



# Local Area Hospice Capacity and Rural Disparities in Hospice Use among Older Adults with Metastatic Breast Cancer

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## Abstract

**Background:** Little is known about how local area hospice capacity and staffing levels impact hospice use in urban versus rural areas.

**Objectives:** To examine the association between local hospice capacity and staffing levels and hospice use in the context of rural disparities in hospice use, among a sample of patients with metastatic breast cancer.

**Design:** A retrospective cohort study using Surveillance Epidemiology End-Results (SEER)—Medicare linked data 2000–2010, Medicare Provider of Service files, and Census 2000 U.S. Zip Code Tabulation Areas files.

**Setting:** Use of Medicare-certified hospice programs among older adults with metastatic breast cancer residing in one of the SEER program cancer registries designated by National Cancer Institute in the United States.

**Measurements:** Measurements of geographic access to hospices include urban/rural characteristics of patient residence and driving time from the nearest Medicare-certified hospice headquarter. Measurements of local-area hospice capacity and staffing levels include per capita number of Medicare-certified hospice programs and full-time employees among older adults within a predefined radius.

**Results:** Among the study population ( $N=5418$ ), remote and suburban areas were negatively associated with hospice use. Lower hospice use in remote and suburban areas was associated with fewer per capita number of Medicare-certified hospice program employees in local areas  $\geq 70$ -minute driving radius ( $p=0.0042$ ), while per capita number of Medicare-certified hospice programs in local areas showed no impact.

**Conclusion:** For older patients with metastatic breast cancer, availability of hospice staff, rather than driving distance or the number of hospice agencies, may limit hospice use in remote and suburban areas.

**Keywords:** geographic access; health care workforce; health disparities; hospice capacity; hospice size; rural health

## Introduction

HOSPICE CARE is an exemplary model of expert medical care, pain and symptom management, and emotional and social support for patients with life-limiting illnesses and

their family members. In the United States between the early 2000s and 2010, there was tremendous growth in the hospice care industry, witnessed by increased access to hospice services among patients.<sup>1,2</sup> In the last decade, the sustained growth in hospice programs has been driven by for-profit

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hospice programs, while the number of nonprofit and government-funded hospice programs has slightly decreased.<sup>3</sup> Patients enrolled in hospice expanded to 1.61 million, and 51.6% of Medicare decedents used hospice in 2019.<sup>4</sup>

However, entrenched disparities in hospice use remain in rural and frontier areas.<sup>1,5-7</sup> Using National Hospice Survey data, studies on ownership, profitability, and preferred practices showed that urban locations often correlated with for-profit status and bigger sizes of hospice programs, which were shown to be associated with a number of outcomes, including differences in patient diagnosis, length of stay, and hospital utilization.<sup>8,9</sup> In addition, variation in hospice use was observed by locations of health centers within an integrated health care system among cancer patients.<sup>10</sup> This body of evolving literature suggests that factors at the practice level, such as hospice capacity and trained workforce, care coordination, and how patients, providers, and hospices interact at the local level, might contribute to barriers in access to hospice care.<sup>11</sup>

There have been scant data regarding how local-area hospice capacity and staffing levels may impact hospice use among patients across broad geographic locations of urban, suburban, rural, and remote areas. Previous studies estimated the extent of shortage of hospice and palliative care workforce based on staffing levels of existing hospice and palliative care programs.<sup>12</sup> Because staffing models in hospice and palliative care programs are separate in the United States, more in-depth and nuanced data are critical to meet patient end-of-life care needs, due to economic incentives of reimbursement, inpatient versus home-based care, patient level of dependency, staff activities and workload, and team staff mix.<sup>13</sup> Hospice staffing levels and the availability of certified hospice programs can be considered aspects of access to hospice care.

Delivering hospice care in rural and frontier areas is challenging because of long driving times, disconnected downstream communication and information dissemination, sparsely distributed health facilities, and relative isolation in these communities, which add complexities to the stretched daily schedules of health professionals and contribute to high turnover rates in the hospice care workforce.<sup>14</sup> These predisposing factors of human resources and professional networks may affect how patients and providers understand end-of-life care, gain experience in when and how to receive hospice benefits, and make goal-concordant treatment decisions.

Understanding how local area hospice capacity and staffing levels within an accessible geographic area exert an influence on hospice use among patients with potential needs for end-of-life care provides actionable opportunities to address modifiable human resource factors in reducing disparities in hospice use, particularly in less urban areas. Therefore, the hypotheses of this study are as follows: (1) a greater per capita number of hospices and hospice staff is associated with increased hospice use in localized geographical areas and (2) per capita number of hospices and hospice staff is associated with more prominent effects on increased hospice use among patients living in rural and remote areas more than their counterparts in urban areas.

Using the zip code-centered driving time to define localized areas, the purpose of this study is to examine how local

hospice capacity and staffing levels impacted hospice use in urban versus less-urban neighborhoods among a sample of older adults with metastatic breast cancer in the United States.

## Materials and Methods

This is a retrospective cohort study. We followed the STROBE reporting guidelines for observational studies.<sup>15</sup>

### Setting

The clinical setting for this study was the use of Medicare-certified hospice programs among older adults 65 years and older with metastatic breast cancer, who resided in one of the Surveillance Epidemiology End-Results (SEER) program cancer registries designated by National Cancer Institute in the United States.

### Data sources

SEER-Medicare linked data 2001–2010 were used to select study population. Data collected at National Cancer Institute SEER cancer registries, also referred to as Patient Entitlement and Diagnosis Summary File, include patient demographics, information about cancer such as date of diagnosis, cancer type, stage, histology, other tumor-related information, and mortality. Medicare Provider of Service files were used to obtain the location and the number of hospice employees for each Medicare-certified hospice. Patient zip codes and census tract-level socioeconomic variables were obtained with permission from the review committee of SEER-Medicare program for this study. The Census 2000 U.S. Gazetteer Files Zip Code Tabulation Areas file was used to obtain the number of older adult populations (65+ years old) residing at each zip code.

### Study population

Patients were selected if they were diagnosed with metastatic breast cancer for the first time between 2002 and 2009 and died between 2002 and 2010. The study population included those who were  $\geq 66$  years old at diagnosis, had continuous 12-month Medicare coverage before diagnosis to measure the comorbidities, and had continuous 24-month Medicare coverage post-diagnosis or until time of death.<sup>16,17</sup>

Patients were excluded if they were diagnosed with *in situ* stage I, II, or III, or unknown breast cancer; had an unknown month of diagnosis; had the date of death before the date of diagnosis; died on the same day of diagnosis or had a non-blank date of death from SEER and a blank date of death from Medicare claims indicating wrong documentation of death; or resided in a zip code outside the residing SEER area. Patients whose driving times were unavailable on Google Maps were also removed in the final analysis. The sample included 5418 patients.

### Outcome variable

The outcome variable was whether the patient used any hospice service after being diagnosed with metastatic breast cancer.

TABLE 1. PATIENT SOCIODEMOGRAPHIC, GEOGRAPHIC, AND COMORBID CHARACTERISTICS BY HOSPICE USE

	Hospice use	Cases of hospice use (N = 5418)	p	
<b>Characteristics</b>				
<b>Age at diagnosis, years</b>				
66–69	39.23%	357	<b>&lt;0.0001</b>	
70–74	43.02%	515		
75–79	48.72%	588		
80–84	55.12%	592		
85 or older	57.09%	588		
<b>Race and ethnicity<sup>a</sup></b>				
Asian	31.11%	42	<b>&lt;0.0001</b>	
Black	44.61%	298		
Hispanic	42.99%	95		
Non-Hispanic White	50.25%	2199		
<b>Marital status</b>				
Ever married	51.61%	1520	<b>&lt;0.0001</b>	
Married	44.05%	711		
Single	45.26%	277		
Unmarried/unknown	53.44%	132		
<b>Percentage of low-income residents above median</b>				
No	48.78%	2626	0.3001	
Yes	40.00%	14		
<b>No. of comorbidities<sup>b</sup></b>				
0	48.56%	1550	0.6816	
1	49.82%	565		
2	48.08%	525		
<b>Patient residence<sup>c</sup> characteristics</b>				
Metro ≥1M	47.25%	1435	<b>0.0049</b>	
Metro 250K–1M	51.40%	514		
Metro ≤250K	54.70%	291		
Urban, adjacent to metro >20K	43.35%	88		
Urban, not adjacent to metro >20K	45.37%	49		
Urban, adjacent to metro <20K	53.16%	143		
Urban, not adjacent to metro <20K	43.16%	82		
Rural, adjacent to metro <2500	54.76%	23		
Rural, not adjacent to metro <2500	40.54%	15		
<b>State of residence<sup>d</sup></b>				
California	43.77%	608		<b>&lt;0.0001</b>
Connecticut	42.50%	153		
Detroit	51.13%	227		
Georgia	59.12%	308		
Hawaii	34.62%	18		
Iowa	63.09%	188		
Kentucky	49.02%	200		
Louisiana	52.07%	201		
New Jersey	45.18%	502		
New Mexico	53.40%	55		
Seattle	45.93%	113		
Utah	67.00%	67		
<b>Year of diagnosis of breast cancer</b>				
2002	52.04%	344	<b>&lt;0.0001</b>	
2003	50.15%	325		
2004	53.19%	367		

(continued)

TABLE 1. (CONTINUED)

	Hospice use	Cases of hospice use (N = 5418)	p
2005	55.64%	385	
2006	51.97%	357	
2007	45.06%	315	
2008	44.99%	305	
2009	36.50%	242	

Note:  $\alpha=0.05$ . Bolded values indicate statistical significance.

<sup>a</sup>**Race:** American Indian/Alaska Native (n=12), or unknown (n=6) were not reported due to Centers for Medicare & Medicaid Services (CMS) cell size suppression policy. Asian population included Asian, Native Hawaiian, and Pacific Islander.

<sup>b</sup>**Comorbidities** measured the following chronic conditions: chronic obstruction pulmonary disease, cerebrovascular disease, congestive heart failure, diabetes, dementia, myocardial infarction, peripheral vascular disease, peptic ulcer disease, paralysis, renal disease, rheumatologic disease.

<sup>c</sup>**Rural/urban area characteristics of patient residence** was based on Area Resource File that is available in the Patient Entitlement and Diagnosis Summary Files (PEDSF) file, including counties of metro areas of 1 million population or more, counties of metro areas of 250,000–1,000,000 population, counties in metro areas of fewer than 250,000 population, counties of urban population of >20,000 population and adjacent to a metro area, counties of urban population of 2,500–19,999 and adjacent to a metro area, counties of urban population of 2,500–19,999 and not adjacent to a metro area, completely rural less than 2,500 urban population and adjacent to a metro area, and completely rural less than 2,500 population and not adjacent to a metro area.

<sup>d</sup>**State of residence** was cancer registry at the state level or regions included in the Surveillance Epidemiology End-Results (SEER) program funded by the National Cancer Institute to collect cancer statistics in the United States.

**Predictor variables**

The key independent variables included rural/urban characteristics of the patient residence, driving time from the nearest hospice headquarter to patient residence, per capita number of Medicare-certified hospice programs, and Medicare-certified hospice programs’ full-time employees (hereafter referred to as “employees”) among older adults 65+ years old located in an area surrounding the patient residence. Rural/urban continuum codes from Department of Agriculture Economic Research Service, available in the Patient Entitlement and Diagnosis Summary File, is a variable of nine categories that distinguish metropolitan counties by the population size and nonmetropolitan counties by aggregated population size and adjacency to metropolitan areas.

Driving time between zip codes of patient residence and hospice headquarters was calculated using Statistical Analytical Software (SAS) and Google Maps,<sup>18</sup> a method described in the study by Carlson et al<sup>1</sup> The total number of Medicare-certified hospice programs and their employees was computed within a predetermined driving radius surrounding the patients’ residence zip codes—that is, driving times of 25, 50, 60, 70, 80, 90, 100, 110, and 120 minutes—and then divided by the total number of older adults 65+ years old to get per capita number of Medicare-certified hospice programs and employees.

**Control variables**

Control variables included age, race, marital status, comorbidities, hormone biomarker status, diagnosis year, SEER cancer registry where patients resided, income, and education index at the census tract level. These variables were derived based on the patient utility model originated from Becker’s economic approach to human behavior.<sup>19</sup>

**Statistical analysis**

We used univariate analyses to describe the distribution of driving time, per capita number of Medicare-certified hospice programs, and per capita number of hospice employees. Chi-square statistics were used to summarize the differences in hospice use across explanatory variables. Multivariate logistic regression models were used to estimate the effects of hospice access on hospice use. The key access variables were added in a stepwise approach. Interaction terms between race and each access variable were added to explore differential effects of local area hospice capacity on hospice care choice among racial/ethnic subgroups. Odds ratios were reported with a 95% confidence interval. The threshold of statistical significance was a two-sided *p*-value of <0.05.

This study was approved by Rocky Vista University Institutional Review Board as expedited and exempt (IRB No. 2019-0020). All data analyses were conducted using SAS 9.4 (SAS Institute, Inc., Cary, NC).

**Results**

**Patient sociodemographic, geographic, and comorbid characteristics**

Among the study population of 5418 patients, 48.73% received hospice care (Table 1). The average age of those who used hospice services was 78.97 years versus 77.05 years among those who did not. Hospice use increased steadily with age, with the lowest utilization rate of 39.23% among patients between 66 and 69 years of age and the highest rate 57.09% among those 85 years of age or older. Over 41% of the patients had one or more comorbidities

before the diagnosis of metastatic breast cancer, although the number of comorbidities was not associated with hospice use.

Racial and ethnic minority groups, including Asian, Black, and Hispanic, were significantly less likely to use hospice than non-Hispanic Whites. Marital status and area poverty level were not associated with hospice use. About 88.08% of the study population lived in metropolitan or urban areas with populations of at least 20,000. Substantial variation in hospice use existed among SEER registries, with the highest utilization rate of 67.00% in Utah, almost twice the lowest rate of 34.62% in Hawai’i.

**Driving time**

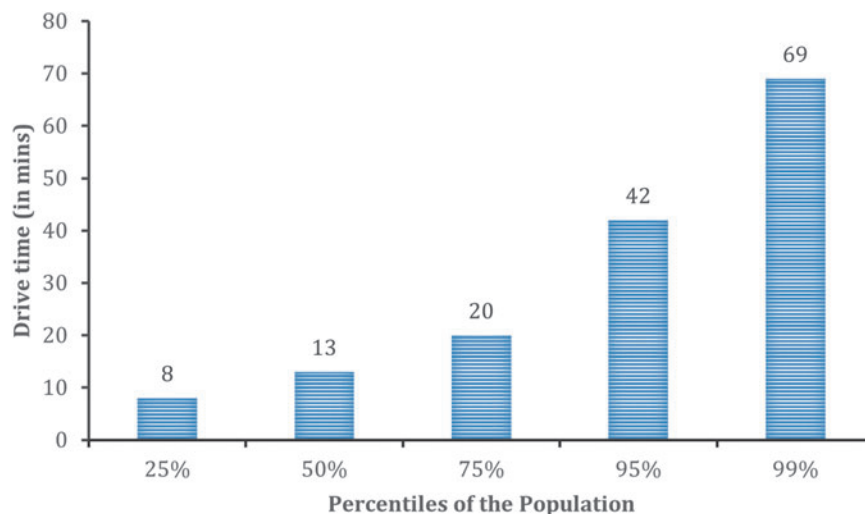
Figure 1 shows that half the study population lived within a 13-minute drive of a Medicare-certified hospice program. About 83% of patient residences were within a 25-minute drive from a nearest hospice headquarter office (data not shown). The average driving time was 16 minutes.

**Per capita number of Medicare-certified hospice programs and employees**

Figure 2 shows that up to 95% of these communities had comparable coverage in terms of per capita number of Medicare-certified hospice programs. Figure 3 shows that across these communities of different commuting time, staff availability had similar coverage for about 75% of these neighborhoods as indicated by per capita number of employees. Differences of staff availability ranged from 1.32 to 3.08 full-time employees per 1000 older adults comparing short commuting area (25 minutes) to medium (50 minutes), long (70 minutes), and extra-long commuting areas (100 minutes) at the 95th percentile (Fig. 3).

**Predictors of use of hospice services**

To assess the robustness of the results, we estimated the models based on local areas of driving time, defined as 25, 50, 60, 70, 80, 90, 100, 110, and 120 minutes. The results in Table 2 are estimates from local areas with a 70-minute



**FIG. 1.** Time from the nearest hospice headquarter to patient residence.

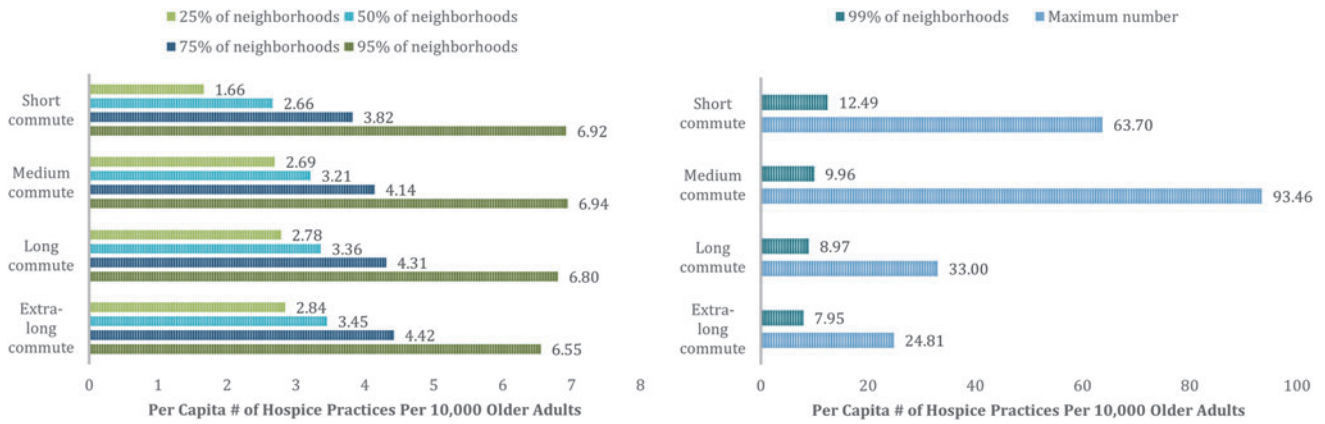


FIG. 2. Up to 95% of the neighborhoods had comparable number of Medicare-certified hospice practices.

driving time (results from local areas of 80 to 120 minutes were similar). In Model 1, with rural/urban area codes and other control variables, a statistically significant variation in hospice use was observed among areas defined by the rural/urban continuum codes.

Specifically, suburban and rural areas not adjacent to a metropolitan area had lower odds ratios of hospice use compared with metropolitan areas and areas adjacent to a metropolitan area. When adding driving time to Model 1, *F*-statistics showed that such variation among areas of different levels of rurality remained significant, while driving time was not significantly associated with hospice use at the population level. Correlation analysis showed that Pearson correlation coefficients between per capita number of Medicare-certified hospice programs and employees were 0.5320, 0.5100, and 0.3069 in 25-, 50-, and 100-mile radii, respectively.

Therefore, subsequent models included either of the two hospice access measures due to the multicollinearity. When adding per capita number of Medicare-certified hospice programs, this variable was not associated with hospice use. When adding per capita number of employees, this variable was significantly positively associated with hospice use. The parameter estimate of the variable suggested that the odds ratio of hospice use would increase by 1.024 (i.e.,  $e^{0.0239}$ ), if adding one hospice staff for every thousand older adults 65+ years old in local areas within a 70-minute drive. Moreover, the per capita number of employees was consistently posi-

tively associated with hospice use in areas of 80- to 120-minute driving time models.

Effects of interaction terms between race/ethnicity and each access variable and squared terms of each access variable were not statistically significant. In addition, *F*-statistics of hospice use among SEER registries in all models were significant, suggesting that even after controlling for urban/rural characteristics and geographic access variables, there was still substantial regional variation in hospice use.

**Discussion**

With an aging population and an increasing burden of serious illnesses, continued increase in patient needs for high-quality end-of-life care is expected. This expectation translates into an increasing demand for palliative and hospice care health professionals, which would further strain the shortage of trained professionals in this specialty area, particularly for underserved areas.

**Lower hospice use in suburban and rural areas without a neighboring metro area**

Rural residence and driving time represent conceptually different aspects of geographic barriers in access to health care.<sup>20</sup> Driving time from the nearest hospice headquarters to patient residence is a proxy measure of physical access to hospice services, indicating how far hospice-care health

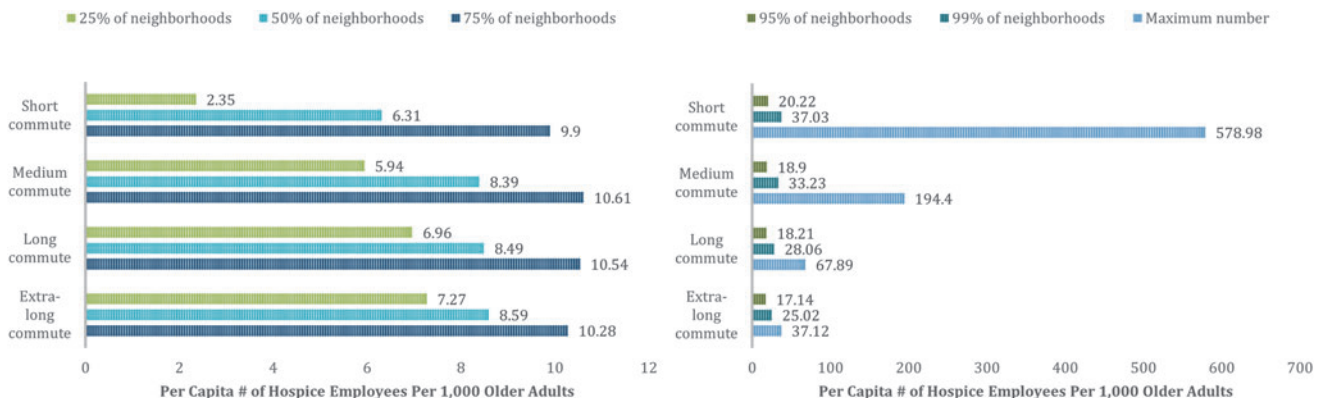


FIG. 3. Up to 75% of the neighborhoods had comparable number of Medicare-certified hospice employees.

TABLE 2. ESTIMATES OF EFFECTS OF LOCAL AREA HOSPICE CAPACITY AND RURAL/URBAN RESIDENCE ON HOSPICE USE AMONG OLDER ADULTS WITH METASTATIC BREAST CANCER

Variable	N	Model 1 <sup>a</sup>	Model 1+driving time	Model 1+driving time No. of hospice practices	Model 1+driving time No. of hospice employees
Rural/urban area characteristics	5418				
<i>p</i> Value of <i>F</i> -statistics		0.0090*	0.02*	0.0153*	0.1044
OR (95% CI)		Reference	Reference	Reference	Reference
Metro ≥1M	3037	0.971 (0.809–1.165)	0.978 (0.815–1.174)	0.979 (0.816–1.175)	1.017 (0.846–1.223)
Metro 250K–1M	1000	0.965 (0.771–1.208)	0.966 (0.771–1.210)	0.967 (0.772–1.212)	1.049 (0.831–1.323)
Metro ≤250K pop.	532	0.692 (0.500–0.958)	0.708 (0.510–0.982)	0.717 (0.516–0.995)	0.756 (0.543–1.052)
Urban, adjacent to metro >20K	203	0.766 (0.482–1.218)	0.747 (0.465–1.200)	0.751 (0.468–1.207)	0.877 (0.538–1.429)
Urban, not adjacent to metro >20K	108	0.809 (0.597–1.096)	0.832 (0.612–1.130)	0.823 (0.605–1.119)	0.903 (0.661–1.234)
Urban, adjacent to metro <20K	269	0.519 (0.363–0.741)	0.537 (0.375–0.770)	0.520 (0.360–0.751)	0.612 (0.422–0.888)
Urban, not adjacent to metro <20K	190	0.865 (0.445–1.679)	0.929 (0.472–1.827)	0.905 (0.459–1.785)	0.989 (0.503–1.947)
Rural, adjacent to metro <2500	42	0.457 (0.224–0.930)	0.470 (0.230–0.962)	0.454 (0.221–0.932)	0.545 (0.265–1.123)
Rural, not adjacent to metro <2500	37				
Driving time					
<i>p</i> Value of $\chi^2$ -statistics			0.2892	0.3501	0.3792
Parameter estimate			-0.00136	-0.00117	-0.00108
OR (95% CI)			0.999 (0.996–1.001)	0.999 (0.996–1.001)	0.999 (0.997–1.001)
Per capita number of hospices					
<i>p</i> Value of $\chi^2$ -statistics				0.3810	0.0042*
Parameter estimate				0.0203	0.0239
OR (95% CI)				1.021 (0.975–1.068)	1.024 (1.008–1.041)
Per capita number of hospice employees					
<i>p</i> Value of $\chi^2$ -statistics					0.0042*
Parameter estimate					0.0239
OR (95% CI)					1.024 (1.008–1.041)

Results were tabulated based on the local area defined as a 70-minute driving time radius. Driving time, rural/urban area characteristics, per capita number of Medicare-certified hospice programs, and per capita number of hospice employees were defined the same as in the Materials and Methods section.

Control variables in the model include patient age, race, comorbidities, marital status, census tract median household income and education level, residence SEER area, and diagnosis year.

<sup>a</sup>Model 1 includes rural/urban characteristics plus control variables.

\*Significance level at 0.05 level.

CI, confidence interval; OR, odds ratio; SEER, Surveillance Epidemiology End-Results.

professionals may need to travel to provide care at patients' homes. Different from driving time, rural residence is a proxy for factors associated with lower use of hospice services in rural areas, including both geographic factors, such as long commutes, and nongeographic factors, such as demographic, socioeconomic, cultural, and environmental variables.<sup>21</sup>

In some regions, rural communities may be close enough to metropolitan areas that rural residence captures nongeographic factors associated with lower use of hospice services. Suburban and rural areas that are not close to a metropolitan area were associated with lower hospice use. For these older adults with metastatic breast cancer, the lower hospice use was not associated with driving time. These findings suggest that lower hospice use in these areas may be attributed to lack of resources among hospice care health professionals. It is possible that lack of awareness, knowledge, and trust about hospice services among patients in these areas may also contribute to lower hospice use.

#### ***Increased hospice capacity associated with more use in local areas >70-minute drive***

Local area per capita number of employees was significantly associated with hospice use in areas with driving times of 70 minutes or longer, but the number of Medicare-certified programs was not associated with hospice use in these areas. In areas requiring a 70-minute or longer drive that did not share boundaries with metropolitan areas, more staffing was associated with higher patient volume. Previous studies suggested that larger hospice programs were more likely to admit patients with fewer restrictions, such as patients receiving chemotherapy for both curative and palliative purposes.<sup>22</sup> Many small hospices may suggest competition, but fewer larger hospices may improve access through a better array of services, such as monitoring pain and symptoms.<sup>8</sup>

Increased hospice capacity may be associated with the scale of business, with larger organizations able to admit patients with more costly needs, who then share the costs of care with a larger patient population. Increased hospice capacity may also be associated with specialization, which leads to a broader range of services that are potentially higher quality and may be more adaptable to diverse needs of the patient population.

The integrated interdisciplinary hospice care team is the foundation of individualized and holistic end-of-life care. In suburban and rural areas without neighboring metropolitan areas, there may be fewer health professionals available to collaborate with and to deliver team-based hospice care to patients' homes. More trained health professionals could operate with different expertise and offer their specific skill sets to improve patient access to preferred care. Greater numbers of trained health professionals could also amend gaps in patient care communication that are more prevalent among patients with cancer living in rural areas.<sup>23</sup>

#### ***Study limitations***

Our study has several limitations. First, the SEER-Medicare data used in the analysis were not the most recent. Medicare Provider of Services files for 2011 and 2012 were missing key data documented in a recent report on ownership changes in hospice care,<sup>24</sup> along with several updates of

SEER-Medicare data occurred during the time. Moreover, considering the COVID-19 pandemic and its impact on provider burnout, it is likely that local area hospice staffing differences have been recently exacerbated. Further study on hospice workforce is underway using more recent national data. Second, our study population focused on older adults with metastatic breast cancer and did not include other cancer types or end-stage diseases, and it therefore limits generalizability. Third, not all patients necessarily received home-based hospice care.

Our analysis used driving time between the centroids of patient residence and the nearest Medicare-certified hospice program headquarter as a proxy measure for space and time that hospice staff may need to commute to provide hospice care. Driving mileage may better represent hospice staff efforts to travel from home to home in suburban and rural areas in future studies. Finally, our study did not differentiate the profit status of hospice programs, which has been shown to be negatively associated with admission of older adults with advanced cancer.<sup>9</sup>

#### **Conclusions**

Our study suggests that more research is needed to address suburban and rural communities' needs for end-of-life care that is not adequately met by local hospice and palliative care workforce, compared to urban areas. In suburban and rural areas with fewer hospice and palliative care professionals per capita, innovative delivery strategies leveraging interprofessional teams, telehealth, and technology can be developed to amplify patient-provider/provider-provider communications and reduce barriers in access to end-of-life care among ever-aging adult populations with serious illness.<sup>25</sup>

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### Authors' Contributions

S.W. led the conceptualization of the study, data curation, formal analysis, investigation, and writing of the original draft. S.M.F. and J.S.K. provided mentorship and leadership responsibilities for the research activity. All listed authors have made substantial contributions to the interpretation and validation of data for the study. All listed authors have made substantial contributions to revising the draft critically for important intellectual content; approved the final version to be published; and agreed to be accountable for all aspects of the study in ensuring that questions related to the accuracy or integrity of any part of the study are appropriately investigated and resolved.

### Disclaimer

The ideas and opinions expressed herein are those of the author(s) and endorsement by the State of California Department of Public Health, the National Cancer Institute, and the Centers for Disease Control and Prevention or their Contractors and Subcontractors is not intended nor should be inferred.

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