Provider and Patient Characteristics of Medicare Beneficiaries Who Are High-Risk for COVID-19 Mortality



J Gen Intern Med 36(7):2189–90 DOI: 10.1007/s11606-021-06857-8 © Society of General Internal Medicine 2021

# INTRODUCTION

The Medicare population comprises 60 million Americans,<sup>1</sup> many of whom are the most vulnerable people susceptible to COVID-19 mortality. The National Academies of Sciences, Engineering and Medicine recommended targeting high-risk individuals including older individuals in the early stages of a national vaccine rollout.<sup>2</sup> In this study, we identify Medicare beneficiaries at high risk for COVID-19 mortality, and characterize primary care providers who serve these beneficiaries.

## **METHODS**

We identified Medicare beneficiaries at high risk for COVID-19 mortality using a recently validated COVID-19 mortality risk scoring algorithm<sup>3</sup> applied to Medicare data. The algorithm uses an individual's demographic data (age, race, gender, body mass index (BMI), and location-based measure of social deprivation), smoking status, and ten predisposing medical conditions to estimate COVID-19 mortality risk. Due to data limitations, we modified the risk algorithm to exclude the two data inputs: smoking and BMI. We applied this algorithm to the 20% sample of the 2018 Medicare claims dataset. The Medicare beneficiary summary file and the Chronic Conditions Warehouse data within the file provided the inputs for the algorithm except for the cancer variables and county-level Social Deprivation Index (SDI) quintile. Data on cancer in the calendar year was ascertained using Medicare outpatient claims. An individual's SDI quintile was ascertained using that individual's county and its corresponding SDI value.<sup>4</sup> Beneficiaries who lacked Medicare Part B or were covered in a Medicare Advantage Plan were excluded.

We then estimated individual risk scores for each Medicare beneficiary. High-risk and very high-risk Medicare beneficiaries were identified respectively with risk scores that were greater than or equal to five times and ten times the average of the general population risk based on data from the National Health Interview Survey.<sup>5</sup> We summarized beneficiaries'

demographics, number of chronic conditions, and healthcare utilization. We also identified their primary care providers using outpatient claims. Primary care providers were approximated using the attending specialty codes. We then stratified coverage of beneficiaries by providers based on total beneficiary visits.

## RESULTS

We calculated risk scores for approximately 5.5 million beneficiaries, among whom 1,891,599 were high-risk and 791,787 were very high-risk for COVID-19 mortality (Table 1). Highrisk Medicare beneficiaries were older, had more chronic conditions, and were greater utilizers of healthcare than the general Medicare population. These high-risk beneficiaries also had nearly 6.4 million outpatient visits with an estimated 20,889 unique primary care providers (Table 2). The top 1000 providers who had the most visits saw 45% of the high-risk beneficiaries. This coverage increases to nearly 70% for the top 5000 providers.

### DISCUSSION

Medicare beneficiaries who were deemed high-risk for Covid mortality represented high frequency users of Medicare and medically complex patients. However, identifying these beneficiaries from the millions of other Medicare beneficiaries is a logistical challenge. Our study utilized claims data and a validated predictive algorithm to identify these patients. A similar approach could have been taken to prioritize health systems and primary care physicians caring for patients at highest risk to target allocation of vaccine supplies. This approach could have utilized electronic health records to identify specific high-risk Medicare beneficiaries to offer vaccination. Policymakers could then have supported these providers with additional resources to identify and outreach to high-risk patients.

Our study had several limitations. Given the urgency of the vaccination campaign, our algorithm was not immediately available to federal, state, and local governments to identify practices in time for vaccine distribution. Our study relied on claims data including chronic conditions indicators which may be less accurate than electronic health records. Lastly, the algorithm would need to be modified to match available data for it to run within health systems.

Primary care providers offer a distinct advantage over pharmacies for identification of high-risk beneficiaries because data on the risk factors, primary medical in nature, are more

Received December 15, 2020 Accepted April 26, 2021 Published online May 6, 2021

**Table 1 Beneficiary Characteristics** 

Variable	Very high-risk beneficiaries <sup>1</sup>	High-risk Beneficiaries <sup>2</sup>	Full Sample
Total N	791,787	1,891,599	5,350,300
Demographics			
Male	436,905	945,403	2,247,030
Female	354,882	946,196	3,103,270
Age	81.2 years	78.8 years	71.7 years
Race	-	-	-
White	529,712	1,381,303	4,437,794
Black	191,254	350,577	506,005
Other	9551	24,710	73,689
Asian	14,830	32,849	86,401
Hispanic	34,970	71,025	112,884
Native American	8931	18,135	35,329
Unknown	2539	13,000	98,199
Number of	7.2	5.9	4.3
chronic conditions			
(average) <sup>3</sup>			
Healthcare utilizatio	n		
Outpatient visits	16.9	14.1	10.9
(average)			
Inpatient stays	0.14	0.09	0.06
(average)			
Inpatient length	1.3 days	0.84 days	0.56 days
of stay (average)			
Part D fills	82.1 fills	74.5 fills	60.4 fills
(average)			

<sup>1</sup>Very high-risk is defined as having ten times or greater predicted mortality from COVID-19 compared to the general population <sup>2</sup>High-risk is defined as having five times or greater predicted mortality

from COVID-19 compared to the general population <sup>3</sup>Number of chronic conditions are based on the Chronic Conditions

Warehouse data within the Medicare beneficiary file of which there are 27 possible chronic conditions

Variable	Very high-risk Beneficiaries <sup>1</sup>	High-risk beneficiaries <sup>2</sup>	Full sample	
Primary care providers				
Number of	18,982	20,889	22,301	
unique providers				
Visits by provider types				
General practice	99,858	211,543	486,612	
Family practice	1,104,124	2,551,545	6,554,153	
Internal	1,735,580	3,554,824	7,759,745	
medicine				
Geriatric	27,131	85,250	443,196	
medicine				
Preventive	1056	2192	5340	
medicine				
Coverage of unique beneficiaries by high-frequency providers				
Top 1000	358,639	830.584	2,296,716	
Providers	(45.3%)	(43.9%)	(42.9%)	
Coverage of	( )			
unique				
beneficiaries				
Top 5000	544.490	1.280.946	3.534.199	
Providers	(68.8%)	(67.7%)	(66.1%)	
Coverage of	(*****)	((())))	(00000))	
unique				
beneficiaries				
Top 10.000	566.097	1.336.932	3,699,434	
Providers	(71.5%)	(70.6%)	(69.1%)	
Coverage of	(/1.570)	(70.070)	(0).170)	
unique				
beneficiaries				

<sup>1</sup>Very high-risk is defined as having ten times or greater predicted mortality from COVID-19 compared to the general population <sup>2</sup>High-risk is defined as having five times or greater predicted mortality from COVID-19 compared to the general population accessible to primary providers than pharmacies. Pharmacies typically only assess medication histories and would miss important conditions that are not clearly associated with outpatient prescriptions. As vaccine rollout continues, and if new vaccinations become necessary in the pandemic, algorithms should be considered to maximize the match of vaccine supplies to those at highest risk.

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Author Contribution All authors contributed to the design, analysis, drafting and critical revision of this manuscript and all authors have approved the final version.

Funding This work was funded by Arnold Ventures (Ballreich).

#### Declarations:

**Conflict of Interest:** Dr. Ballreich receives research funding from Arnold Ventures. He also receives consulting fees from Monument Analytics, a health sciences consultancy. The authors report no other conflicts of interest.

**Disclaimer:** Dr. Ballreich had full access to the data and takes responsibility for the integrity of the data and the accuracy of the data analysis.

#### REFERENCES

- CMS Fast Facts | CMS. Accessed November 16, 2020. https://www.cms. gov/Research-Statistics-Data-and-Systems/Statistics-Trends-and-Reports/CMS-Fast-Facts
- National Academies of Sciences E. Framework for Equitable Allocation of COVID-19 Vaccine.; 2020. doi:10.17226/25917
- Jin, J., Agarwala, N., Kundu, P., Harvey, B., Zhang, Y., Wallace, E., & Chatterjee, N. (2020). Individual and community-level risk for COVID-19 mortality in the United States. *Nature Medicine*, 1-6.
- Social Deprivation Index (SDI). Accessed November 29, 2020. https:// www.graham-center.org/rgc/maps-data-tools/sdi/social-deprivation-index.html
- NHIS National Health Interview Survey. Published November 3, 2020. Accessed November 29, 2020. https://www.cdc.gov/nchs/nhis/index. htm

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