Comparison of resident COVID-19 mortality between unionized and nonunionized private nursing homes

Adam Olson¹, Shivaram Rajgopal², Ge Bai³*

¹ Accounting Department, Lindner College of Business, University of Cincinnati, Cincinnati, Ohio, United State of America, ² Accounting Division, Columbia Business School, Columbia University, New York, New York, United States of America, ³ Carey Business School and Bloomberg School of Public Health, Johns Hopkins University, Baltimore, Maryland, United States of America

* gbai@jhu.edu

Abstract

Using bargaining agreement data from the Federal Mediation Conciliation Services, we found that the median national resident COVID-19 mortality percentage (as of April 24, 2022) of unionized nursing homes and that of nonunionized ones were not statically different (10.2% vs. 10.7%; \( P = 0.32 \)). The median nursing home resident COVID-19 mortality percentage varied from 0% in Hawaii to above 16% in Rhode Island (16.6%). Unionized nursing homes had a statistically significant lower median mortality percentage than nonunionized nursing homes \( (P < 0.1) \) in Missouri, and had a higher median mortality percentage than nonunionized nursing homes \( (P < 0.05) \) in Alabama and Tennessee. Higher average resident age, lower percentage of Medicare residents, small size, for-profit ownership, and chain organization affiliation were associated with higher resident COVID-19 mortality percentage. Overall, no evidence was found that nursing home resident COVID-19 mortality percentage differed between unionized nursing homes and nonunionized nursing homes in the U.S.

Introduction

As of April 24, 2022, 152,324 nursing home residents in the U.S. had died from COVID-19, representing 15.4% of all COVID-19 deaths (990,769) in the U.S. \([1, 2]\). Understanding the factors associated with resident mortality has important implications for infection control policies and practice \([3]\). Two recent study found a negative association between nursing home unionization and resident COVID-19 mortality percentage \([4, 5]\). However, the unionization measure in these studies was obtained from a proprietary source \([6, 7]\), and these studies’ categorization of all nursing homes with one or more union-affiliated employees as unionized nursing homes regardless of any actual bargaining agreements or contracts. For example, a nursing home that employs a union-affiliated non-nursing staff such as a janitor but has no actual bargaining contract with any union is considered unionized nursing homes in these studies. In this study, we improved the measurement of unionization by using publicly
available bargaining agreement data and defining a nursing homes as unionized if it has a contract with one or more unions.

Prior research gives little insight into how unionization will affect nursing home COVID-19 mortality. Unionization has been found to lead to no differences in nursing home care quality, increased employee pay, and decreased employee numbers [8]. Mandatory overtime restrictions, popular among unions, have been shown to lower care quality [9]. Yet unionized nursing homes were more likely to have appropriate protective equipment in the early stages of the COVID-19 pandemic [5]. We aim to understand the association between nursing home unionization and resident COVID-19 mortality percentage by examining publicly available unionization information and national nursing home resident COVID-19 mortality data as of April 24, 2022, which captures most nursing home resident COVID-19 mortality in light of the mortality trajectories [2].

Materials and methods

Data and sample

Nursing home resident COVID-19 mortality percentages (as of April 24, 2022) were downloaded from the Centers for Medicare and Medicaid Services (CMS) COVID-19 Nursing Home Data website on May 12, 2022 (a data source separate from hospitals) [1]. A total of 15,486 nursing homes were in the dataset. After excluding 1,106 government nursing homes (approximately 7%), whose unionization information is not publicly available, the full dataset included 14,380 nursing homes. We examine these nursing homes in a retrospective cohort study where unionization determines cohort status.

The CMS dataset also contained nursing home size (the average occupied beds). From CMS’ Provider Information website, we obtained nursing home ownership type and five-star quality rating [10]. From Long-Term Care Focus at Brown University School of Public Health, we gathered the average age of residents, chain organization affiliation, percent of residents enrolled in the Medicare program, percent of residents enrolled in the Medicaid program, percent of obese residents, registered nurse (RN) hours per patient, licensed practical nurse (LPN) hours per patient, certified nursing assistant (CNA) hours per patient, resident acuity, and percent of white residents [11]. These three datasets were merged by using nursing homes’ federal provider identification numbers.

Moreover, we calculated county-level COVID-19 infection percentages by using information downloaded from USAFacts on May 12, 2022 [12], and merged them with the nursing home dataset based on Federal Information Processing Standards (FIPS) county codes. All variables obtained were consistent with those examined in prior research [4, 5]. The merged dataset included 7,509 nursing homes with non-missing values on all variables. See Table 1 for further details regarding our sample and sources.

Measurement of unionization

We define a nursing home as unionized if that nursing home has an active contract with at least one union. Consistent with prior literature, we measure nursing home unionization status using data from the Federal Mediation Conciliation Services (FMCS) [6]. In the U.S., a Notice of Bargaining (F-7 Notice) must be filed with FMCS within 30 days of the beginning of negotiations for a new or modified collective bargaining agreement between an employer and a union [13]. F-7 Notices filed are published on the website of FMCS [14]. Among the published F-7 Notices, using nursing home names, we identified 1,293 nursing homes that filed F-7 Notices between January 1, 2015 and December 31, 2019—approximately five years before the measurement of COVID-19 mortality percentages until shortly before the COVID-19 pandemic—to be consistent with the methodology used in prior research [6]. We considered these
1,293 nursing homes as unionized and the remaining 13,087 nursing homes as nonunionized. The proportion of unionized nursing homes (9.0%) in the sample is consistent with the results in prior research and national statistics on unionization in the private sector [6, 7].

### Statistical analysis

Using the full dataset that contained 14,380 nursing homes, we compared the median resident COVID-19 mortality percentage between unionized and nonunionized nursing homes nationwide. Throughout this study, all tests of medians are a nonparametric k-sample test on the equality of medians with continuity correction. We also conducted the same analysis for each state and the District of Columbia, respectively. We calculate nursing homes COVID-19 mortality percentage as the number of deaths of residents of nursing homes attributed to COVID-19 divided by the average number of occupied beds during our sample period. CMS includes all COVID-19 deaths of nursing home patients regardless of where the actual death occurs.

Using the merged dataset that contained 7,509 nursing homes, consistent with prior literature [4, 5], we compared county-level population and COVID-19 infection percentage, average age of residents, percent of residents enrolled in the Medicare program, percent of residents enrolled in the Medicaid program, percent white residents, RN hours per patient, LPN hours per patient, CNA hours per patient, five-star quality rating, percent obese residents, resident

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**Table 1. Data sources and variables.**

| Data Set                              | Source                                                                 | When Accessed | Variable Used to Merge |
|---------------------------------------|------------------------------------------------------------------------|---------------|------------------------|
| COVID-19 Nursing Home Data            | https://data.cms.gov/stories/s/bkwz-xpgv                               | 5/12/22       |                        |
|                                       | Variables: Name, Federal provider number, COVID-19 deaths, Number of occupied beds |
| Union F-7 Filings                     | https://www.fmcs.gov/resources/documents-and-data/                     | 5/12/22       | Name                   |
|                                       | Variables: Name, F-7 contract (unionized)                              |
| Center for Medicare and Medicaid Services Nursing Home Provider Information | https://data.cms.gov/provider-data/dataset/4pq5-n9py                  | 11/20/20      | Federal Provider Number |
|                                       | Variables: County SSA code, For-profit ownership, Overall quality rating (5-star system) |
| Brown University Nursing Home Data    | http://ltcfocus.org/                                                  | 11/20/20      | Federal Provider Number |
|                                       | Variables: % Medicare residents, % Medicaid residents, % white residents, % obese residents, RN-to-bed ratio, LPN-to-bed ratio, CAN-to-bed ratio, Resident acuity, Average age of residents, Chain organization affiliation, Occupancy % |
| County COVID-19 Data                  | https://usafacts.org/visualizations/coronavirus-covid-19-spread-map/   | 5/12/22       | County FIPS Code       |
|                                       | Variables: County population, County COVID-19 infection percentage, County FIPS |
| County FIPS to SSA Code               | https://www.nber.org/research/data/ssa-federal-information-processing-series-fips-state-and-county-crosswalk | 11/11/20      | County SSA Code        |
|                                       | Variables: County FIPS, County SSA code                               |

**Notes:** Before names were used to merge Union F-7 Filings, names were changed to all lower-case and non-alphanumeric characters were removed. Stata’s reclink command was used to obtain potential name matches. All potential matches were examined by hand at least twice to make sure they were the same nursing home. If the entire nursing home chain had an F-7 filing associated with it, we marked each individual nursing home as unionized. If we were not certain of the name match, we erred on not matching them as to not add bias to our sample by listing nonunionized nursing homes as unionized. This process is not perfect and is a limitation of the study. However, the differences between unionized and nonunionized nursing homes shown in Table 3 suggest that this process did split our sample into two distinct groups. Abbreviations: FIPS: Federal Information Processing Standards; SSA: Social Security Administration; RN: registered nurse; LPN: licensed practical nurse; CNA: certified nursing assistant.

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acuity, size, ownership type, chain organization affiliation, and occupancy percentage for unionized nursing homes and nonunionized ones.

We also conducted multivariate regression analysis using the ordinary least squares (OLS) method to examine the association between nursing home unionization as well as aforementioned nursing home and locality characteristics, and the resident COVID-19 mortality percentage. County fixed effects were added to control for unobserved factors that vary across counties. Standard errors were clustered at the county level.

Results
National level comparison (full dataset)
As of April 24, 2022, the median mortality percentage of 1,293 unionized nursing homes is 10.2%, and the median mortality percentage of 13,087 nonunionized nursing homes is 10.7%. The two median values are not statically different ($P = 0.32$) (Fig 1).

State-level comparison (full dataset)
As shown in Table 2, the proportion of unionized nursing homes differed across states, varying from 0% in Wyoming to above 20% in Michigan (25.7%), Hawaii (23.7%), New Jersey (22.4%), Minnesota (20.1%), and New York (20.1%). The median nursing home resident COVID-19 mortality percentage, as of April 24, 2022, varied from 0% in Hawaii to above 15% in Rhode Island (16.6%), Connecticut (16.0%), and Indiana (15.3%). Unionized nursing homes had a statistically lower median mortality percentage than nonunionized nursing homes ($P < 0.1$) in one state (Missouri), and had a statistically higher median mortality percentage than nonunionized nursing homes ($P < 0.05$) in two states (Alabama and Tennessee).

Nursing home characteristics (merged dataset)
Table 3 shows the comparison results among the 7,509 nursing homes with non-missing values on all variables extracted. Compared to residents in nonunionized nursing homes, residents in unionized nursing homes were younger (median: 78.13 vs. 79.85; $P < 0.01$), in larger counties (median: 522,798 vs. 305,506; $P < 0.01$) with lower COVID-19 infection percentages (median: 23.82 vs. 24.09%; $P < 0.05$), and less likely to be white (median: 79.34% vs. 86.08%; $P < 0.01$). Unionized nursing homes were larger (median: 91.46 vs. 81.46 average occupied beds; $P < 0.01$), had higher occupancy percentages (median: 87.50% vs. 86.54%; $P < 0.01$), and had a higher proportion of Medicaid residents (median: 67.17% vs. 65.00%, $P < 0.05$), all consistent with Sojourner et al. (2010). Further, unionized nursing homes had a relatively high RN-to-bed ratio (median: 0.44 vs. 0.41; $P < 0.1$), relatively low LPN-to-bed ratio (median: 0.82 vs. 0.85; $P < 0.01$) and CNA-to-bed ratio (median: 2.19 vs. 2.25; $P < 0.1$).

Regression results (merged dataset)
As presented in Table 4, unionization was not statistically significantly associated with the nursing home COVID-19 mortality percentage (coefficient $= -0.0018$; $P = 0.75$). Other things equal, a one-year increase in the average age of residents was associated with 0.3% higher COVID-19 mortality percentage ($P < 0.01$); having 10 more occupied beds was associated with 0.1% lower mortality percentage ($P < 0.1$); for-profit ownership was associated with 1.3% higher mortality percentage ($P < 0.05$), and chain organization affiliation was associated with 0.7% higher mortality percentage ($P < 0.05$). In addition, percent of residents enrolled in the Medicare program had a small association with mortality percentage—a 1% higher enrollment in Medicaid program was associated with 0.06% lower mortality percentage ($P < 0.01$).
We conducted two sensitivity tests to understand whether our results are sensitive to excluded nursing homes due to their missing value on at least one control variables in the regression. First, we dropped all control variables obtained from the Brown University data from our regression. Second, we set all missing values of control variables from the Brown University data to the remaining observations' mean values. In both cases, the association between unionization and nursing home COVID-19 mortality remained statistically insignificant (p-values of 0.49 and 0.83, respectively).

![Figure 1](https://doi.org/10.1371/journal.pone.0276301.g001)

**Figure 1.** Nationwide private nursing home resident mortality percentages among unionized (N = 1,291) and nonunionized (N = 13,087) nursing homes, as of April 24, 2022. Note: The full dataset that contained 14,380 nursing homes was used. Box plot lines represent the 25th percentile, median, and 75th percentile. Whiskers are 1.5 times the interquartile ranges. The median COVID-19 mortality percentage for unionized nursing homes is not statistically significantly different from that for nonunionized nursing homes (10.15% vs. 10.68%; P = 0.32) when using a nonparametric k-sample test on the equality of medians with continuity correction.

Discussion

Based on COVID-19 mortality data as of April 22, 2022, unionized nursing homes did not have significantly different COVID-19 mortality from nonunionized nursing homes. We also
Table 2. Private nursing home resident COVID-19 mortality percentages, by state.

| State          | # of private nursing homes | # of unionized | # of nonunionized | % unionized | Median mortality % (all) | Median mortality % (unionized) | Median mortality % (nonunionized) |
|----------------|---------------------------|----------------|-------------------|-------------|--------------------------|-------------------------------|----------------------------------|
| Alaska         | 14                        | 1              | 13                | 7.14%       | 1.36%                    | 0.00%                         | 1.63%                            |
| Alabama        | 214                       | 17             | 197               | 7.94%       | 11.11%                   | 21.26%                       | 10.68%                           |
| Arkansas       | 213                       | 2              | 211               | 0.94%       | 13.71%                   | 8.12%                         | 13.82%                           |
| Arizona        | 142                       | 7              | 135               | 4.93%       | 9.64%                    | 5.23%                         | 9.75%                            |
| California     | 1,135                     | 152            | 983               | 13.39%      | 8.49%                    | 8.62%                         | 8.47%                            |
| Colorado       | 208                       | 6              | 202               | 2.88%       | 11.60%                   | 12.09%                        | 11.60%                           |
| Connecticut    | 210                       | 27             | 183               | 12.86%      | 15.97%                   | 18.98%                        | 15.62%                           |
| Washington DC  | 19                        | 2              | 17                | 10.53%      | 6.99%                    | 3.42%                         | 7.36%                            |
| Delaware       | 45                        | 6              | 39                | 13.33%      | 11.30%                   | 13.29%                        | 10.72%                           |
| Florida        | 688                       | 84             | 604               | 12.21%      | 6.54%                    | 6.80%                         | 6.48%                            |
| Georgia        | 343                       | 3              | 340               | 0.87%       | 10.32%                   | 7.04%                         | 10.43%                           |
| Hawaii         | 38                        | 9              | 29                | 23.68%      | 0.00%                    | 1.13%                         | 0.00%                            |
| Iowa           | 426                       | 25             | 401               | 5.87%       | 11.08%                   | 7.88%                         | 11.12%                           |
| Idaho          | 71                        | 4              | 67                | 5.63%       | 8.11%                    | 9.74%                         | 7.89%                            |
| Illinois       | 693                       | 110            | 583               | 15.87%      | 11.71%                   | 9.98%                         | 12.22%                           |
| Indiana        | 395                       | 8              | 387               | 2.03%       | 15.31%                   | 17.75%                        | 15.18%                           |
| Kansas         | 292                       | 29             | 263               | 9.93%       | 10.99%                   | 15.28%                        | 10.84%                           |
| Kentucky       | 277                       | 7              | 270               | 2.53%       | 11.36%                   | 9.93%                         | 11.44%                           |
| Louisiana      | 263                       | 2              | 261               | 0.76%       | 10.68%                   | 20.13%                        | 10.62%                           |
| Massachusetts  | 371                       | 14             | 357               | 3.77%       | 14.38%                   | 11.02%                        | 14.47%                           |
| Maryland       | 220                       | 20             | 200               | 9.09%       | 9.45%                    | 11.70%                        | 9.32%                            |
| Maine          | 92                        | 4              | 88                | 4.35%       | 9.16%                    | 10.48%                        | 9.16%                            |
| Michigan       | 401                       | 103            | 298               | 25.69%      | 11.46%                   | 11.32%                        | 11.54%                           |
| Minnesota      | 334                       | 67             | 267               | 20.06%      | 9.97%                    | 9.59%                         | 10.00%                           |
| Missouri       | 491                       | 25             | 466               | 5.09%       | 10.14%                   | 7.68%*                        | 10.42%*                          |
| Mississippi    | 178                       | 15             | 163               | 8.43%       | 12.39%                   | 19.20%                        | 12.28%                           |
| Montana        | 62                        | 4              | 58                | 6.45%       | 13.91%                   | 18.77%                        | 13.44%                           |
| North Carolina | 413                       | 26             | 387               | 6.30%       | 11.47%                   | 12.53%                        | 11.28%                           |
| North Dakota   | 77                        | 1              | 76                | 1.30%       | 12.53%                   | 4.95%                         | 12.62%                           |
| Nebraska       | 162                       | 3              | 159               | 1.85%       | 8.39%                    | 22.25%                        | 8.29%                            |
| New Hampshire  | 64                        | 1              | 63                | 1.56%       | 10.24%                   | 9.91%                         | 10.57%                           |
| New Jersey     | 349                       | 78             | 271               | 22.35%      | 13.72%                   | 12.77%                        | 13.76%                           |
| New Mexico     | 67                        | 1              | 66                | 1.49%       | 9.17%                    | 17.50%                        | 8.99%                            |
| Nevada         | 59                        | 5              | 54                | 8.47%       | 8.71%                    | 0.00%                         | 8.95%                            |
| New York       | 582                       | 117            | 465               | 20.10%      | 8.10%                    | 7.65%                         | 8.32%                            |
| Ohio           | 945                       | 77             | 868               | 8.15%       | 12.23%                   | 12.04%                        | 12.37%                           |
| Oklahoma       | 283                       | 5              | 278               | 1.77%       | 11.83%                   | 7.39%                         | 12.07%                           |
| Oregon         | 127                       | 1              | 126               | 0.79%       | 5.37%                    | 2.42%                         | 5.46%                            |
| Pennsylvania   | 655                       | 119            | 536               | 18.17%      | 14.58%                   | 13.00%                        | 14.70%                           |
| Rhode Island   | 80                        | 3              | 77                | 3.75%       | 16.58%                   | 14.31%                        | 16.72%                           |
| South Carolina | 176                       | 2              | 174               | 1.14%       | 12.47%                   | 7.34%                         | 12.47%                           |
| South Dakota   | 99                        | 4              | 95                | 4.04%       | 13.77%                   | 11.47%                        | 13.77%                           |
| Tennessee      | 301                       | 6              | 295               | 1.99%       | 12.89%                   | 17.38%*                       | 12.35%*                          |
| Texas          | 1,077                     | 16             | 1,061             | 1.49%       | 9.94%                    | 11.53%                        | 9.94%                            |
| Utah           | 72                        | 4              | 68                | 5.56%       | 5.11%                    | 4.38%                         | 5.15%                            |

(Continued)
### Table 2. (Continued)

| State         | # of private nursing homes | # of unionized | % unionized | Median mortality % (all) | Median mortality % (unionized) | Median mortality % (nonunionized) |
|---------------|-----------------|----------------|-------------|--------------------------|--------------------------------|-----------------------------------|
| Virginia      | 281             | 11             | 3.91%       | 10.54%                   | 10.95%                         | 10.47%                            |
| Vermont       | 34              | 1              | 2.94%       | 4.14%                    | 2.74%                          | 4.50%                             |
| Washington    | 193             | 15             | 7.77%       | 7.97%                    | 8.39%                          | 7.92%                             |
| Wisconsin     | 306             | 34             | 11.11%      | 9.33%                    | 11.03%                         | 9.08%                             |
| West Virginia | 121             | 10             | 8.26%       | 10.67%                   | 14.20%                         | 10.50%                            |
| Wyoming       | 22              | 0              | 0.00%       | 11.81%                   | Not applicable                 | 11.81%                            |

**Note:** The full dataset that contained 14,380 nursing homes was used.

*P < 0.10
**P < 0.05
***P < 0.01 for two-tailed nonparametric k-sample test on the equality of medians with continuity correction between unionized and nonunionized nursing homes.

Orange shade indicates higher mortality in unionized nursing homes.

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### Table 3. Comparison of nursing home characteristics, by unionization.

| Variable                  | Unionized Nursing Homes | Nonunionized Nursing Homes | Differences in Medians |
|---------------------------|-------------------------|----------------------------|------------------------|
|                           | (N = 866)               | (N = 6,643)                |                        |
|                           | 25th Percentile | Median | 75th Percentile | Standard Deviation | 25th Percentile | Median | 75th Percentile | Standard Deviation |                  |
| County population         | 130,500                  | 522,798                  | 1,200,000               | 1,600,000            | 75,783              | 305,506             | 854,757               | 1,800,000            | 217,292***         |
| County COVID-19 infection | 21.41%                  | 23.82%                   | 26.58%                  | 4.12%                 | 21.62%              | 24.09%               | 27.33%                | 4.31%                | -0.27%**           |
| Average age of residents  | 74.00                   | 78.13                    | 82.44                   | 6.13                  | 75.63               | 79.85                | 83.37                 | 5.98                 | -1.72***           |
| % Medicare residents      | 6.42%                   | 11.36%                   | 17.39%                  | 10.14%                | 6.58%               | 11.25%               | 17.46%                | 10.60%               | 0.11%              |
| % Medicaid residents      | 54.55%                  | 67.17%                   | 77.55%                  | 18.83%                | 52.38%              | 65.00%               | 75.68%                | 19.34%               | 2.17%**            |
| % white residents         | 53.75%                  | 79.34%                   | 93.27%                  | 24.58%                | 65.91%              | 86.08%               | 95.95%                | 22.18%               | -6.74%***          |
| Registered-nurse-to-bed   | 0.29                    | 0.44                     | 0.63                    | 0.27                  | 0.27                | 0.41                 | 0.59                  | 0.28                 | 0.03*              |
| ratio                    | 0.65                    | 0.82                     | 0.98                    | 0.30                  | 0.67                | 0.85                 | 1.03                  | 0.31                 | -0.03***           |
| Licensed-practical-nurse- | 1.94                    | 2.19                     | 2.52                    | 0.31                  | 1.96                | 2.25                 | 2.60                  | 0.54                 | -0.06***           |
| to-bed ratio             | 2.00                    | 3.00                     | 4.00                    | 1.39                  | 2.00                | 3.00                 | 4.00                  | 1.40                 | -0.00**            |
| 5-star quality rating     | 22.52%                  | 27.11%                   | 32.26%                  | 7.60%                 | 22.54%              | 27.40%               | 32.50%                | 7.61%                | -0.29%             |
| % obese residents         | 1.17                    | 1.23                     | 1.29                    | 0.11                  | 1.18                | 1.24                 | 1.29                  | 0.11                 | -0.01              |
| Resident acuity           | 70.58                   | 91.46                    | 120.74                  | 44.94                 | 61.14               | 81.46                | 104.91                | 39.25                | 10.00***           |
| % occupied beds           | 0.00                    | 1.00                     | 1.00                    | 0.46                  | 1.00                | 1.00                 | 1.00                  | 0.41                 | 0.00               |
| For-profit ownership      | 0.00                    | 1.00                     | 1.00                    | 0.49                  | 0.00                | 1.00                 | 1.00                  | 0.48                 | 0.00               |
| Chain organization        | 79.66%                  | 87.50%                   | 93.18%                  | 11.41%                | 76.53%              | 86.54%               | 92.59%                | 12.85%               | 0.96%***           |

**Note:** The merged dataset that contained 7,509 nursing homes was used.

*P < 0.10
**P < 0.05
***P < 0.01 for two-tailed nonparametric k-sample test on the equality of medians with continuity correction between unionized and nonunionized nursing homes.

County COVID-19 infection percentage is as of April 24, 2022.

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found robust evidence that higher average resident age, lower percentage of Medicare residents, small size, for-profit ownership, and chain organization affiliation were associated with a higher resident COVID-19 mortality percentage, consistent with prior literature on risk factors affecting nursing home COVID-19 mortality [15, 16]. Compared to the prior research that examined nursing home unionization and resident COVID-19 mortality [4, 5], our measurement of unionization has two main strengths [6, 7]. First, our definition of unionization is not based on the presence of employees who are members of a union, but based on the existence of a union contract. Without a contract in place, it is unclear that a union member employee could have any bargaining power beyond that of other employees (i.e., the ability to leave). However, once the contract is in place, the nursing home is required to meet certain demands of employees. Therefore, focusing on contracts allows us to measure when the union has real power within the nursing home to impact policies and make changes. Second, instead of a proprietary source, we used publicly available bargaining agreement data from FMCS and methodology adopted in prior literature to identify unionized nursing homes, making our analysis replicable [6].

The validity of our results is subject to measurement and reporting noises in COVID-19 mortality data. Moreover, because nursing homes are not required to file the F7 Notice if they do not sign an agreement with a labor union, nursing homes that hired workers from labor unions but did not sign contracts with the union were identified as nonunionized in this study. Furthermore, nursing homes with F7 Notices must be matched by name to nursing home COVID-19 data, creating some noise in the union measure. Also, the variation of resident COVID-19 mortality percentages across nursing homes is partially attributable to the

Table 4. Factors associated with nursing home resident COVID-19 mortality percentage, as of April 24, 2022.

| Variable                        | Estimated Coefficient |
|---------------------------------|-----------------------|
| Unionization                    | -0.0018               |
| Average age of residents        | 0.0033***             |
| % Medicare residents            | -0.0579***            |
| % Medicaid residents            | -0.0028               |
| % white residents               | 0.0361***             |
| Registered-nurse-to-bed ratio    | 0.0032                |
| Licensed-practical-nurse-to-bed ratio | -0.0088        |
| Certified-nursing-assistant-to-bed ratio | -0.0049    |
| 2-star quality rating           | 0.0067                |
| 3-star quality rating           | 0.0024                |
| 4-star quality rating           | -0.0002               |
| 5-star quality rating           | -0.0069               |
| Obese percentage                | -0.0183               |
| Resident acuity                 | 0.0011                |
| # of occupied beds              | -0.0001*              |
| For-profit ownership            | 0.0125**              |
| Chain organization affiliation  | 0.0073**              |
| Occupancy %                     | -0.0081               |
| County fixed effects            | Yes                   |
| Adjusted R²                     | 0.097                 |
| N                               | 7,509                 |

Note: The merged dataset that contained 7,509 nursing homes was used. *P < 0.10; **P < 0.05; ***P < 0.01. Ordinary Least Squares method was used, with standard errors clustered at the county level.

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variation of residents’ underlying medical conditions [17], for which the national data is unavailable. Moreover, we do not have access to data on care quality, which prevented us from understanding the care difference between unionized and nonunionized nursing homes. In addition, the trend of unionization in nursing homes is beyond the scope of this study. Finally, our regression analysis was conducted on a subsample due to the requirement of non-missing value for all control variables, and thus the results might be subject to selection biases. In sensitivity tests that dropped all control variables and imputed missing data as the mean of the non-missing sample, our results remain qualitatively unchanged.

Understanding risk factors affecting nursing home COVID-19 mortality is critical to inform policymakers, community leaders, and nursing home stakeholders aiming at improving infection control in nursing homes [3]. Numerous research has established the association between key nursing home characteristics—such as location, size, and staffing levels—and resident COVID-19 mortality [18]. Two studies to date, using proprietary unionization data inconsistent with prior research, has found an association between nursing home unionization and resident COVID-19 mortality [4, 5]. The results of this study, derived from national mortality and publicly available unionization data, provides no evidence to support a relationship between nursing home unionization and resident COVID-19 mortality.

Conclusions

As of April 24, 2022, Nursing home residents accounted for 15.4% of deaths from COVID-19 in the U.S. Using national COVID-19 mortality data as of April 24, 2022 and publicly available bargaining agreement data from FMCS, we found no evidence that nursing home resident COVID-19 mortality percentage differed between unionized nursing homes and nonunionized nursing homes. Higher average resident age, lower percentage of Medicare residents, small size, for-profit ownership, and chain organization affiliation were associated with higher resident COVID-19 mortality percentage. These findings contribute to the literature on risk factors affecting nursing home COVID-19 mortality and inform public policies aimed at infection control in nursing homes [16, 18].

Author Contributions

Conceptualization: Adam Olson, Shivaram Rajgopal, Ge Bai.

Data curation: Adam Olson.

Formal analysis: Adam Olson.

Investigation: Adam Olson, Ge Bai.

Methodology: Adam Olson, Ge Bai.

Supervision: Shivaram Rajgopal, Ge Bai.

Validation: Adam Olson.

Visualization: Adam Olson, Ge Bai.

Writing – original draft: Adam Olson, Ge Bai.

Writing – review & editing: Adam Olson, Shivaram Rajgopal, Ge Bai.

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