

Do Hospital-Owned Skilled Nursing Facilities Provide Better Post-Acute Care Quality?

Momotazur Rahman

Brown University

Edward C. Norton

University of Michigan and NBER

David C. Grabowski

Harvard Medical School

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Corresponding author: Momotazur Rahman.

Abstract: As hospitals are increasingly held accountable for patients' post-discharge outcomes under new payment models, hospitals may choose to acquire skilled nursing facilities (SNFs) to better manage these outcomes. This raises the question of whether patients discharged to hospital-based SNFs have better outcomes. In unadjusted comparisons, hospital-based SNF patients have much lower Medicare utilization in the 180 days following discharge relative to freestanding SNF patients. However, differential selection into hospital-based and freestanding SNFs can lead to biased estimates. We solve this endogeneity problem by using differential distance from home to the nearest hospital with a SNF relative to the distance from home to the nearest hospital without a SNF as an instrument. After instrumenting for hospital-based status, we found that hospital-based SNF patients spent roughly 5 more days in the community and 6 fewer days in the SNF in the 180 days following their original hospital discharge with no significant effect on mortality or hospital readmission. Medicare spent almost \$2,900 less on a hospital-based SNF patient in the 30 days following their original hospital discharge. As health care systems and payers increasingly take on risk for Medicare hospital discharge episodes, these results provide some support for vertical integration of hospitals and SNFs.

Keywords: Hospital-based, skilled nursing facilities, Medicare

JEL Classification: I11, I18

1. Introduction

Medicare skilled nursing facility (SNF) care has been a major focus of recent policy discussions because, although they provide valuable care for many, they also serve as a substitute for both more expensive and less expensive types of care (Newhouse 2013). In the context of poor outcomes such as long SNF stays and high rates of hospital readmissions, some have questioned the underlying value of these services given their high cost to the Medicare program (Ackerly and Grabowski 2014). One factor that has potentially contributed to poor outcomes is the fragmentation in delivery between hospitals and SNFs. One recent study suggested that stronger hospital-SNF linkages, independent of common ownership, were found to reduce re-hospitalization rates (Rahman et al. 2013a). As hospitals are increasingly held accountable for patients' post-discharge outcomes under new payment models, hospitals may choose to acquire SNFs to better manage these outcomes. An open research question is whether patients who go to hospital-based SNFs have better outcomes at lower episode costs than patients who go to non-hospital-based SNFs.

The number of hospital-based SNFs has ebbed and flowed over the decades in response to policy changes. As a bit of history, hospital-based¹ SNFs were largely an afterthought in the 1970s and early 1980s when Medicare reimbursed inpatient hospital care on a cost-based basis. However, when Medicare shifted to the inpatient prospective payment system (PPS) in 1982, hospitals were paid a fixed amount per discharge and they were no longer incentivized to provide additional services or days of inpatient care. Given the payment incentive to discharge “sicker and quicker” (Sager et al. 1989), many hospitals formed their own SNFs as a potential discharge

¹ The colloquial term in the literature for hospital-owned skilled nursing facilities (SNFs) are “hospital-based” SNFs. We acknowledge that some hospital-owned SNFs are not technically based in the hospital, but given the widespread use of this term, we employ the term hospital-based in this study to encompass all SNFs owned by a hospital even if they are located outside of the hospital campus.

location. At that time, Medicare paid SNFs on a cost-based basis. Relative to freestanding SNFs, hospital-based SNFs had higher costs per day and shorter length-of-stay. Hospitals claimed this was due to a more complex case-mix, while freestanding SNFs suggested it was due to accounting practices and unnecessary staffing costs. The number of hospital-based SNFs peaked in 1998 with 2,173 facilities nationwide (or 13.83% of all SNFs). In 1998, Medicare adopted a PPS system for SNFs that imposed a uniform payment system on freestanding and hospital-based SNFs that did not recognize potential cost differences across the two settings other than those related to case-mix, area wages, and urban or rural location. Following the SNF PPS, many hospitals closed their SNFs (Rahman, Zinn, and Mor 2013b). By 2014, only about 800 SNFs (or 5% of all SNFs) in the U.S. were hospital-based.

Answering the research question of the effect of SNF ownership on outcomes and costs is complicated by selection. Clearly, whether a hospital discharges a patient to its' own SNF is not random. Prior research has suggested that good candidates for faster recovery and discharge to the community are preferentially selected into hospital-based SNFs (Stearns et al. 2006). Thus, simple comparisons of discharge outcomes across hospital-based and freestanding SNFs, controlling for observable characteristics, will not yield causal estimates of the effect of SNF hospital-based status on discharge outcomes. To address this issue, we instrument for choice of a hospital-based SNF using differential distance from the patient's home to the nearest hospital with and without a SNF. Because distance is important towards predicting hospital choice and an individual chooses where to live without regard as to whether nearby hospitals own SNFs, the identifying assumption is that the instrument will be correlated with selection of a hospital with a SNF but independent of patient-specific health issues that would determine selection. With this

instrument, we mimic randomization of residents into hospital-based SNFs when estimating the effects of hospital-based status on SNF discharge outcomes.

Using national Minimum Data Set assessments linked with Medicare claims, we study a national cohort of residents who were newly admitted to SNFs from a hospital in 2009. After instrumenting for hospital-based status, we found that hospital-based SNF patients spent 5.7 fewer days in a SNF relative to patients discharged to free-standing SNFs and 4.8 more days in the community without home health services.

2. Conceptual Framework and Related Research

2.1 Conceptual Framework

This conceptual framework provides an economic justification for why hospital-based SNFs may provide better quality of care at lower total Medicare reimbursement. It also explains why selection at hospital discharge into different types of SNFs causes an endogeneity problem. We close with the reasoning behind the choice of our instrumental variable.

The issue of whether hospital-based SNFs produce better discharge outcomes relative to freestanding SNFs is rooted in both economies of joint production and specialization. Hospitals and SNFs are assumed to minimize costs in choosing inputs to the production process to produce outputs at a given level of quality. Economies of joint production are present when there are complementarities in the inputs used for producing health care between hospitals and SNFs. Thus, if these economies are present, a hospital-based SNF can produce hospital and SNF services at a given quality-adjusted level more cheaply than a hospital and freestanding SNF each producing services at the same quality-adjusted level. Given administrative prices are held

constant across hospital-based and freestanding SNFs, we hypothesize better discharge outcomes if hospital-based SNFs can leverage economies of scope in the production of SNF services.

The second pathway through which hospital-based SNFs may affect outcomes is via specialization (Norton 2000). In most freestanding SNFs, post-acute care SNF patients constitute a relatively small proportion of total residents at any given time. The majority of nursing home residents are long-stay, chronically ill individuals covered by Medicaid. Previous research has suggested linkages in care outcomes across residents with different payer types within nursing homes (Grabowski et al. 2010; Grabowski, Gruber, and Angelelli 2008; Konetzka et al. 2006). That is, when high- and low-margin payer groups receive care alongside one another, outcomes for higher-margin patients typically decline, while outcomes for lower-margin patients typically increase. Commonality in the production of SNF outcomes would lead us to hypothesize better discharge outcomes in specialized hospital-based SNFs because—unlike most freestanding SNFs—they do not have to cross-subsidize lower-margin patients covered by Medicaid.

A third reason for better outcomes in hospital-based SNFs is related to the previous one. Given that CMS pay-for-performance programs now penalize hospitals with high readmissions rates and with high episode payments, hospitals have an incentive to raise quality of care and lower episode payments. If patients at risk of readmission are kept in a hospital-based SNF, then the hospital may have better control over that patient's outcomes, and the hospital can develop a care plan appropriate for preventing avoidable readmissions.

Finally, hospitals may use their knowledge of patients to select who to discharge to their own hospital-based SNF, not to keep the challenging patients to avoid readmission, but alternatively to keep the easy (inexpensive) patients to maximize profits. This argument predicts favorable selection into hospital-based SNFs. This is the source of endogeneity bias.

Although hospitals may influence the choice of type of SNF upon discharge, patients would be unlikely to choose hospitals primarily on the basis of whether they have a hospital-based SNF. Further reducing any direct link, we create an instrumental variable based on prior literature and the logic that while people tend to be admitted to hospitals near their home, they do not choose to purchase a home on the basis of whether it is near a hospital with a hospital-based SNF. Under that assumption, the differential distance from a patient's home to the nearest hospitals that either do or do not have a hospital-based SNF is highly predictive of type of SNF but independent of that patient's health needs.

2.2 Previous Literature

Few studies have specifically focused on the relationship between hospital-based status and quality of care, yet most SNF quality studies control for hospital-based status as a covariate in the regression model (for reviews, see Grabowski and Norton 2012; Norton 2000). A large literature has focused on the related issue of cost and case-mix differences across freestanding and hospital-based SNFs. In a review of the early pre-PPS SNF evidence, Wiener and colleagues (1986) concluded that hospital-based SNF patients were twice as costly per day as freestanding SNF patients but case-mix differences explained less than half of the cost differential. Using an endogenous switching model with data from the mid-1990s, Pizer and colleagues (2002) concluded that the entire cost differential is attributable to setting effects and case-mix selection plays a negligible role. In an analysis of 1999 data following the adoption of the SNF PPS, hospital-based SNFs were found to have higher per diem costs for nursing and non-therapy ancillary services, while freestanding SNFs had higher average costs for rehabilitation services (Liu and Black 2003).

In terms of research focusing on outcomes, Liu and Black (2003) examined unadjusted discharge outcomes. Hospital-based SNFs had lower length-of-stay (13 days versus 27 days), mortality (4% versus 7%), and hospital readmission (23% versus 28%). Whether these outcomes are related to case-mix or differences in care is impossible to tease out from this study. Rahman and colleagues (2013b) found local markets with greater closure of hospital-based SNFs between 1999 and 2006 experienced increased 30-day hospital readmissions. Stearns and colleagues (2006) used propensity stratification to compare patient outcomes across hospital-based and freestanding SNFs. The authors found that patients admitted to hospital-based SNFs had 16.7% shorter stays, a 7.7% greater likelihood of home discharge within 30 days, and 2.3% fewer preventable 30-day hospital readmissions. As the authors acknowledge about their study, “(o)ne limitation of our analysis is that unobserved selection still may explain the remaining differences in outcomes for patients of hospital-based SNFs. A natural approach to investigate this issue is to use instrumental variables (IV) models” (page 620).

3. Data and Study Sample

For this study we need detailed data on individuals, including where they resided on each day following discharge, when they died, and total Medicare reimbursement on all covered services up to 180 days post discharge. We used several sources of data in this study to obtain SNF and individual characteristics including the Minimum Data Set (MDS), Medicare claims, the Medicare denominator file, SNF provider data, zip code level population characteristics based on census 2000, and data from the American Hospital Association (AHA).

The MDS assessment forms are completed for all residents in certified SNFs upon admission and then at least quarterly thereafter. The MDS instrument has numerous data elements and includes summary measures of cognitive and physical functioning, continence,

pain, mood state, diagnoses, health conditions, mortality risk, special treatments, and medication use. Numerous reliability and validity studies reveal that most MDS items achieve an intra-class correlation of 0.6 (Abt Associates Inc. 2002; Hawes et al. 1995; Mor 2004; Mor et al. 2011; Morris et al. 1990; Phillips et al. 1997).

The Medicare Standard Analytic File includes all claims related to inpatient, skilled nursing facility care, home health, and hospice services for Medicare fee-for-service enrollees. All Part A claims (inpatient, SNF) include dates of service and up to 25 diagnoses. The Medicare enrollment file identifies individuals enrolled in Medicare within a given year and includes demographic data, survival status, residential zip code, and program eligibility information for Parts A, B and D, Medicare Advantage (managed care), and Medicaid.

The Online Survey Certification and Reporting (OSCAR) System is a compilation of data elements collected by surveyors during inspection surveys conducted at nursing facilities. Surveys are conducted at least once during every 15-month period to certify participation in the Medicare and Medicaid programs. The database includes organizational characteristics such as the number of beds, ownership, and chain membership and aggregate patient characteristics. The Area Health Resource File is a county level database assembled annually from different health care provider level data. The AHA data are a census of United States hospitals based on the AHA Annual Survey of Hospitals. The database includes different structural characteristics of hospitals. In this study, we used AHA data from the 2007 survey.

Applying the Residential History File methodology (Intrator et al. 2011), which concatenates MDS assessment and Medicare claims into individual beneficiary trajectories, we identified all Medicare fee-for-service (FFS) beneficiaries who were discharged directly from an acute general hospital to a SNF for post-acute care in 2009. We excluded patients with any SNF

residence history in one year prior to admission because they would be frailer than post-acute care patients from the community. We found 1.2 million individuals who were discharged from hospital to SNFs during the study period who did not have a prior nursing home stay. We dropped about 24 percent of the individuals who did not reside in the 48 contiguous states, were not discharged from an acute general hospital, or were missing relevant hospital or SNF identification. Our final sample consisted of 827,541 Medicare FFS beneficiaries discharged from 3,173 acute care hospitals to 14,374 SNFs.

4. Methods

4.1 Empirical specification

This paper estimates the relationship between patient outcomes (number of days in five mutually exclusive and exhaustive states, and Medicare payments) and SNF hospital-based status, controlling for patient factors and hospital referral region fixed effects.

$$Outcome_{in} = \beta_0 + \beta_1 HB_n + Patient_i \gamma + \theta_{HRR} + u_{in}$$

where $Outcome_{in}$ is the outcome for patient i discharged to nursing n . HB_n indicates whether the treating SNF n is hospital based or not. $Patient_i$ is a vector of the individual's demographic, clinical and residential zip-code characteristics. θ_{HRR} are hospital referral region fixed effects.

We expect that the coefficients on β_1 to differ for each outcome.

To determine the post-acute outcomes, we followed each patient for 30 or 180 days after their SNF admission by concatenating Medicare claims and assessment data using the residential history algorithm (Intrator et al. 2011). On any given day, an individual can be in one of the following five settings: death, hospital, SNF, home with home health care and home without home health care. We constructed five outcome variables representing the number of days in

different settings such that summation of these variables for any individual is 180. The mean number of days in different settings has been reported in Table 2. We also ran a related analysis examining the likelihood of these five outcomes on a day-by-day basis.

Of note, these five categories of outcomes show a patient's location on a given day, but they do not necessarily identify the intensity of services used by the patient on that day. As such, we also examined specific types of care use over a one-month and six-month discharge period. The 30-day outcomes align with the incentives in the CMS pay-for-performance programs, while the 180-day outcomes give a longer-run perspective. More specifically, we examined aggregated Medicare spending as well as Medicare spending on inpatient, SNF, and home health services during these time windows. As shown in Table 2, Medicare spent about \$8,000 on acute hospital care, \$14,000 on SNF care and \$2,500 on home health care in the six months following SNF admission for an average patient. These reimbursements do not necessarily correspond to the number of days in a setting because some services are paid by the patient (out-of-pocket) or by other insurers (including Medicaid). We also examined death (0/1) and any hospital readmission. 22% of the patients discharged to a SNF died within six months, while about half of all the patients experienced a hospital readmission within six months following SNF admission.

We obtained gender, race, Medicaid eligibility, date of birth, date of death and residential zip code from the Medicare enrollment file. From hospitalization claims, we derived patient clinical characteristics, including Elixhauser (Elixhauser et al. 1998) and Deyo (Deyo, Cherkin, and Ciol 1992) co-morbidity indexes, hospital length of stay, and the number of ICU days during the hospitalization. We used home health claims to construct an indicator of home health utilization before the qualifying hospital stay. Other clinical characteristics were obtained from the MDS and include indicators for common diagnoses (e.g., diabetes, serious mental illness etc.),

the number of medications taken in the last seven days, the Morris late loss ADL scale (Morris, Fries, and Morris 1999), the cognitive performance scale (Morris et al. 1994), and the resource utilization group (5.12) (Fries and Cooney 1985; Fries et al. 1994). The control variables are summarized for the full sample (see Table 3).

4.2 Instrument

The differential selection of individuals into hospital-based SNFs may reflect both demand and supply side factors. On the demand side, this selection may relate to the value that certain individuals place in receiving services from a hospital with their own SNF. In other words, patients in worse health have the most to gain from vertically integrated SNF care. On the supply side, hospitals that own their own SNF can siphon off those most desirable patients likely to benefit from SNF care. Although Medicare SNF payment is case-mix adjusted, the system uses a relatively narrow set of patient conditions in adjusting payments.

If unobserved health is similarly correlated with SNF choice and quality, the assumption underlying the linear regression model is violated. However, we can still generate a consistent estimate of the effect of hospital-based status on quality if we can identify a variable **DD** that is correlated with hospital-based status but not the error term (u_{in}) in the quality equation. Given **DD**, we can calculate an IV estimate of the effect of hospital-based status on quality.

We assume that differential distance between the nearest hospital with and without a SNF will strongly predict entry into a hospital-based SNF. That is, individuals that live closer to a hospital with a SNF are more likely to be admitted to that hospital, and then conditional on being admitted to that hospital, they are more likely receive care in a hospital-based SNF. A large health services literature establishes the importance of distance in the choice of provider (e.g., Brooks et al. 2006; Hirth et al. 2003; McClellan, McNeil, and Newhouse 1994; Rahman and

Foster 2015; Rahman et al. 2014; Tan et al. 2012). Indeed, in our study, the median distance traveled to a hospital was 11.5 kilometers (or 7.1 miles). In the study that most closely mirrors the distance-based instrument used in this study, Grabowski and colleagues (2013) found the relative proximity to nonprofit and for-profit SNFs to be a strong predictor of the type of SNF chosen. One important difference in this paper is that we use differential distance to the nearest hospital with and without a SNF (rather than the differential distance to the nearest SNFs). The use of the hospital distance is warranted in this study because we are leveraging hospitals increased likelihood of discharging to a hospital-owned SNF.

We also expect differential distance to be uncorrelated with unobserved factors that may influence outcomes. We assert that individuals choose a place of residence without regard to the proximity of hospitals with and without a SNF. This accords with common sense, and does not preclude people from making housing choices on the basis of proximity to a hospital. The relatively low rate of elderly migration supports this assumption (U.S. Census Bureau 2003). As such, we hypothesize that the differential distance measure is predetermined for potential SNF patients and unrelated to unobserved SNF outcomes. In the next section, we report a falsification test to validate this assumption. We also report mean characteristics by value of the differential distance (above or below median) in a balance table (see Table 3).

To construct a differential distance (DD) measure for SNF patients, we calculated the distance using the great circle formula from the centroid of the resident's zip code prior to hospital admission, as reported in Medicare enrollment data, to the exact geo-address of the nearest hospital with and without a SNF based on the latitude and longitude of the respective facilities. We used natural log of distance between zip code and the nearest hospital with and without SNF. The differential measure was then calculated as the natural log of distance to the

nearest hospital with a SNF minus natural log of the distance to the nearest hospital without a SNF. In other words, the measure's interpretation is how much farther the patient would have to travel to be admitted to the nearest hospital with a SNF. A negative value on this measure indicates that the nearest hospital is one with a SNF. Therefore, we expect a negative coefficient on differential distance in the first-stage results.

Our instrument is strong and valid. First, the instrument is balanced with respect to the covariates (see Table 3). Our analyses are based on comparisons of where patients lived relative to the closest hospitals with and without a SNF. Thus, we split the sample by whether the instrument was above or below the median to check for balance in the observable characteristics. Although many of the paired comparisons were statistically significantly different at the 5 percent level due to the extraordinarily large sample size, the patient characteristics were virtually identical across the two samples. The fact that none of these measured explanatory variables are correlated with the instrument makes it hard to argue that there are obvious sources of confounders that would make the instrument invalid.

Second, the instrument is a strong predictor of the endogenous variable, hospital-based SNF status, in the first stage (see Table 4). Column 1 reports the first stage where the IV is the linear differential distance i.e., distance (in kilometers) of the nearest hospital with a SNF minus the distance to the nearest hospital without a SNF. The first-stage estimates suggest that a one kilometer increase in the differential distance between then nearest hospitals with and without a SNF led to a 0.2 percentage point decrease in the likelihood of being admitted to a hospital-based SNF. The second column reports the first stage where the IV is the difference in natural log distance between the nearest hospital with and without a SNF (i.e., the natural log of the ratio of distances). We used the log version of differential distance for our main analysis because of it is

less susceptible to the influence of extreme outliers in differential distance. The t -statistic based on robust standard error is 20.06, meaning that the F -statistic is over 400. The partial R -squared is 0.057. This is after controlling for hospital referral region fixed effects, so that the prediction is based entirely on within-referral region correlations. Clearly, the instrument strongly predicts the patient's choice of a hospital-based SNF.

As a final specification check, we conducted a falsification test of our instrument, which we draw from the identification strategy of an unrelated recent study. Doyle (2011) used people treated in Florida that did not reside there (“vacationers”) as a means of addressing selection of individuals into high and low cost areas in studying the relationship between spending and health care outcomes. We borrow from this idea by examining individuals who enter a hospital far away from their primary residence. The concentration of hospitals with SNFs around their primary residence should not affect entry into a hospital-based SNF for those individuals who enter a SNF near a family member living elsewhere or get sick or need surgery while on vacation. For this sub-sample of “vacationers,” the first stage should be close to zero. If it is negative and large, then we could conclude that where individuals live relative to the nearest hospitals with and without SNFs is correlated with unmeasured quality (which would violate the assumption underlying a valid instrument).

In conducting this falsification test, we excluded individuals entering hospital less than 100 km and alternately define this vacationer sub-sample as individuals entering a hospital over 100 km (N=48,287 or 5.8% of full sample), 200 km (N=27,449 or 3.3% of full sample) or 500 km (N=17,996 or 2.2% of full sample) away from their primary residence. The results suggest a weak first-stage estimate of the DD instrument for the vacationer sub-samples (see columns 3-5 in Table 4). When we use a cutoff of 100 kilometers to define the vacationer sub-sample, the

first-stage estimate is roughly 23% as large as the result from the full sample. When we use a cutoff of 200 kilometers, the effect is about 7% as large as the full sample. When we use a cutoff of 500 kilometers, the first-stage estimate becomes statistically insignificant and it is 3.2% as large as the result from the full sample. This gradual decline in the first stage relationship suggests that we can say with some precision that this falsification check does not support the idea that an individual's place of residence relative to the nearest hospitals with and without SNFs is strongly correlated with other (unmeasured) factors that predict quality of care.

5. Results

4.1 Primary Findings

The estimates of the effect of hospital-based SNF status on the days spent in different discharge settings are presented in Table 5. Once again, we examine the first 180 days following discharge of the individual from the hospital. In the table, we present both the standard model that treats hospital-based status as exogenous (OLS model, row 2-3), and the IV model that treats hospital-based status as endogenous (row 4). We show the OLS and IV results both with HRR fixed effects. For the majority of outcomes, the results are quite different across the two models.

In the OLS model treating hospital-based status as exogenous, we obtain results similar to earlier estimates in the literature. That is, we find that hospital-based SNF patients spend 14 fewer days in a SNF over the 180 day post-discharge period and 8.8 more days in the community without home health care and 4.1 days with home health care. We find very slight increases in mortality (0.952 days) and any hospitalization (0.258 days). When we included HRR fixed effects in the OLS model, the results generally became even larger, suggesting fewer days in SNF and more days in the community. The fact that the within-HRR effects are so large is

consistent with the idea that hospitals are differentially selecting patients that are good candidates for a quick discharge into their own SNFs.

When we account for endogenous ownership in the IV models, we obtain results of a much more plausible magnitude. Specifically, patients admitted to hospital-based SNFs spend 5.7 days less in a SNF relative to patients discharged to free-standing SNFs and 4.8 days more in the community without home health services. When you put these results together, freestanding SNF patients spend relatively more time in a health care institution and less time in community in the 180 days following their original hospital discharge than hospital-based SNF patients.

Figure 2 presents the daily distribution of individuals in the study cohort as they transitioned through different locations of care following their first-time admission to hospital-based and freestanding SNFs. Differences in the likelihood of residing in a given setting emerge quickly. On any given day, free-standing SNF patients were more likely to stay in nursing homes and less likely to be discharged back to the community *without* receiving home health care, as compared to hospital-based SNF patients. We observed about six more home health care days for hospital-based SNF patients (see row 1, Table 5). According to panel D of figure 2, all these extra home health days were during the first two months following discharge.

In order to examine the distribution of discharge outcomes on a day-to-day basis, we estimated 180 daily linear probability models for each competing outcome. Ideally, we should have estimated multinomial outcome model for each day and calculated the marginal effects of admission to hospital based SNF for each competing outcome. However, the presence of the HRR fixed effect made the estimation procedure computationally very intensive. We plotted the estimated effect of admission to hospital-based SNF on competing outcomes with respect to days in Figure 3. We found differential impacts of hospital-based status over the 180-day window. For

hospital-based SNF patients, the likelihood of home health care use was higher initially while SNF use was lower. Around day 20, the difference in home health care and SNF use reached its' maximum. The fact that Medicare copayments begin at day 20 may be related to the differential utilization across freestanding and hospital-based SNFs. Discharge home was higher for hospital-based SNF patients during the first three months following discharge. Patients in hospital-based SNFs were less likely to go back to hospital in the first week following discharge and then the effect becomes statistically zero. This effect of fewer immediate bounce backs to the hospital is consistent with other studies (Rahman et al. 2013a; Rahman et al. 2013b). There no significant impact on mortality. All the effects were statistically zero after 100 days of SNF admission, implying that there was no permanent effect of treatment in hospital based SNF as we observed with the unadjusted gap in Figure 2. This figure also suggests our estimated effects are not picking up any permanent unobserved patient characteristics that are associated with hospital based SNF selection and outcomes.

We also considered the impact of being treated in a hospital-based SNF on Medicare spending in the first month and six months following hospital discharge (see Tables 6 and 7). In the unadjusted comparison, 30-day Medicare spending following discharge was \$3,432 lower for individuals discharged from a hospital-based SNF. When we controlled for the covariates and included HRR fixed effects, the difference fell to \$2,456. When we ran an IV model, the Medicare savings was \$2,882. In these IV models, we observed a small and statistically insignificant impact on mortality, suggesting the savings were not a result of censoring due to mortality. The main source of savings was lower SNF spending, with some additional savings from inpatient care and some additional spending on home health care. Comparing Table 6 with Table 7, the only savings by month six was from lower SNF payments.

4.2 Specification Checks

In order to examine the robustness of our primary model specification, we ran a series of alternate models (see Table 9). We first experimented with an alternate form of the DD instrument in which we used a linear distance instead of natural log transformed distance and a binary instrument (above/below DD median) to take account of skewed values. Patients who live in areas with no hospitals with SNFs will have large differential distance values using the linear distance instrument. On the other hand, the binary version of the DD instrument will suppress the role of large absolute values. The estimated effects using linear differential distance are much larger. However our baseline results were similar to the results generated with a binary instrument, suggesting our results are not being driven by outliers of the standard instrument.

Another potential issue is that the effects we observed might be predominantly concentrated in certain markets. When we estimated our models conditional on urban and rural markets, we found that the results for rural markets were relatively similar to the overall results. We also investigated whether the magnitude of our result varied based on the competitiveness of the local market. Using the county to approximate the market, we split the sample based on the median Herfindahl value. We found quite similar effects in both types of markets.

Another potential check on selection is to focus our results on only those individuals without a planned hospitalization. For example, a patient with a scheduled knee replacement surgery will be able to weigh potential rehabilitation options across hospitals. However, for an individual with an unplanned hospitalization, they will not be able to consider issues related to whether the hospital has their own SNF. To investigate this issue, we examined hip fracture, acute myocardial infarction (AMI), and stroke patients. The pattern of all three diagnosis results

was similar to the overall population, although both groups had even higher SNF utilization among hospital-based SNF patients.

In summary, the specification checks generally suggest our primary findings are robust, although we did observe some heterogeneity across different markets (urban/rural, more/less competitive markets).

6. Conclusion

The research question of whether hospital-based SNFs produce better outcomes at lower Medicare payments is important given recent Medicare policies that hold health care systems and payers accountable for post-hospital discharge outcomes and spending. Our conceptual framework provides economic reasons for why hospital-based SNFs may be different (and better) than freestanding SNFs. On the other hand, it also suggests that simple correlations will yield biased results due to selection. Our instrumental variable is strong and valid. The instrumental variables results then give consistent estimates of the causal effect of going to a hospital-based SNF (compared to a freestanding SNF). The 30-day results are most policy relevant while the 180-day results provide a better understanding of the long-run effects.

Our paper is suggestive of the idea that hospital-based SNFs generate some savings for Medicare over the 6-month hospital discharge period. These savings are largely achieved via lower SNF spending. As health care systems and payers increasingly take on risk for Medicare hospital discharge episodes, these results provide some support for vertical integration of hospitals and SNFs. Clearly, we must be careful in over-interpreting these results. The marginal patient in our model is someone who received treatment in a hospital-based SNF due to their prior residence being differentially closer to a hospital with a SNF. The experience of these

individuals may not generalize to the universe of SNF patients. However, at least for these patients at the margin, we do observe some potential savings via lower SNF utilization.

References

- Abt Associates Inc. 2002. "MegaQI Covariate Analysis and Recommendations: Identification and Evaluation of Existing Quality Indicators That Are Appropriate for Use in Long-Term Care Settings." Prepared by D. Kidder, M. Rennison, H. Goldberg, D. Warner, B. Bell, L. Hadden, J. Morris, R. Jones, & V. Mor, for Centers for Medicare and Medicaid Services (Contract No. 500-95-0062 TO #4).
- Ackerly, D. C. and D. C. Grabowski. 2014. "Post-acute care reform--beyond the ACA." *The New England journal of medicine* 370(8): 689-91.
- Brooks, J. M., C. P. Irwin, L. G. Hunsicker, M. J. Flanigan, E. A. Chrischilles, and J. F. Pendergast. 2006. "Effect of dialysis center profit-status on patient survival: a comparison of risk-adjustment and instrumental variable approaches." *Health Serv Res* 41(6): 2267-89.
- Deyo, R. A., D. C. Cherkin, and M. A. Ciol. 1992. "Adapting a clinical comorbidity index for use with ICD-9-CM administrative databases." *J Clin Epidemiol* 45(6): 613-9.
- Doyle, J. J. 2011. "Returns to Local-Area Healthcare Spending: Evidence from Health Shocks to Patients Far From Home." *American Economic Journal: Applied Economics* 3(3): 221-43.
- Elixhauser, A., C. Steiner, D. R. Harris, and R. M. Coffey. 1998. "Comorbidity measures for use with administrative data." *Med Care* 36(1): 8-27.
- Fries, B. E. and L. M. Cooney, Jr. 1985. "Resource utilization groups. A patient classification system for long-term care." *Med Care* 23(2): 110-22.
- Fries, B. E., D. P. Schneider, W. J. Foley, M. Gavazzi, R. Burke, and E. Cornelius. 1994. "Refining a case-mix measure for nursing homes: Resource Utilization Groups (RUG-III)." *Med Care* 32(7): 668-85.

- Grabowski, D. C., Z. Feng, R. Hirth, M. Rahman, and V. Mor. 2013. "Effect of nursing home ownership on the quality of post-acute care: an instrumental variables approach." *J Health Econ* 32(1): 12-21.
- Grabowski, D. C., Z. Feng, O. Intrator, and V. Mor. 2010. "Medicaid bed-hold policy and Medicare skilled nursing facility rehospitalizations." *Health Services Research* 45(6 Pt 2): 1963-80.
- Grabowski, D. C., J. Gruber, and J. J. Angelelli. 2008. "Nursing Home Quality as a Common Good." *Review of Economics and Statistics* 90(4): 754-64.
- Grabowski, D. C. and E. C. Norton. 2012. "Nursing Home Quality of Care." In *The Elgar Companion to Health Economics, Second Edition*, edited by A. M. Jones, pp. 307-17. Cheltenham, UK: Edward Elgar Publishing, Inc.
- Hawes, C., J. N. Morris, C. D. Phillips, V. Mor, B. E. Fries, and S. Nonemaker. 1995. "Reliability estimates for the Minimum Data Set for nursing home resident assessment and care screening (MDS)." *Gerontologist* 35(2): 172-8.
- Hirth, R. A., M. E. Chernew, M. N. Turenne, M. V. Pauly, S. M. Orzol, and P. J. Held. 2003. "Chronic illness, treatment choice and workforce participation." *Int J Health Care Finance Econ* 3(3): 167-81.
- Intrator, O., J. Hiris, K. Berg, S. C. Miller, and V. Mor. 2011. "The residential history file: studying nursing home residents' long-term care histories(*)." *Health Serv Res* 46(1 Pt 1): 120-37.
- Konetzka, R. T., E. C. Norton, P. D. Sloane, K. E. Kilpatrick, and S. C. Stearns. 2006. "Medicare prospective payment and quality of care for long-stay nursing facility residents." *Medical Care* 44(3): 270-6.

Liu, K. and K. J. Black. 2003. "Hospital-based and freestanding skilled nursing facilities: any cause for differential Medicare payments?" *Inquiry : a journal of medical care organization, provision and financing* 40(1): 94-104.

McClellan, M., B. J. McNeil, and J. P. Newhouse. 1994. "Does more intensive treatment of acute myocardial infarction in the elderly reduce mortality? Analysis using instrumental variables." *Jama* 272(11): 859-66.

Mor, V. 2004. "A comprehensive clinical assessment tool to inform policy and practice: applications of the minimum data set." *Medical care* 42(4 Suppl): III50-9.

Mor, V., O. Intrator, M. A. Unruh, and S. Cai. 2011. "Temporal and Geographic variation in the validity and internal consistency of the Nursing Home Resident Assessment Minimum Data Set 2.0." *BMC health services research* 11: 78.

Morris, J. N., B. E. Fries, D. R. Mehr, C. Hawes, C. Phillips, V. Mor, and L. A. Lipsitz. 1994. "MDS Cognitive Performance Scale." *J Gerontol* 49(4): M174-82.

Morris, J. N., B. E. Fries, and S. A. Morris. 1999. "Scaling ADLs within the MDS." *J Gerontol A Biol Sci Med Sci* 54(11): M546-53.

Morris, J. N., C. Hawes, B. E. Fries, C. D. Phillips, V. Mor, S. Katz, K. Murphy, M. L. Drugovich, and A. S. Friedlob. 1990. "Designing the national resident assessment instrument for nursing homes." *Gerontologist* 30(3): 293-307.

Newhouse, J. P. G., A.;Graham,R.P.;McCoy,M.A.;Mancher,M;Kibria,A (Editors). 2013. "Interim Report of the Committee on Geographic Variation in Health Care Spending and Promotion of High-Value Health Care: Preliminary Committee Observations." Washington,D.C.: The National Academies Press.

- Norton, E. C. 2000. "Long-Term Care." In *Handbook of health Economics*, edited by A. J. Culyer and J. P. Newhouse, pp. 955-94. Amsterdam: Elsevier Science, North-Holland.
- Norton, E. C. and D. O. Staiger. 1994. "How Hospital Ownership Affects Access to Care of the Uninsured." *Rand Journal of Economics* 25(1): 171-85.
- Phillips, C. D., J. N. Morris, C. Hawes, B. E. Fries, V. Mor, M. Nennstiel, and V. Iannacchione. 1997. "Association of the Resident Assessment Instrument (RAI) with changes in function, cognition, and psychosocial status." *J Am Geriatr Soc* 45(8): 986-93.
- Pizer, S. D., A. J. White, and C. White. 2002. "Why are hospital-based nursing homes so costly? Relative importance of acuity and treatment setting." *Medical Care* 40(5): 405-15.
- Rahman, M. and A. D. Foster. 2015. "Racial segregation and quality of care disparity in US nursing homes." *J Health Econ* 39: 1-16.
- Rahman, M., A. D. Foster, D. C. Grabowski, J. S. Zinn, and V. Mor. 2013a. "Effect of hospital-SNF referral linkages on rehospitalization." *Health Services Research* 48(6 Pt 1): 1898-919.
- Rahman, M., D. C. Grabowski, P. L. Gozalo, K. S. Thomas, and V. Mor. 2014. "Are dual eligibles admitted to poorer quality skilled nursing facilities?" *Health Serv Res* 49(3): 798-817.
- Rahman, M., J. S. Zinn, and V. Mor. 2013b. "The impact of hospital-based skilled nursing facility closures on rehospitalizations." *Health Serv Res* 48(2 Pt 1): 499-518.
- Sager, M. A., D. V. Easterling, D. A. Kindig, and O. W. Anderson. 1989. "Changes in the location of death after passage of Medicare's prospective payment system. A national study." *N Engl J Med* 320(7): 433-9.
- Stearns, S. C., K. Dalton, G. M. Holmes, and S. M. Seagrave. 2006. "Using propensity stratification to compare patient outcomes in hospital-based versus freestanding skilled-nursing facilities." *Med Care Res Rev* 63(5): 599-622.

Tan, H. J., E. C. Norton, Z. Ye, K. S. Hafez, J. L. Gore, and D. C. Miller. 2012. "Long-term survival following partial vs radical nephrectomy among older patients with early-stage kidney cancer." *JAMA* 307(15): 1629-35.

U.S. Census Bureau. 2003. "Internal Migration of the Older Population: 1995-2000." *Census 2000 Special Reports*. U.S. Department of Commerce.

Wiener, J., K. Liu, and G. Schieber. 1986. "Case-mix differences between hospital-based and freestanding skilled nursing facilities. A review of the evidence." *Medical Care* 24(12): 1173-82.

Table 1: Characteristics of skilled nursing facilities (SNFs)

	Freestanding N=14,626		Hospital-based N=1,124	
	Mean	SD	Mean	SD
Total beds in SNF	109.57	60.23	61.45	82.06
Facility is part of a chain	0.56	0.50	0.32	0.47
Facility is run for-profit	0.72	0.45	0.12	0.32
Located in urban county	0.70	0.46	0.51	0.50
Percent occupancy	83.45	15.08	77.96	21.18
Total registered nurse hours/day/resident	0.38	0.69	1.68	2.22
Total licensed practical nurse hours/day/resident	0.87	0.90	1.38	1.67
Total certified nurse aide hours/day/resident	2.23	1.24	3.30	2.63
Admissions black (%)	10.36	17.38	7.56	14.04
Annual admissions/bed (#)	1.77	1.68	8.20	9.95
Proportion of SNF days per total nursing home days	17.74	14.88	40.00	40.13
Average case mix index at admission to SNF	1.05	0.11	1.07	0.16
Average ADL score on admission (0-28)	16.18	3.00	15.31	3.59
Residents physically restrained (%)	3.77	6.19	2.56	7.17
Residents receiving antipsychotics (%)	26.85	14.70	15.93	15.44
Non-psychotic residents receiving antipsychotics (%)	19.76	9.31	13.27	13.20
Weighted deficiency score, all deficiencies	80.34	81.64	59.20	53.37
PPNH Hospitalizations per resident/year/SNF (%)	0.31	0.18	0.43	0.40

Notes: ADL = activities of daily living; PPNH = potentially preventable nursing home

Table 2: Summary of (N=827,513)

	Mean	Std. Dev.
Days in different setting in the 180 days following hospital discharge		
Death (# of days)	25.19	52.79
Hospital (# of days)	8.29	18.02
Skilled nursing facility (# of days)	51.01	52.00
Community with home health care (# of days)	28.44	38.47
Community (# of days)	67.06	63.85
Accumulated outcomes in first 30 days following discharge		
Reimbursement for Inpatient hospital care (\$)	2,256	6,327
Reimbursement for SNF care (\$)	9,160	4,438
Reimbursement for Home health care (\$)	415	781
Total reimbursement (\$)	11,903	6,815
Death	0.071	0.257
Any hospital readmission	0.201	0.401
Accumulated outcomes in first 180 days following discharge		
Reimbursement for Inpatient hospital care (\$)	8,214	16,978
Reimbursement for SNF care (\$)	14,413	10,673
Reimbursement for Home health care (\$)	2,545	3,299
Total reimbursement (\$)	25,790	22,151
Death	0.220	0.414
Any hospital readmission	0.446	0.497

Table 3: Person-level characteristics by differential distance (DD) between nearest hospital with SNF and nearest without SNF (N=827,513)

N	All 827,541		IV below the HRR level Median 392,400		IV above the HRR level Median 435,141	
	Mean	SD	Mean	SD	Mean	SD
Main explanatory variable						
Hospital-based status	0.12	0.33	0.17	0.38	0.07	0.26
Patient's demographic characteristics						
Age	81.34	7.86	81.18	7.87	81.49	7.85
Female	0.66	0.48	0.65	0.48	0.66	0.47
Black	0.07	0.26	0.08	0.26	0.07	0.25
Other race	0.03	0.17	0.03	0.17	0.03	0.18
Dual eligible on the month of admission	0.19	0.39	0.19	0.39	0.19	0.39
Married	0.35	0.48	0.35	0.48	0.34	0.47
Patient's Clinical characteristics						
Length of stay of index hospitalization	7.78	5.92	7.82	5.93	7.74	5.91
Number of days with home health use in 30 days before SNF admission	2.58	6.69	2.53	6.64	2.62	6.74
Deyo index greater than 2	0.43	0.50	0.43	0.50	0.43	0.49
Elexhauser index greater than 2	0.51	0.50	0.51	0.50	0.51	0.50
ICU days in index hospitalization	2.22	4.77	2.22	4.78	2.22	4.77
Diabetes	0.30	0.46	0.30	0.46	0.30	0.46
Congestive heart failure	0.21	0.41	0.21	0.41	0.21	0.41
Hip fracture	0.09	0.28	0.09	0.28	0.09	0.28
Cerebrovascular Disease	0.11	0.31	0.11	0.31	0.11	0.31
Bipolar disorder	0.01	0.09	0.01	0.09	0.01	0.10
Schizophrenia	0.01	0.07	0.01	0.07	0.01	0.07
Chronic Obstructive Pulmonary Disease	0.20	0.40	0.20	0.40	0.20	0.40
Number of medications taken in last seven days	12.17	4.83	12.25	4.87	12.10	4.78
Morris additive Activity of Daily Living (ADL) score	16.54	5.31	16.49	5.35	16.58	5.28
Fries/Morris cognitive performance scale (CPS)	1.29	1.53	1.28	1.54	1.30	1.53
CHES	1.55	1.03	1.54	1.02	1.56	1.03
Resource Utilization Group III	6.06	1.83	6.02	1.85	6.10	1.81
Instrumental variable						
Differential distance (ln of nearest hospital w SNF minus ln of nearest hospital w/out SNF)	0.95	1.45	0.00	1.20	1.81	1.08

Table 4: First-stage results, regression of a hospital with a skilled nursing facility (SNF) on differential distance

	All	All	Entered hospital 100km+	Entered hospital 200km+	Entered hospital 500km+
Differential Distance (natural log of nearest hospital w/ SNF – natural log of nearest w/out)		-0.0579***	-0.0135***	-0.0044***	-0.00184
Differential Distance (nearest hospital w/ SNF – nearest w/out)	-.0017***				
<i>t</i> -statistics	8.78	20.06	6.77	3.31	1.21
<i>F</i> -statistics	77.01	402.40	45.87	10.98	1.47
Partial <i>R</i> -squared	0.031	0.057			
Observations	826,485	826,485	48,287	27,449	17,996
<i>R</i> -squared	0.0927	0.104	0.041	0.037	0.035

Note: All the regressions include patients and residential zip-code level explanatory variables listed in table 3 and hospital referral region (HRR) fixed effects. Test statistics are based on robust standard error.

Table 5: Effects of being treated in a hospital-based skilled nursing facility (SNF) on the number of days in different settings in the 180 days following SNF admission (N=827,513)

	Number of days				
	Death	Hospital	SNF	Community with home health care	Community
Unadjusted difference	-5.658*** [0.178]	-0.0896 [0.0608]	-21.93*** [0.174]	5.926*** [0.130]	21.75*** [0.214]
Adjusted difference	0.951*** [0.169]	0.257*** [0.0614]	-14.12*** [0.167]	4.131*** [0.129]	8.781*** [0.184]
Adjusted difference with HRR fixed effects	0.553*** [0.181]	0.469*** [0.0656]	-16.91*** [0.177]	5.038*** [0.136]	10.85*** [0.195]
IV with HRR fixed effects	0.853 [0.760]	-0.607** [0.276]	-5.711*** [0.748]	0.704 [0.574]	4.761*** [0.819]

Note: Regressions reported in last three rows include patients and residential zip-code level explanatory variables listed in table 3. Standard errors are reported in square brackets and are based on robust standard error.

Table 6: Estimated effect of being treated in a hospital-based skilled nursing facility (SNF) on Medicare spending, mortality, and hospital readmission in 30 days following hospital discharge (N=827,513)

	Reimbursement (\$)				Any Death	Any hospital readmission
	Inpatient hospital	SNF	Home health	total		
Unadjusted difference	-74.82*** [21.36]	-3,765*** [14.40]	421.1*** [2.596]	-3,432*** [22.70]	-0.0159*** [0.000867]	-0.0154*** [0.00135]
Adjusted difference	-90.75*** [21.32]	-2,826*** [13.34]	345.0*** [2.555]	-2,566*** [22.03]	0.00609*** [0.000854]	-0.0179*** [0.00134]
Adjusted difference with HRR fixed effects	-56.50** [22.79]	-2,790*** [13.91]	373.5*** [2.703]	-2,456*** [23.25]	0.00491*** [0.000913]	-0.0152*** [0.00144]
IV with HRR fixed effects	-224.9** [95.89]	-2,871*** [58.55]	222.7*** [11.40]	-2,882*** [97.85]	0.00679* [0.00384]	-0.0339*** [0.00597]

Note: Regressions reported in last three rows include patients and residential zip-code level explanatory variables listed in table 3. Standard errors are reported in square brackets and are based on robust standard error.

Table 7: Estimated effect of being treated in a hospital-based skilled nursing facility (SNF) on Medicare spending, mortality, and hospital readmission in six months following hospital discharge (N=827,513)

	Medicare spending (\$)				Any Death	Any hospital readmission
	Inpatient hospital	SNF	Home health	total		
Unadjusted difference	-337.0*** [57.32]	-6,336*** [35.35]	332.4*** [11.13]	-6,520*** [74.44]	-0.0480*** [0.00140]	-0.0276*** [0.00168]
Adjusted difference	-331.3*** [56.90]	-4,440*** [33.98]	270.6*** [11.09]	-4,528*** [72.73]	0.0046*** [0.00133]	-0.0266*** [0.00167]
Adjusted difference with HRR fixed effects	-326.6*** [60.72]	-4,677*** [35.89]	413.8*** [11.70]	-4,550*** [77.23]	0.00127 [0.00142]	-0.0271*** [0.00178]
IV with HRR fixed effects	-42.99 [255.4]	-3,858*** [151.0]	-56.57 [49.26]	-4,196*** [324.9]	0.00268 [0.00597]	-0.0404*** [0.00751]

Note: Regressions reported in last three rows include patients and residential zip-code level explanatory variables listed in table 3. Standard errors are reported in square brackets and are based on robust standard errors.

Table 8: Specification checks (N=827,513 unless otherwise noted)

	Number of days in a given setting				
	Death	Hospital	SNF	HHA	Home
Baseline model	0.853 [0.760]	-0.607** [0.276]	-5.711*** [0.748]	0.704 [0.574]	4.761*** [0.819]
Linear differential distance	-2.445** [1.045]	-1.371*** [0.404]	-6.207*** [0.983]	2.535*** [0.780]	7.488*** [1.137]
Binary DD measure (above/below) median	-0.174 [1.080]	-0.708* [0.387]	-7.111*** [1.068]	1.255 [0.810]	6.738*** [1.165]
Urban SNFs only (N= 690,991)	2.166* [1.221]	-1.122** [0.454]	-2.900** [1.195]	0.231 [0.927]	1.625 [1.328]
Rural SNFs only (N= 136,010)	-1.02 [1.195]	0.246 [0.395]	-10.15*** [1.256]	3.750*** [0.897]	7.170*** [1.262]
High competition markets (N= 768,508)	0.737 [0.882]	-0.570* [0.318]	-5.134*** [0.874]	0.57 [0.667]	4.396*** [0.957]
Low competition markets (N= 58,493)	0.303 [2.354]	-0.701 [0.845]	-5.731** [2.483]	2.906 [1.792]	3.223 [2.441]
Hip fracture patients (N=69,352)	-1.375 [2.397]	-2.523*** [0.937]	-7.158*** [2.740]	4.399** [2.040]	6.656** [2.743]
Acute myocardial infarction patients (N=19,068)	3.346 [6.892]	-1.755 [2.196]	-2.803 [5.944]	-2.966 [4.549]	4.178 [6.562]
Stroke patients (N=27,397)	2.418 [4.245]	1.473 [1.362]	-10.49** [4.660]	-0.286 [2.950]	6.881* [3.896]

Note: All the regressions include patients and residential zip-code level explanatory variables listed in table 3 and hospital referral region (HRR) fixed effects. Standard errors are based on robust standard error.

Figure 1: Fraction of skilled nursing facility (SNF) patients in state who were treated in a hospital that owned a SNF

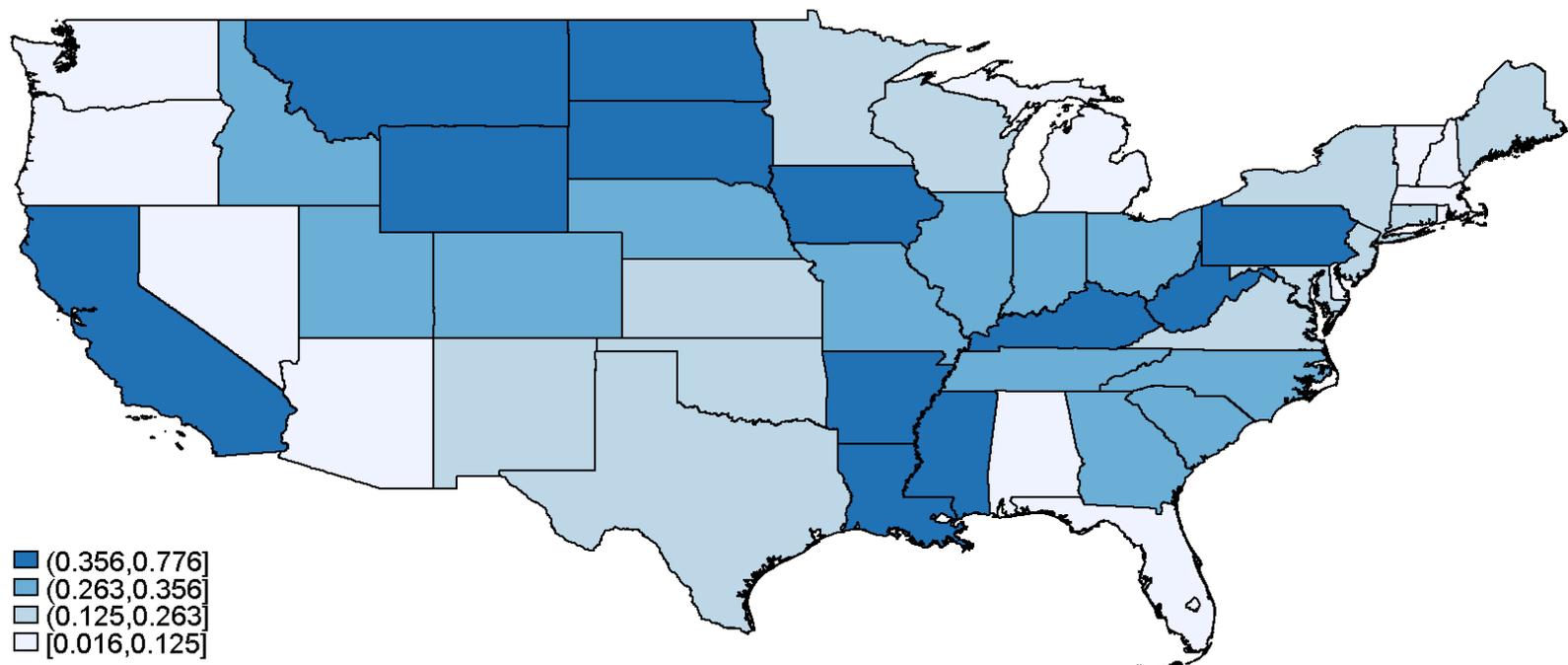


Figure 2: Fraction of patients in a given setting in days following hospital discharge

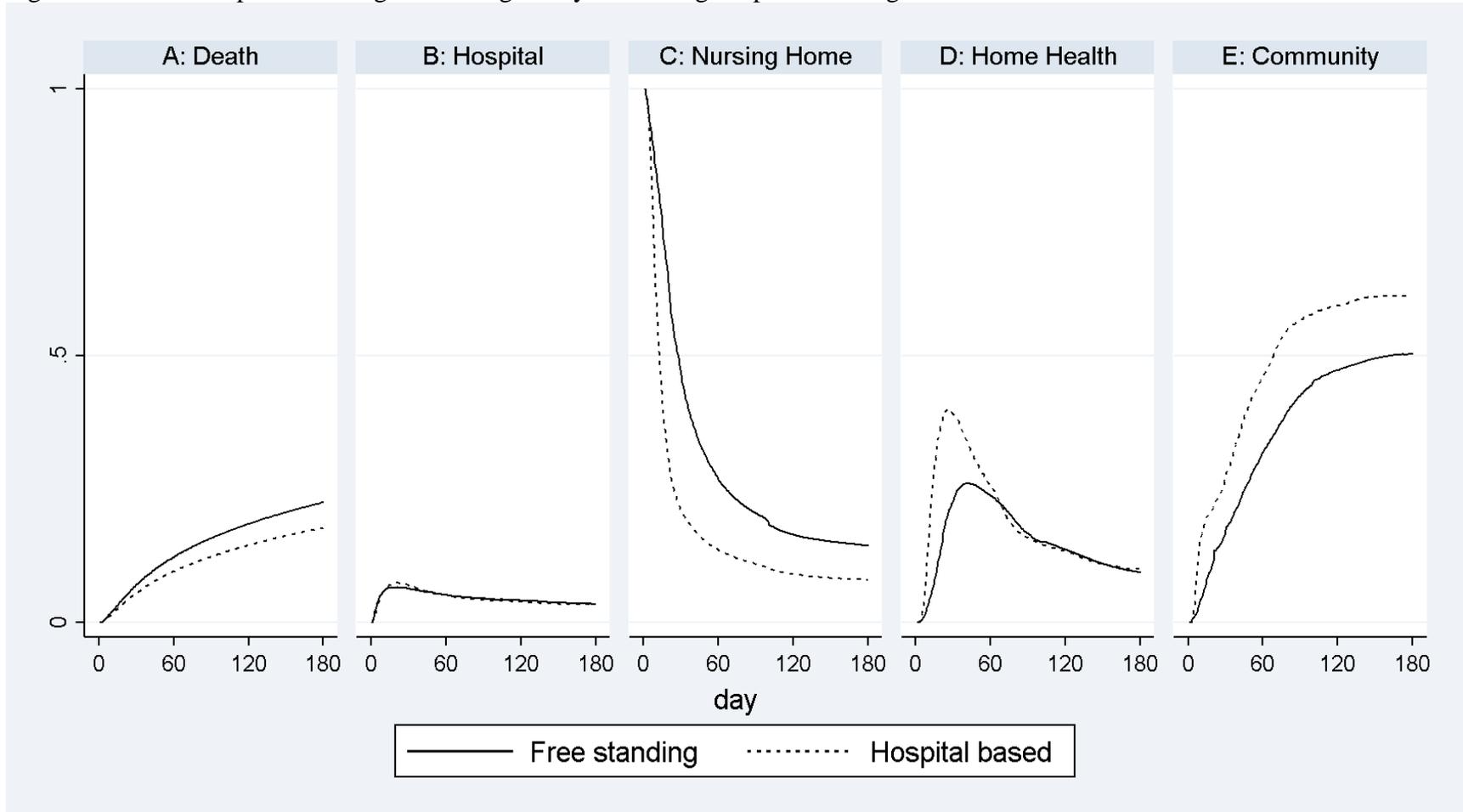


Figure 3: Instrumented impact of being discharged to hospital-based skilled nursing facility

