Medicaid 21.28 21.11 22.12 Private insurance 41.44 41.76 39.84 Other 4.77 4.96 3.85 Type of admission 22.06 21.69 23.94 0.36 Hospital characteristics Teaching 94.45 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.9 Comorbidities (%) Hypertension 9.445 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.9 Comorbidities (%) Hypertension 9.445 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.9 Comorbidities (%) Hypertension 9.16.39 16.32 16.76 0.85 Chronic lung disease 14.52 14.65 13.87 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 15.56 6.6.46 30.98 0.97 Congestive heart failure 71.43 72.16 6.775 0.19 Arrial fibrillation 16.51 16.26 17.76 0.54 Chronic king disease 31.78 30.60 37.79 0.01 Marial fibrillation 16.51 16.26 17.76 0.54 Chronic king disease 31.78 30.60 37.79 0.01 Marial fibrillation 16.51 16.26 17.76 0.54 Chronic king disease 31.78 30.60 37.79 0.01 Marial fibrillation 16.51 16.26 17.76 0.54 Chronic king disease 31.78 30.60 37.79 0.01 Mean time to ECMO (SD) 3.49(7.09 3.22 7 Index admission 4.55 7 8.88 9 9.1.31 0.18 mechanica 4.54 4.57 7 7 1.41 7 2.28 7 Non-ACS 7 1.72 7 1.41 7 2.2 7 1.41 7 2.2 7 1.42 7 2.4 32 7 0.001 Mean time to ECMO (SD) 3.49(7.09 3.2 7 1.5 1 2.4 7 1.4 3 7 1.4 7 3.2 7 1.4 7 3.	Median household income	37.24	37.41	30.34	0.75
0-25 23.97 23.27 27.54 26-50 26.10 26.08 26.23 51-70 22.57.2 25.57 26.47 Medicare 29.18 28.49 32.68 Primary payer (%) 0.06 Medicaid 21.28 21.11 22.12 Private insurance 41.44 41.76 38.84 0.06 Other 4.77 4.96 3.85 7 Freaching status 22.06 21.69 23.94 0.36 Hospital characteristics 7 7 0.03 0.36 Bed-size 0.09 0.31 26.55 0.03 Small 4.64 5.03 2.65 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 1.94 0.02 Obesity 16.39 16.32 16.76 0.85 Comonibidities (%) 14.52 14.65 13.87 0.31 Preipheral vacu	percentile (%)				
26-5026.1026.0826.2351-70225.7225.5726.4576-10024.2125.0819.77Primary payer (%)	0–25	23.97	23.27	27.54	
51-70225.7225.5726.4576-10024.2125.0819.77Primary payer (%)Medicaid21.2821.1122.12Private insurance41.4441.7639.84Other4.774.963.85Type of admission (%)Elective13.8413.9713.190.76Weekend admission22.0621.6923.940.36Hospital CharacteristicsTeaching statusTeaching statusBed-sizeMedium8.9685.8988.9Hypertension53.0753.7349.690.24Dyslipidemia29.0629.1328.740.91Dyslipidemia29.0629.1328.740.91	26–50	26.10	26.08	26.23	
76-100 24.21 25.08 19.77 Medicare 29.18 28.49 32.68 Medicard 21.28 21.11 22.12 Private insurance 41.44 41.76 39.84 Other 4.77 4.96 3.85 Type of admission (%) Elective 13.84 13.97 13.19 0.76 Weekend admission 22.06 21.69 23.94 0.36 Hospital characteristics Teaching status 0.09 0.03 Bed-size 0.09 0.31 26.5 Medium 8.96 8.36 8.36 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.67 0.31 Peripheral vascular disease 17.93 17.51 20.09 0.31 Paripheral vascular disease 14.52 14.65 13.87 0.35 0.27 Chronic lung disease 14.52 14.66 7.75 0.19	51-70	225.72	25.57	26.45	
Primary payer (%) 0.00 Medicare 29.18 28.49 32.68 Medicaid 21.28 21.11 22.12 Private insurance 41.44 41.76 39.84 Other 4.77 4.96 3.85 Type of admission (%) 22.06 21.69 23.94 0.36 Hospital characteristics reaching status 0.09 0.33 Teaching status 0.445 50.3 2.65 Medium 8.96 8.36 8.36 2.44 Dysipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 2.009 0.31 Pe	76–100 Drimony power (06)	24.21	25.08	19.77	0.06
Instantic Data Section Data Section Medicaid 21.28 21.11 22.12 Private insurance 41.44 41.76 39.84 Other 4.77 4.96 3.85 Type of admission (%) 22.06 21.69 23.94 0.36 Hospital characteristics Tracching status 0.99 3.84 13.97 13.19 0.76 Small 4.64 5.03 2.65 0.03 0.85 8.89 0.97 Small 4.64 5.03 2.65 0.96 3.64 1.82 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 0.25 Chronic lung	Medicare	29.18	28 49	32.68	0.00
Private insurance41.4441.7639.84Other4.774.963.85Type of admission (%)13.8413.9713.190.76Weekend admission22.0621.6923.940.36Hospital characteristics0.03Bed-size0.030.03Bed-size0.09Small4.645.032.65Medium8.968.368.36Large86.408.368.36Dyslipidemia29.0623.9331.940.02Obesity16.3916.3216.760.85Obusity16.3916.3216.760.85Obesity16.3916.3216.760.85Oronary artery disease14.5214.6513.870.73Stroke3.483.244.670.31Tobacco use (current or Congestive heart failure71.4372.1667.750.19Atrial fibrillation16.5116.2617.760.54Chronic kidney disease/19.9519.9719.880.09Congestive heart failure71.4372.1667.750.19Atrial fibrillation16.5116.2617.760.54Chronic kidney disease/19.9519.9719.880.09Congestive heart failure71.4372.1667.750.19Atrial fibrillation16.5116.2617.760.54Chronic kidney disease/19.959.59 <td>Medicaid</td> <td>21.28</td> <td>21.11</td> <td>22.12</td> <td></td>	Medicaid	21.28	21.11	22.12	
Other4.774.963.85Type of admission (%)Elective13.8413.9713.190.76Weekend admission22.0621.6923.940.36Hospital characteristics0.03Bed-size0.030.03Bed-size0.030.05Small6.648.368.36Large86.4085.088.94Comorbidities (%)28.740.91Diabetes mellitus25.2523.9331.940.02Obsets mellitus25.2516.3216.760.85Chronic lung disease17.9317.5120.090.31Peripheral vascular disease14.5214.6513.870.73Stroke3.483.244.670.31Tobacco use (current or12.0612.3910.350.27former)16.5116.2617.760.19Atrial fibrillation16.5116.2617.760.19Atrial fibrillation16.5116.2617.760.54Coogulopathy51.8452.1250.430.61Chronic kidney disease/19.9519.9719.880.97END23.1022.6523.440.56Chronic kidney disease31.7830.6037.790.01Maen Einkhauser score ≥ 1478.8578.0882.780.09 <td< td=""><td>Private insurance</td><td>41.44</td><td>41.76</td><td>39.84</td><td></td></td<>	Private insurance	41.44	41.76	39.84	
Type of admission (%) I3.84 13.97 13.19 0.76 Weekend admission 22.06 21.69 23.94 0.36 Hospital characteristics Teaching 94.45 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.36 Large 86.40 8.36 S.36 Large 86.40 8.37 9.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56	Other	4.77	4.96	3.85	
Liective 13.84 13.97 13.19 0.76 Weekend admission 22.06 21.69 23.94 0.36 Hospital characteristics Teaching status 0.09 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.36 8.36 2.65 Large 86.40 85.89 88.9 2.60 Omorbidities (%) Hypertension 53.07 53.73 49.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 7.43 72.16 67.75 0.19 <td>Type of admission (%)</td> <td></td> <td></td> <td></td> <td></td>	Type of admission (%)				
weeken a annission 22.06 21.69 23.94 0.30 Hospital characteristics Teaching 94.45 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.36 8.36 Large 86.40 85.89 88.9 Comorbidities (%) 1 25.25 23.33 31.94 0.02 Obssity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease 13.78 30.60	Elective Weakend admission	13.84	13.97	13.19	0.76
Inorma Lumentation of the set of	Weekend admission Hospital characteristics	22.06	21.69	23.94	0.36
Teaching 94.45 93.94 97.06 0.03 Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.36 8.36 Large 86.40 8.36 8.36 Upstice (%) H H H Hypertension 53.07 53.73 49.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.52 16.76 0.85 Chronic lung disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.91 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial foirbillation 16.51 16.52 23.44 0.30 Coronary artery disease 31.78 3	Teaching status				
Bed-size 0.09 Small 4.64 5.03 2.65 Medium 8.96 8.36 8.36 Large 86.40 85.89 88.9 Comorbidities (%) 1 1 1 Hypertension 53.07 53.73 49.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Tobacco use (current or 12.06 12.91 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Artial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 Elixhauser score (SD) 23.10 22.65 23.44 0.30 Mean Elixhauser score	Teaching	94.45	93.94	97.06	0.03
Small 4.64 5.03 2.65 Medium 8.96 8.36 8.36 Large 86.40 85.89 88.9 Comorbidities (%)	Bed-size				0.09
Medium 8.96 8.36 8.36 Large 86.40 85.89 88.9 Comorbidities (%)	Small	4.64	5.03	2.65	
Large 86.40 85.89 88.9 Comorbidities (%) Hypertension 53.07 53.73 49.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.52 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 ESRD (Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65<	Medium	8.96	8.36	8.36	
Hypertension 53.07 53.73 49.69 0.24 Dyslipidemia 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 (10.63) (11.18) (10.65) Elixhauser score ≥ 14 78.85 78.08 82.78 0.09 High risk of	Large	86.40	85.89	88.9	
hypertunits 29.06 29.13 28.74 0.91 Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 ESRD 4.95 4.84 5.56 0.70 Coagulopathy 51.84 52.12 50.43 0.61 Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 </td <td>Hypertension</td> <td>53.07</td> <td>53.73</td> <td>49 69</td> <td>0.24</td>	Hypertension	53.07	53.73	49 69	0.24
Diabetes mellitus 25.25 23.93 31.94 0.02 Obesity 16.39 16.32 16.76 0.85 Chronic lung disease 17.93 17.51 20.09 0.31 Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 ESRD	Dyslipidemia	29.06	29.13	28.74	0.91
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	Diabetes mellitus	25.25	23.93	31.94	0.02
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	Obesity	16.39	16.32	16.76	0.85
Peripheral vascular disease 14.52 14.65 13.87 0.73 Stroke 3.48 3.24 4.67 0.31 Tobacco use (current or 12.06 12.39 10.35 0.27 former) 6000 12.39 10.35 0.27 Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 ESRD 700 2000 11.18 0.61 0.61 Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 (10.63) (11.18) (10.65) 11.18) 10.651 Elixhauser score ≥ 14 78.85 78.08 82.78 0.09 High severity of illness ^a 96.98 96.73 98.23 0.27 Index admission 11.12 14.92 78.00	Chronic lung disease	17.93	17.51	20.09	0.31
Situlate 5.46 5.24 4.57 0.31 Tobacco use (current or former) 12.06 12.39 10.35 0.27 Coronary artery disease 35.56 36.46 30.98 0.09 Congestive heart failure 71.43 72.16 67.75 0.19 Atrial fibrillation 16.51 16.26 17.76 0.54 Chronic kidney disease/ 19.95 19.97 19.88 0.97 ESRD Anemia 4.95 4.84 5.56 0.70 Coagulopathy 51.84 52.12 50.43 0.61 Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 (10.63) (11.18) (10.65) (10.63) (11.18) (10.65) Elixhauser score ≥ 14 78.85 78.08 82.78 0.09 High risk of mortality ^a 95.59 95.29 97.09 0.25 High severity of illness ^a 96.98 96.73 98.23 0.27 Index admission (6.76)	Peripheral vascular disease	14.52	14.65	13.87	0.73
$\begin{array}{c c c c c c c c c c c c c c c c c c c $	Tobacco use (current or	3.48 12.06	3.24 12.30	4.07	0.31
$\begin{array}{cccc} Coronary artery disease 35.56 36.46 30.98 0.09 \\ Congestive heart failure 71.43 72.16 67.75 0.19 \\ Atrial fibrillation 16.51 16.26 17.76 0.54 \\ Chronic kidney disease/ 19.95 19.97 19.88 0.97 \\ ESRD \\ Anemia 4.95 4.84 5.12 50.43 0.61 \\ Chronic liver disease 31.78 30.60 37.79 0.01 \\ Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 \\ (10.63) (11.18) (10.65) \\ Elixhauser score (SD) 23.10 22.65 99.29 97.09 0.25 \\ High risk of mortalitya 95.59 95.29 97.09 0.25 \\ High severity of illnessa 96.98 96.73 98.23 0.27 \\ Index admission \\ Indication for ECMO 96.98 96.73 98.23 0.27 \\ Index admission \\ Indication for ECMO 10.46 (6.76) (8.47) \\ Concomitant diagnoses 71.72 71.41 73.28 \\ Mean time to ECMO (SD) 3.49 (7.09) 3.2 7.80 <0.001 \\ (6.76) (8.47) \\ Concomitant diagnoses \\ during index admission \\ Acute respiratory failure/ 89.38 88.99 91.31 0.18 \\ mechanical ventilator use Median length of stay 25 (14-42) 24 32 <0.001 \\ during index admission \\ Median length of stay 25 (14-42) 24 32 <0.001 \\ during index admission \\ Length of stay >30 days 42.54 40.66 52.09 0.001 \\ Discharge disposition \\ Home (self-care) 25.09 25.33 23.88 \\ Short term hospital 16.49 17.88 9.47 \\ Skilled nursing facility 34.81 34.07 38.57 \\ Home health care 22.89 21.98 27.57 \\ \end{array}$	former)	12.00	12.57	10.55	0.27
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Coronary artery disease	35.56	36.46	30.98	0.09
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	Congestive heart failure	71.43	72.16	67.75	0.19
$\begin{array}{c ccccccccccccccccccccccccccccccccccc$	Atrial fibrillation	16.51	16.26	17.76	0.54
Anemia 4.95 4.84 5.56 0.70 Coagulopathy 51.84 52.12 50.43 0.61 Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 (10.63) (11.18) (10.65)	Chronic kidney disease/	19.95	19.97	19.88	0.97
Alternia 1.95 1.04 51.04 50.00 0.70 Coagulopathy 51.84 52.12 50.43 0.61 Chronic liver disease 31.78 30.60 37.79 0.01 Mean Elixhauser score (SD) 23.10 22.65 23.44 0.30 (10.63) (11.18) (10.65) 0.99 High severity of illness ¹⁰ 95.59 95.29 97.09 0.25 High severity of illness ¹⁰ 96.98 96.73 98.23 0.27 Index admission	ESRD Anomia	4.95	1 81	5 56	0.70
$\begin{array}{c c c c c c c c c c c c c c c c c c c $	Coagulopathy	4.93 51.84	4.04 52.12	50.43	0.70
$\begin{array}{c c c c c c c } \mbox{Mean Elixhauser score (SD)} & 23.10 & 22.65 & 23.44 & 0.30 \\ & (10.63) & (11.18) & (10.65) \\ \hline & (11.18) & (10.65) & 0.99 \\ \hline & High risk of mortality & 95.59 & 95.29 & 97.09 & 0.25 \\ \hline & High severity of illness & 96.98 & 96.73 & 98.23 & 0.27 \\ \hline & Index admission & & & & & & \\ Indication for ECMO & & & & & & & & \\ \hline & Indication for ECMO & & & & & & & & \\ \hline & ACS & 28.28 & 28.59 & 26.72 & & & & & & \\ \hline & ACS & 28.28 & 28.59 & 26.72 & & & & & & \\ \hline & Non-ACS & 71.72 & 71.41 & 73.28 & & & & \\ \hline & Mean time to ECMO (SD) & 3.49 (7.09) & 3.2 & 7.80 & <0.001 & & & \\ \hline & & & & & & & & & \\ \hline & Concomitant diagnoses & & & & & & & \\ \hline & during index admission & & & & & & & & \\ \hline & Acute respiratory failure/ & 89.38 & 88.99 & 91.31 & 0.18 & & & \\ \hline & mechanical ventilator use & & & & & & & \\ \hline & Median length of stay & 25 (14-42) & 24 & 32 & <0.001 & & \\ \hline & & & & & & & & & & \\ \hline & Median length of stay & 25 (14-42) & 24 & 32 & <0.001 & & \\ \hline & & & & & & & & & & & \\ \hline & Median length of stay > 30 days & 42.54 & 40.66 & 52.09 & 0.001 & & & & \\ \hline & & & & & & & & & & & & \\ \hline & & & &$	Chronic liver disease	31.78	30.60	37.79	0.01
$ \begin{array}{ c c c c c } (10.63) & (11.18) & (10.65) \\ (11.18) & (10.65) \\ \hline \\ Elixhauser score \geq 14 & 78.85 & 78.08 & 82.78 & 0.09 \\ High risk of mortality & 95.59 & 95.29 & 97.09 & 0.25 \\ High severity of illness & 96.98 & 96.73 & 98.23 & 0.27 \\ \hline \\ Index admission & & & & & & & & & & & & & & & & & \\ Indication for ECMO & & & & & & & & & & & & & & & & & & &$	Mean Elixhauser score (SD)	23.10	22.65	23.44	0.30
Elixhauser score ≥ 14 78.8578.0882.780.09High risk of mortality ^{ai} 95.5995.2997.090.25High severity of illness ^{ai} 96.9896.7398.230.27Index admissionIndication for ECMO0.49ACS28.2828.5926.72Non-ACS71.7271.4173.28Mean time to ECMO (SD)3.49 (7.09)3.27.80Concomitant diagnoses(6.76)(8.47)during index admission550.001Actute respiratory failure/ mechanical ventilator use89.3888.9991.310.18Median length of stay25 (14-42)2432<0.001		(10.63)	(11.18)	(10.65)	
$\begin{array}{cccccccc} \mbox{High risk of mortality}^{*} & 95.59 & 95.29 & 97.09 & 0.25 \\ \mbox{High severity of illness}^{*} & 96.98 & 96.73 & 98.23 & 0.27 \\ \mbox{Index admission} & & & & & & & \\ \mbox{Indication for ECMO} & & & & & & & & \\ \mbox{ACS} & 28.28 & 28.59 & 26.72 & & & & & \\ \mbox{ACS} & 28.28 & 28.59 & 26.72 & & & & & \\ \mbox{Non-ACS} & 71.72 & 71.41 & 73.28 & & & \\ \mbox{Mean time to ECMO}(SD) & 3.49 (7.09) & 3.2 & 7.80 & <0.001 & & & & \\ \mbox{(6.76)} & (8.47) & & & & & & \\ \mbox{Concomitant diagnoses} & & & & & & & \\ \mbox{during index admission} & & & & & & & \\ \mbox{Acute respiratory failure/} & 89.38 & 88.99 & 91.31 & 0.18 & & \\ \mbox{mechanical ventilator use} & & & & & & & \\ \mbox{Median length of stay} & 25 (14-42) & 24 & 32 & <0.001 & & \\ \mbox{during index admission} & & & & & & & & \\ \mbox{Median length of stay} & 25 (14-42) & 24 & 32 & <0.001 & & \\ \mbox{during index admission} & & & & & & & & \\ \mbox{Length of stay} > 30 \mbox{days} & 42.54 & 40.66 & 52.09 & 0.001 & & & & & \\ \mbox{Discharge disposition} & & & & & & & & & & \\ \mbox{Home (self-care)} & 25.09 & 25.33 & 23.88 & & \\ \mbox{Short term hospital} & 16.49 & 17.88 & 9.47 & & & \\ \mbox{Skilled nursing facility} & 34.81 & 34.07 & 38.57 & & & \\ \mbox{Home health care} & 22.89 & 21.98 & 27.57 & & & & & & & \\ \end{tabular}$	Elixhauser score ≥ 14	78.85	78.08	82.78	0.09
Index admission96.9896.7398.23 0.27 Index admission0.49ACS28.2828.5926.72Non-ACS71.7271.4173.28Mean time to ECMO (SD)3.49 (7.09)3.27.80Concomitant diagnoses(6.76)(8.47)during index admission4cute respiratory failure/89.3888.9991.31Acute respiratory failure/89.3888.9991.310.18mechanical ventilator use(13-41)(18-50)(25-75 percentile) days	High risk of mortality ⁴	95.59	95.29	97.09	0.25
Indication for ECMO 0.49 ACS 28.28 28.59 26.72 Non-ACS 71.72 71.41 73.28 Mean time to ECMO (SD) 3.49 (7.09) 3.2 7.80 <0.001	Index admission	90.98	90.73	98.23	0.27
ACS 28.28 28.59 26.72 Non-ACS 71.72 71.41 73.28 Mean time to ECMO (SD) 3.49 (7.09) 3.2 7.80 <0.001	Indication for ECMO				0.49
$\begin{array}{cccccccccccccccccccccccccccccccccccc$	ACS	28.28	28.59	26.72	
	Non-ACS	71.72	71.41	73.28	
$\begin{array}{cccc} (6.76) & (8.47) \\ \hline & (8.47) \\ \hline & Concomitant diagnoses \\ during index admission \\ Acute respiratory failure/ 89.38 & 88.99 & 91.31 & 0.18 \\ mechanical ventilator use \\ \hline & Median length of stay & 25 (14-42) & 24 & 32 & <0.001 \\ during index admission & (13-41) & (18-50) \\ (25-75 \ percentile) days \\ \hline & Length of stay > 30 days & 42.54 & 40.66 & 52.09 & 0.001 \\ \hline & Discharge disposition & 0.89 \\ \hline & Home (self-care) & 25.09 & 25.33 & 23.88 \\ Short term hospital & 16.49 & 17.88 & 9.47 \\ Skilled nursing facility & 34.81 & 34.07 & 38.57 \\ \hline & Home health care & 22.89 & 21.98 & 27.57 \\ \end{array}$	Mean time to ECMO (SD)	3.49 (7.09)	3.2	7.80	< 0.001
Concomitant diagnoses during index admission Acute respiratory failure/ 89.38 88.99 91.31 0.18 mechanical ventilator use			(6.76)	(8.47)	
Acute respiratory failure/ 89.38 88.99 91.31 0.18 Median length of stay 25 (14-42) 24 32 <0.001	Concomitant diagnoses				
mechanical ventilator use 0.00 0.013 0.101 0.101 Median length of stay 25 (14-42) 24 32 <0.001	Acute respiratory failure/	89 38	88 99	91 31	0.18
Median length of stay 25 (14-42) 24 32 <0.001 during index admission (13-41) (18-50) (13-41) (18-50) (25-75 percentile) days 0.001 0.001 Length of stay >30 days 42.54 40.66 52.09 0.001 0.89 Home (self-care) 25.09 25.33 23.88 36.57 58.57 Skilled nursing facility 34.81 34.07 38.57 40.66 50.09 25.39 21.98 27.57	mechanical ventilator use	09.00	00.99	51.01	0.10
	Median length of stay	25 (14-42)	24	32	< 0.001
$\begin{array}{c c} (25-75 \mbox{ percentile}) \mbox{ days} & 42.54 & 40.66 & 52.09 & 0.001 \\ \hline \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \$	during index admission		(13-41)	(18–50)	
Length of stay >30 days 42.54 40.66 52.09 0.001 Discharge disposition 0.89 Home (self-care) 25.09 25.33 23.88 Short term hospital 16.49 17.88 9.47 Skilled nursing facility 34.81 34.07 38.57 Home health care 22.89 21.98 27.57	(25–75 percentile) days				
Discnarge disposition 0.89 Home (self-care) 25.09 25.33 23.88 Short term hospital 16.49 17.88 9.47 Skilled nursing facility 34.81 34.07 38.57 Home health care 22.89 21.98 27.57	Length of stay >30 days	42.54	40.66	52.09	0.001
None (seri-(atc)) 20.09 20.33 25.86 Short term hospital 16.49 17.88 9.47 Skilled nursing facility 34.81 34.07 38.57 Home health care 22.89 21.98 27.57	Discharge disposition	25.00	25.32	22.80	0.89
Skilled nursing facility 34.81 34.07 38.57 Home health care 22.89 21.98 27.57	Short term hospital	23.09 16.49	23.33 17.88	23.00 9.47	
Home health care 22.89 21.98 27.57	Skilled nursing facility	34.81	34.07	38.57	
	Home health care	22.89	21.98	27.57	

^a Based on APR-DRG coding (All patient refined diagnosis related groups).



Fig. 1. Common primary diagnoses on readmissions.

from 2016 to 2018. After excluding patients who died (n = 5602; 52%) and those who underwent LVAD or OHT during index admission (n = 892; 8%), 4229 patients discharged alive were included in our analysis (Flowchart 1). The most common primary diagnosis on the index admission for the patients with CS and ECMO use was ST-elevation myocardial infarction (52.2%). Baseline demographics, comorbidities, hospital characteristics, and length of stay are summarized in Table 1. The mean age of the study cohort was 47.6 \pm 21.5 years, and 62.8% were males. Past medical conditions including heart failure, hypertension, coronary artery disease, and chronic liver disease were the most common comorbidities. The mean time to ECMO was 3.49 days (SD: 7.09 days), and the median LOS during index hospitalization was 25 (IQR:14–42 days). Most patients required post-acute inpatient care after discharge. ECMO use occurred almost exclusively in large teaching centers.

3.2. Incidence and causes of 30-day readmission

Among the study population who survived the index hospitalization, 694 patients (16.4%) were readmitted within 30 days. When compared to patients without readmission, patients who were readmitted were more likely to have diabetes mellitus (31.9% vs. 23.9%; p = 0.02), chronic liver disease (37.8% vs. 30.6%; p = 0.01), and longer LOS (32 days vs. 24 days; p < 0.001). Most readmissions occurred within the first ten days after discharge (Supplement 1). The in-hospital mortality rate for readmitted patients was 9.7% (n = 67), and the median length of stay during readmission was seven days. Very few patients underwent advanced therapies on readmission (LVAD only in 1.08% and OHT in 0.68%). The most common indication for 30-day readmission was sepsis, followed by acute heart failure exacerbation and critical illness myopathy/neuropathy, as illustrated in Fig. 1.

3.3. Predictors of 30-day readmission

On multivariate analysis, diabetes mellitus (OR = 1.77; 95% CI 1.32–2.37), chronic liver disease (OR = 1.35; 95% CI 1.03–1.77), and prolonged LOS (\geq 30 days; OR = 1.38; 95% CI 1.05–1.81) were found to be independent predictors of 30-day readmissions (Table 2). Heart failure (OR = 0.69; 95% CI 0.50–0.95) and short-term hospital post-discharge care (OR = 0.53; 95% CI 0.28–0.99) conferred a lower risk of 30-day readmission. To further explore the finding of heart failure conferring a lower risk, we plotted the mortality associated with common comorbid conditions (Fig. 2). A diagnosis of HF did not appear to confer an increased in-hospital mortality risk compared to diabetes, liver

Table 2

Predictors of 30-day readmission after index admission for cardiogenic shock with ECMO use.

	Univariate analysis	Multivariate analysis
Age (>55) years	0.94 (0.73 - 1.21);	
Female gender	p = 0.63 0.96 (0.74–1.24); p = 0.73	
Mean household income percentile	p on o	
(compared to 0–25 percentile) 26–50	0.85 (0.5801.25);	
51–70	p = 0.41 0.87 (0.59–1.28); p = 0.49	
76–100	p = 0.19 0.67 (0.46–0.97); p = 0.04	0.68 (0.47-1.01); p = 0.06
Insurance (compared to medicare)		F
Medicald	0.91 (066-1.26); p = 0.58	
Private insurance	0.83 (0.62-1.12); p = 0.22	
Elective admission	0.94 (0.65-1.36); p = 0.73	
Weekend admission	1.14 (0.87-1.48);	
Hospital size (compared to small bed	p = 0.35	
size) Medium	1.75 (0.74–4.16);	
Large	p-0.21	1 50 (0 73 3 45)
Laige	p = 0.08	p = 0.24
Hypertension	0.85 (0.65-1.12); p = 0.24	
Dyslipidemia	0.98 (0.71-1.35); n = 0.91	
Diabetes mellitus	p = 0.91 1.49 (1.08–2.04); p = 0.012	1.77 (1.32-2.37);
Obesity	p = 0.013 1.03 (0.74–1.45);	<i>p</i> <u>≤0.001</u>
Carotid artery disease	p = 0.85 1.14 (0.26–4.95);	
Chronic lung disease	p = 0.80 1.18 (0.86–1.63);	
Peripheral vascular disease	p = 0.29 0.94 (0.65–1.35);	
Stroke	p = 0.73 1.46 (0.75–2.87);	
Tobacco use (current or former)	p = 0.27 0.82 (0.56–1.19);	
Coronary artery disease	p = 0.29 0.78 (0.59–1.04); p = 0.00	0.79 (0.58 - 1.08);
Congestive heart failure	p = 0.09 0.81 (0.59–1.11);	p = 0.14 0.69 (0.50–0.95);
Atrial fibrillation	p = 0.19 1.11 (0.79–1.55);	p = 0.02
Chronic kidney disease/ESRD	p = 0.53 0.99 (0.74–1.35); p = 0.97	
Anemia	p = 0.97 1.16 (0.56–2.38); p = 0.60	
Coagulopathy	p = 0.09 0.93 (0.72–1.21); p = 0.61	
Chronic liver disease	p = 0.01 1.38 (1.08–1.76); p = 0.01	1.35(1.03-1.77);
Elixhauser score ≥ 14	p = 0.01 1.35 (0.96–1.92); p = 0.09	p = 0.03 1.27 (0.85–1.91); p = 0.25
High risk of mortality*	p = 0.09 1.64 (0.65–4.18); p = 0.29	p = 0.23
High severity of illness*	p = 0.25 1.88 (0.57–6.02); n = 0.30	
ACS as primary cause of index	p = 0.50 0.91 (0.69–1.19); p = 0.50	
Acute respiratory failure or mechanical	p = 0.50 1.29 (0.87–1.95);	
ventilator use during index admission	p = 0.21	
Length of stay >30 days	1.59 (1.22–2.06);	1.38 (1.05–1.81);
	p = 0.001	p = 0.02

Table 2 (continued)

	Univariate analysis	Multivariate analysis
Discharge disposition (compared to home (self-care))		
Short term hospital	0.56 (0.31-1.01); p = 0.06	0.53 (0.28-0.99); p = 0.05
Skilled nursing facility	1.20 (0.83–1.73); p = 0.32	
Home health care	1.33 (0.93–1.90); p = 0.12	$\begin{array}{l} 1.23 \; (085 1.77); \\ p = 0.27 \end{array}$

Based on APR-DRG coding (All patient refined diagnosis related groups).

failure, and coronary artery disease. A forest plot is illustrated in Fig. 3.

4. Discussion

In this contemporary analysis of 4229 patients who survived to discharge after ECMO for CS, we sought to identify risk factors associated with all-cause 30-day readmission in a nationwide and contemporary cohort of patients undergoing ECMO for CS. We report multiple novel findings: i) Of patients who survived to discharge, 16.4% were readmitted within 30 days with a median time to readmission of 10 days post-discharge, ii) Diabetes mellitus, chronic liver disease, and prolonged LOS (>30 days) conferred a higher risk for 30-day readmissions while heart failure diagnosis and being discharged to a short term hospital conferred a lower risk for readmission, and iii) Sepsis, heart failure and critical illness polymyopathy/neuropathy were the most common indications for 30-day readmission.

The observed thirty-day readmission rate of 16.4% is somewhat lower than previous literature. Two studies conducted by Shah et al. analyzing patients with AMI and non-AMI-related cardiogenic shock have found a 30-day readmission rate of 20.2% and 22.6%, respectively [16,17]. These findings were derived using 2013–2014 NRD data in a population not restricted to ECMO use. Furthermore, in a more recent study of ECMO use in CS, using NRD data from 2016, the readmission rate was reported at 23.9% [18]. Among patients receiving ECMO for all indications (including venovenous and venoarterial ECMO), readmission rates are higher at 21.1% and 43.8% [19,20]. The observed lower rate in our study may be explained in two ways. It is plausible that the increased ECMO use for cardiac reasons has led to improved management, experience, and familiarity with this modality, eventually resulting in improved outcomes. Alternatively, this may represent bias due to increased out-of-hospital mortality post-discharge.

Another iterative observation in our cohort was that more than 50% of the readmissions occurred within the first ten days after discharge. This observation has been reproduced in previous analyses [16,17]. It appears that the first days post-discharge represent a vulnerable period where gaps in the transition of in- to out-of-hospital care may occur in addition to lack of social and emotional support. This is further supported by the lower readmission risk seen in patients discharged to a short-term hospital facility where care lapses are less likely to occur. Therefore, an accurate assessment of patients' frailty before discharge may help identify high-risk individuals, decrease readmission rates and implement a multipoint strategy for close post-discharge monitoring.

History of diabetes mellitus, chronic liver disease, and prolonged LOS are associated with increased risk of readmission, which could be explained by these patients' poor overall functional status. Although previously reported by Sanaiha et al., a history of heart failure was surprisingly associated with a lower risk of readmission [19]. The observed decrease in readmission with baseline heart failure was unexpected owing to the large body of literature supporting high readmission rates for patients with various etiologies of cardiomyopathy [21–23]. Compared to other comorbidities (like CAD, DM, and chronic liver disease), heart failure patients did not have higher mortality during the index admission to explain this finding (shown in Fig. 3). The reason



Fig. 2. Total population (%) with comorbidity and mortality during index admission.



Fig. 3. Forest plot showing independent predictors of 30-day readmission after index admission for cardiogenic shock requiring ECMO.

for low readmission in heart failure patients could be secondary to higher out-of-hospital mortality after discharge versus a paradox finding. This is a limitation of the NRD as it lacks information on out-ofhospital mortality, which could affect the 30-day readmission rate. Independent predictors of 30-day readmission after index admission for cardiogenic shock requiring ECMO has shown in the forest plot (Fig. 3).

ECMO use in patients with CS was associated with 52.2% mortality in our study, consistent with previous studies. Sanaiha et al. reported an overall mortality of 50.2% in an analysis of adult patients who underwent ECMO using the NRD from 2010 to 2015 [19]. Another study showed 59.2% in an analysis of the National Inpatient Sample (NIS) database from 2000 to 2014 in a cohort of AMI utilizing ECMO [1]. Truby et al. reported a lower mortality rate of 38.6% in patients with refractory CS who underwent ECMO support in a single tertiary center experience [25]. Our high mortality rate could be attributed to our cohort's heterogeneity that included all payers and a wide variety of

hospitals.

Sepsis was the most common cause of 30-day readmission (11.7%) in our study, followed by cardiac causes, heart failure being the most common. Previous studies have shown cardiac causes for most of the rehospitalizations, heart failure being the most common (20–24%) and infections being the third most common cause (9–11%) that is consistent with our findings [17,18]. Patients who underwent ECMO cannulation usually require invasive procedures such as pulmonary artery catheter placement and frequently require prolonged use of central lines, urinary catheters, and endotracheal tubes. This will expose them to various healthcare-associated infections, such as ventilator-associated pneumonia, central line-associated bloodstream infections, and surgical site infections [24]. The risk of infection and cardiac decompensation among these sick patients should be identified early. Strategies to minimize the risk of infections should result in significantly lower 30-day rehospitalization rate. Close follow-up by the multidisciplinary team approach

A. Nuqali et al.

as an outpatient should be implemented to reduce the readmissions rate.

4.1. Limitations

This study has several limitations. This retrospective study uses the NRD, which relies on the ICD-10 codes with no hemodynamics, clinical, or laboratory data. Data regarding readmission beyond 30 days was not available in this database, and this database lacks information regarding out-of-hospital mortality, which could affect the 30-day readmission rate.

5. Conclusion

In conclusion, patients with CS requiring ECMO support have high mortality and high 30-day readmission rates, with sepsis being the leading cause of readmissions followed by heart failure. Prolonged hospitalization, diabetes mellitus, and chronic liver disease were identified as the independent predictors of 30-day readmission.

Supplementary data to this article can be found online at https://doi.org/10.1016/j.ahjo.2021.100076.

Funding sources

The authors have self-purchased the publicly available administrative database from the Healthcare Cost and Utilization Project of the Agency for Healthcare Research and Quality of the United States of America.

Disclosures

Dr. Tonna is supported by a Career Development Award from the National Institutes of Health/National Heart, Lung, And Blood Institute (K23 HL141596). Dr. Tonna received speaker fees and travel compensation from LivaNova and Philips Healthcare, unrelated to this work.

-Rest of the authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

Declaration of competing interest

Joseph E. Tonna, MD reports a relationship with LivaNova and Philips Healthcare that includes: speaking and lecture fees and travel reimbursement. Joseph E. Tonna, MD reports a relationship with The National Institutes of Health, The National Heart, Lung, And Blood Institute that includes: funding grants.

References

- S. Vallabhajosyula, A. Prasad, M.R. Bell, G.S. Sandhu, M.F. Eleid, S.M. Dunlay, et al., Extracorporeal membrane oxygenation use in acute myocardial infarction in the United States, 2000 to 2014 12 (12) (2019), e005929.
- [2] M.E. Keebler, E.V. Haddad, C.W. Choi, S. McGrane, S. Zalawadiya, K.H. Schlendorf, et al., Venoarterial extracorporeal membrane oxygenation in cardiogenic shock, JACCHeart Fail. 6 (6) (2018) 503–516.
- [3] S. Fukuhara, K. Takeda, P.A. Kurlansky, Y. Naka, H. Takayama, Extracorporeal membrane oxygenation as a direct bridge to heart transplantation in adults, J. Thorac. Cardiovasc. Surg. 155 (4) (2018) 1607–1618, e6.

- [4] M. Guglin, M.J. Zucker, V.M. Bazan, B. Bozkurt, A. El Banayosy, J.D. Estep, et al., Venoarterial ECMO for adults, J. Am. Coll. Cardiol. 73 (6) (2019) 698–716.
- [5] G. Muller, E. Flecher, G. Lebreton, C.-E. Luyt, J.-L. Trouillet, N. Bréchot, et al., The ENCOURAGE mortality risk score and analysis of long-term outcomes after VA-ECMO for acute myocardial infarction with cardiogenic shock, Intensive Care Med. 42 (3) (2016) 370–378.
- [6] M.-Y. Wu, M.-Y. Lee, C.-C. Lin, Y.-S. Chang, F.-C. Tsai, P.-J. Lin, Resuscitation of non-postcardiotomy cardiogenic shock or cardiac arrest with extracorporeal life support: the role of bridging to intervention, Resuscitation 83 (8) (2012) 976–981.
- [7] H. Kim, S.-H. Lim, J. Hong, Y.-S. Hong, C.J. Lee, J.-H. Jung, et al., Efficacy of venoarterial extracorporeal membrane oxygenation in acute myocardial infarction with cardiogenic shock, Resuscitation 83 (8) (2012) 971–975.
- [8] K. Dharmarajan, A.F. Hsieh, Z. Lin, H. Bueno, J.S. Ross, L.I. Horwitz, et al., Diagnoses and timing of 30-day readmissions after hospitalization for heart failure, acute myocardial infarction, or pneumonia, JAMA 309 (4) (2013) 355–363.
- [9] R.B. Zuckerman, S.H. Sheingold, E.J. Orav, J. Ruhter, A.M. Epstein, Readmissions, observation, and the hospital readmissions reduction program, N. Engl. J. Med. 374 (16) (2016) 1543–1551.
- [10] K.E. Joynt, A.K. Jha, Thirty-day readmissions-truth and consequences, N. Engl. J. Med. 366 (15) (2012) 1366.
- [11] M. Chung, F.R. Cabezas, J.I. Nunez, K.F. Kennedy, K. Rick, P. Rycus, et al., Hemocompatibility-related adverse events and survival on venoarterial extracorporeal life support: an ELSO registry analysis, Heart Fail. 8 (11) (2020) 892–902.
- [12] J.E. Tonna, C.H. Selzman, S. Girotra, A.P. Presson, R.R. Thiagarajan, L.B. Becker, et al., Patient and institutional characteristics influence the decision to use extracorporeal cardiopulmonary resuscitation for in-hospital cardiac arrest, J. Am. Heart Assoc. 9 (9) (2020), e015522.
- [13] F. Chouairi, S. Vallabhajosyula, C. Mullan, M. Mori, A. Geirsson, N.R. Desai, et al., Transition to advanced therapies in elderly patients supported by extracorporeal membrane oxygenation therapy, J. Card. Fail. 26 (12) (2020) 1086–1089.
- [14] A. Elixhauser, C. Steiner, D.R. Harris, R.M. Coffey, Comorbidity measures for use with administrative data, Med. Care 8–27 (1998).
- [15] C. van Walraven, P.C. Austin, A. Jennings, H. Quan, A.J. Forster, A modification of the elixhauser comorbidity measures into a point system for hospital death using administrative data, Med. Care 626–33 (2009).
- [16] M. Shah, B. Patel, B. Tripathi, M. Agarwal, S. Patnaik, P. Ram, et al., Hospital mortality and thirty day readmission among patients with non-acute myocardial infarction related cardiogenic shock, Int. J. Cardiol. 270 (2018) 60–67.
- [17] M. Shah, S. Patil, B. Patel, M. Agarwal, C.D. Davila, L. Garg, et al., Causes and predictors of 30-day readmission in patients with acute myocardial infarction and cardiogenic shock, Circ. Heart Fail. 11 (4) (2018), e004310.
- [18] N. Tashtish, S.G. Al-Kindi, M. Karnib, E. Zanath, S. Mitchell, C. Di Felice, et al., Causes and predictors of 30-day readmissions in patients with cardiogenic shock requiring extracorporeal membrane oxygenation support, Int. J. Artif. Organs 43 (4) (2020) 258–267.
- [19] Y. Sanaiha, B. Kavianpour, A. Mardock, H. Khoury, P. Downey, S. Rudasill, et al., Rehospitalization and resource use after inpatient admission for extracorporeal life support in the United States, Surgery 166 (5) (2019) 829–834.
- [20] M.D. Huesch, A. Foy, C. Brehm, Survival outcomes following the use of extracorporeal membrane oxygenation as a rescue technology in critically ill patients: results from Pennsylvania 2007–2015, Crit. Care Med. 46 (1) (2018) e87–e90.
- [21] B. Ziaeian, G.C. Fonarow, The prevention of hospital readmissions in heart failure, Prog. Cardiovasc. Dis. 58 (4) (2016) 379–385.
- [22] J.A. Dodson, Y. Wang, K. Murugiah, K. Dharmarajan, Z. Cooper, S. Hashim, et al., National trends in hospital readmission rates among medicare fee-for-service survivors of mitral valve surgery, 1999–2010, PLoS One 10 (7) (2015), e0132470.
- [23] M. Ong, P. Romano, S. Edgington, H. Aronow, A. Auerbach, J. Black, et al., Better effectiveness after transition-heart failure (BEAT-HF) research group. Effectiveness of remote patient monitoring after discharge of hospitalized patients with heart failure: the better effectiveness after transition-heart failure (BEAT-HF) randomized clinical trial, JAMAIntern. Med. 176 (3) (2016) 310–318.
- [24] M.J. Bizzarro, S.A. Conrad, D.A. Kaufman, P. Rycus, Infections acquired during extracorporeal membrane oxygenation in neonates, children, and adults, Pediatr. Crit. Care Med. 12 (3) (2011) 277–281.
- [25] L. Truby, L. Mundy, B. Kalesan, A. Kirtane, P.C. Colombo, K. Takeda, et al., Contemporary outcomes of venoarterial extracorporeal membrane oxygenation for refractory cardiogenic shock at a large tertiary care center, Asaio J. 61 (4) (2015) 403–409.