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COMPETITION AND QUALITY IN HOME HEALTH CARE MARKETS†

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SUMMARY

Market-based solutions are often proposed to improve health care quality; yet evidence on the role of competition in quality in non-hospital settings is sparse. We examine the relationship between competition and quality in home health care. This market is different from other markets in that service delivery takes place in patients' homes, which implies low costs of market entry and exit for agencies. We use 6 years of panel data for Medicare beneficiaries during the early 2000s. We identify the competition effect from within-market variation in competition over time. We analyze three quality measures: functional improvements, the number of home health visits, and discharges without hospitalization. We find that the relationship between competition and home health quality is nonlinear and its pattern differs by quality measure. Competition has positive effects on functional improvements and the number of visits in most ranges, but in the most competitive markets, functional outcomes and the number of visits slightly drop. Competition has a negative effect on discharges without hospitalization that is strongest in the most competitive markets. This finding is different from prior research on hospital markets and suggests that market-specific environments should be considered in developing policies to promote competition.

Keywords

competition; quality of care; home health care markets

1. INTRODUCTION

Deficiencies in quality of health care (Kohn *et al.*, 1999; Institute of Medicine, 2001; McGlynn *et al.*, 2003) suggest opportunities to improve quality exist throughout the health care system. Yet agreement on an effective approach is elusive which at its core can be traced to the debate over the extent to which policy should rely on market-based solutions.

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CONFLICT OF INTEREST

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Extending the evidence on the role of market competition in enhancing quality can help inform this debate.

Economic theory suggests that competition can enhance quality in markets with regulated prices because providers will compete for patients by improving quality (Gaynor, 2006). Results from recent empirical studies in hospital markets appear to support this prediction, but the evidence for other markets is sparse. The reliance on market mechanisms to improve quality increases as quality reporting and pay-for-performance (P4P) programs are adopted in diverse settings; yet the role of the market in non-hospital settings remains unexamined.

We examine the relationship between competition and quality in home health care for Medicare beneficiaries.¹ Home health care, which represents about 4% of Medicare expenditure, is a growing source of post-acute care for the elderly in US (Kaiser Family Foundation, 2009).² Prior literature suggests that the relationship between competition and quality in post-acute care settings may be different from other markets because imperfect information of patients about provider quality is particularly severe (Hirth, 1999; Chou, 2002). If patients have difficulty in assessing quality, providers will not invest in quality (Akerlof, 1970), suggesting that the role of market in improving quality may be limited. Home health care markets further deviate from other markets because service delivery takes place in patients' homes. This unique feature reduces the fixed costs of market entry for home health agencies and it reduces the market power of facility location. With these lower barriers to competition, market competition may have a stronger effect on quality than that in hospital markets. Yet low fixed costs also reduce friction for market exit; therefore, when facing competition, marginal home health agencies may choose to exit rather than invest in quality.

We estimate the effect of competition on home health quality using 6 years of panel data during the early 2000s. Because this was a period of expansion in the number of agencies, we identify the competition effect from the over-time change within a market using market fixed effects. Further, because some states have applied Certificate of Need (CON) laws that restrict market entries of providers to home health care, we conduct separate analysis by CON status of states and explore the role of easy exits in the relationship between competition and quality in markets where entries are relatively regulated.

2. BACKGROUND

The theoretical relationship between competition and quality is complex and has long been discussed in the literature. Gaynor (2006), in his review of the economic literature on the topic, concludes that theoretical predictions about the effect of competition on quality are ambiguous when providers set market prices but competition enhances quality in markets with administratively set prices. The idea is that if price is regulated, providers will compete over a different dimension than price (i.e., quality) to attract consumers, and if the regulated

¹Agencies may have other revenue sources but we focus on Medicare patients because Medicare is the major revenue source (National Center for Health Statistics, 2007).

²Medicare covers home health services used for rehabilitation or recovery during a limited time period. Another type of care includes non-medical and home-making services, which require long-term attention. These services are not covered by Medicare without concurrent prescriptions of skilled nursing services.

price is set above marginal cost, providers will increase quality until profit is zero. Several empirical studies examining Medicare hospital markets where prices are prospectively set based on patients' diagnoses have reported that competition improves quality (Kessler and McClellan, 2000; Tay, 2003; Shen, 2003; Kessler and Geppert, 2005).

The price of Medicare home health care is also set administratively. Medicare prospectively pays agencies for a 60-day episode of care after adjusting for patients' expected costs. While this price-setting mechanism is similar to that in hospital markets, competition may have different effects. As noted earlier, market entry does not incur large fixed costs in home health care. Thus, agencies can enter profitable markets with little up-front expenses. Thus when the market becomes competitive and profit declines, exit is more attractive to agencies than investing in quality, compared to sectors where high financial losses accompany exit. In fact, observers of this market have noted that the home health care industry comprises small and incompetent agencies that do not have the technical capacity to survive or adjust to market environments (Bishop *et al.*, 1999). If this effect dominates, the theoretical relationship between competition and quality under regulated price could be reversed.

In addition, although it is assumed in the Gaynor (2006) model that consumers choose providers based on quality, little is known about the demand responsiveness to quality in home health care. As described earlier, prior literature indicates that consumers' uncertainty about service quality is likely to be severe in post-acute settings (Hirth, 1999; Chou, 2002). If this is the case, even under competition, agencies may underinvest in quality or they may focus only on quality measures that are easily assessable by patients. Given these theoretical ambiguities, our objective is to empirically explore the relationship between competition and home health quality.

Addressing the issue of home health quality is important as demand for home health care is expected to continue to grow given technology advancement expanding the type of home health services (Levine *et al.*, 2003; Han *et al.*, 2007) and given that home health care is viewed as a cost-effective alternative to facility-based care (Chen *et al.*, 2000; Konetzka *et al.*, 2008). Recent quality initiatives by the Center for Medicare and Medicare Services in home health care include market-based approaches, such as public reporting and P4P programs. Since the success of these programs depends on well-functioning markets, it is important to assess the implications of competition on home health quality.

We exploit variation across two domains to identify the effect of competition. First, we use variation in competition over time. Home health care markets have shown fluctuations in agency supply given the ease of entry and exit. Between 1980 and 1990, more than 5,700 agencies entered the Medicare home health market whereas about 2,800 agencies exited the market (Scalzi *et al.*, 1994). The number of Medicare-participating agencies was 10,927 in 1997 but dropped to 7,057 in 2002 and increased to 8,955 in 2006 (MedPAC, 2008). This latest expansion may partially result from the introduction of the Prospective Payment System (PPS) for Medicare home health care in 2000. During the post-PPS period (2002–2005), agency margins averaged about 16% (MedPAC, 2008).

Second, we exploit state variation in regulations to control agency entry through CON laws³ that impose restrictions on capital investment by providers (e.g., the construction of new facilities or purchasing of expensive technology) to contain costs (MHCC, 2001). However, because home health care is a labor-intensive industry, CON operates as a mechanism to restrict entry of new agencies. We therefore hypothesize that the quality disincentive of exit will predominate in markets in CON states.

3. EMPIRICAL MODEL

Our empirical model is based on Gaynor (2006) that specifies a firm's quality choice at equilibrium (Q^*) in markets with regulated prices as follows:

$$Q^* = f(\bar{P}, C(Q^*), D(Q^*), MS(Q^*)) \quad (1)$$

where \bar{P} is the service price, which is set administratively. C is marginal cost, D is market demand at Q^* , and MS is the firm's market share. Price, market demand, and the firm's market share have positive relationships with quality, whereas marginal cost has a negative relationship with quality.

Equation (1) indicates that cost, market demand, and market share are in turn a function of quality. This endogeneity leads us to take a reduced-form approach with exogenous determinants of marginal cost, demand, and a measure of market competition as follows:

$$QUAL_{ijmt} = \alpha + \beta CPT_{mt} + \gamma COST_{ijmt} + \delta DMD_{ijmt} + T_t + \varepsilon_{ijmt} \quad (2)$$

where $QUAL_{ijmt}$ is quality of the i th episode of the j th agency in the m th market in year t . CPT_{mt} is the level of competition in the m th market in year t . $COST_{ijmt}$ and DMD_{ijmt} represent a vector of cost and demand shifters, respectively. Time dummies (T_t) capture year-specific effects.

Several concerns arise from this reduced-form equation. First, some variables that are correlated with both competition and quality are likely to be unobserved, such as health care utilization patterns. Patients in competitive markets may be high users of health services, which contribute to better health outcomes. We address this possibility using market fixed effects that control for all unobserved time-invariant market factors.

Second, a competition measure based on actual market shares is endogenous to quality because market shares are a function of quality. We thus construct our competition measure using predicted market shares of agencies.⁴

³CON-regulated states are AL, AK, AR, CA, GA, HI, KY, MD, MS, MT, NJ, NY, SC, TN, VT, WA, WV, and DC.

⁴It might be possible that over-time changes in competition—market entry/exit—were endogenous quality, which is not controlled for by the use of predicted market shares and market fixed effects. For example, agencies might have strategically entered or exited a market on the basis of market quality during the study period as markets slowly adjusted to the payment change made in 2000. To explore this possibility, we examined descriptive data of whether/how the degree of market entry/exit was related to market quality, but did not find that any systematic pattern between the degree of entry/exit and quality, which leads us to discount that possibility.

Finally, responses to competition in terms of quality may differ depending on the level of competition (Kessler and McClellan, 2000). We capture a potential nonlinear relationship using indicators of competition deciles.

Our final empirical model is written as follows:

$$QUAL_{ijmt} = \beta_d I(C\hat{P}T_{mt}) + M_m + \gamma COST_{ijmt} + \delta DMD_{ijmt} + T_t + \varepsilon_{ijmt} \quad (3)$$

where $I(\bullet)$ is an indicator function of competition deciles and $C\hat{P}T_{mt}$ is the level of competition in the m th market in year t , measured on the basis of predicted market shares. M_m are market fixed effects. $COST_{ijmt}$, DMD_{ijmt} , and T_t are the same as equation (2). We follow the prior literature and define market areas for home health care by zip codes (Porell *et al.*, 2006).

We explore the sensitivity of the model to alternative specifications of a linear model and a model without market fixed effects. We also estimate the model separately by CON status to examine whether the effect of exit is better observed in states with CON, which restricts entry but not exit. All models are estimated using linear regressions. Standard errors are corrected for clustering among observations at the market level.

3.1. Quality measures

We analyze three indicators of home health quality. The first indicator is a composite measure of improvements in functional status during an episode. An episode is a care period between a patient's admission to an agency and discharge from the agency. Functional status represents how well patients perform activities of daily living, such as bathing, transferring, taking medications, and managing shortness of breath or incontinency. These activities are among the main targets of home health services, whose goal is to assist patients in independently managing daily activities. For each activity, we construct an indicator of the improvement in functional status between the start and end of an episode. Recent quality initiatives by Medicare use these indicators as quality measures (Murtaugh *et al.*, 2007). A composite measure is computed as the proportion of indicators with improvement among activities that were not at the highest level of functioning at baseline. About 15% of observations, which could not experience improvement, were excluded from the analysis of functional improvements.

The second measure captures whether an episode ends without being interrupted by hospitalization (discharge without a hospitalization). Another focus of home health care is to help patients manage their conditions at home by identifying signs of problems and continuing care they need. A hospitalization during an episode thus indicates poor quality of care and also has been used in the quality programs by Medicare.

Finally, we use the number of visits because patients may assess home health quality on the basis of easy-to-observe aspects and agencies may compete over those features. We construct this measure as the weighted number of home health aide, skilled nursing, and therapy visits. As the weight, we use the relative value of each service type, which

represents different intensities of care and hence different costs of resource use (Welch *et al.*, 1996).

3.2. Competition measures

We measure competition by the Herfindahl–Hirschman Index (HHI). We use the predicted HHI following the approach developed by Kessler and McClellan (2000) to address the part of HHI that might be endogenous to quality. This is done as follows: (1) We estimate a patient-level conditional choice model that uses distance between the agency office and the patient's residence to identify choice of agency independent of quality.⁵ This model predicts patients' probabilities of choosing each agency in a market (zip code), from which we calculate the predicted market share of an agency in the market.⁶ We obtain the predicted HHI of each market from the predicted market shares of agencies. (2) We then construct an agency-level HHI, to reflect agencies' quality decisions, as a weighted average of the predicted HHIs for all the markets that the agency serves, where the weight is the predicted share of the agency's patients coming from each market. (3) Finally, we obtain a weighted average of the agency-level HHIs for all agencies serving the market, with the weight being each agency's share of patients in the market.

This is our primary measure of competition and its variation comes from (1) agency entries/exits (i.e., openings/closings), (2) agencies' strategic shifts in patient shares across their market areas, and (3) patients' agency choice decisions.

3.3. Cost and demand shifters

Cost shifters include agency attributes, such as agency size, the number of nurses and aides, and Medicare tenure. Agencies with larger size, longer tenure, and more nurses/aides may be more efficient in organizing quality-related activities than their counterparts (Jung *et al.*, 2010). Demand shifters capture patients' illness severity and service needs. They include patient age, gender, race, Medicaid buy-in status, health-risk factors (smoking, alcohol dependency, obesity), health status (cognitive status, depression, vision impairment, behavioral problems, and baseline functional status), having a caregiver, hospital discharge within 14 days before the home health use, and the number of patients in a market. In the models without fixed effects, we use county-level measures of the availability of other post-acute care facilities (Skilled Nursing Facilities (SNF) and Long-term Care (LTC) hospitals), which capture both market demand for post-acute services and potential competition among post-acute care providers.

⁵While home health patients do not need to travel, they may still choose an agency on the basis of distance, considering distance as a marker representing agency staff's responsiveness to their needs. Home health care provision is a local activity involving nurses' visits to patients' homes. It is thus important for nurses to understand demand from the local community, and nurses employed by close agencies may better respond to patient demand in the community. Further, close agencies may offer services in a more timely fashion and more frequently than distant agencies. Our data indicate that 90% of patients chose an agency within 30 miles from their residence.

⁶We estimate the choice model for each year to capture over-time variation in competition and for each state to reduce computational burdens. Each patient's choice set includes all agencies serving the zip code of the patient's residence in a given year. Variables included in the choice model are distance (decile indicators), agency attributes, and interactions between distance indicators and agency attributes.

3.4. Sensitivity checks

We perform several sensitivity checks to examine how our competition measure and approach influence study results. First, we analyze the model using alternative competition measures that focus on the variation in competition due to agency entries/exits: (1) predicted HHIs at the county level and (2) the number of agencies—measured at both zip code and county levels. County-level HHI is not affected by changes in agencies' patient shares across their market areas because agencies tend to operate within a county due to regulatory constraints. The agency count measures directly capture market entries/exits by agencies.

Next, we explore whether our results are affected by time-varying market factors, such as changes in patient compositions, which are not controlled by the fixed-effects specification. We limit our analysis to a relatively homogenous group—patients with congestive heart failure, which is a common diagnosis for home health care (NCHS, 2007). If this analysis shows results consistent with the primary analysis, it would suggest that our finding is not largely driven by time-varying patient characteristics.

Finally, we estimate the model separately for hospital-discharged and community-based patients. Many home health admissions follow hospital discharges because Medicare mainly covers post-acute home health services. If hospitals have close relationships with specific agencies or own agencies, patients from such hospitals may be steered to certain agencies (by discharge planners), which would weaken the impact of competition on quality among hospital-discharged patients.

4. DATA

We utilize data of elderly fee-for-service Medicare beneficiaries who used home health services between 2001 and 2006. The primary data source is the Outcome and Assessment Information Set (OASIS), which contains records on health risk, functional status, and health service utilization of every home health patient. From OASIS data, we construct demand factors, quality indicators (functional improvements; discharges without hospitalization), agency size, and the number of home health users in a market.

The conditional choice model to construct predicted HHI is also estimated using OASIS data. To obtain reliable estimates in the choice model, we exclude records from zip codes with fewer than 10 patients and records from agencies with fewer than 10 patients. These exclusions remove 2.5% of the original sample.

The Medicare denominator and claims files (2001–2006) supply demographic and home health visit information. We obtain agency characteristics from the Provider of Services file and county characteristics from the Area Resource File.

5. RESULTS

Figure 1 presents a relationship between average unadjusted quality scores and competition. Decile 1 represents the least competitive markets ($HHI > 4,862$) and decile 10 is the most competitive markets ($HHI = 575$). For functional improvements, quality appears to increase with competition, but it falls sharply under intense competition and is the lowest in the most

competitive markets. Performances in discharges without a hospitalization and the number of visits appear to be better in relatively competitive markets, but only the visit measure presents a unidirectional relationship with competition.

Table I reports descriptive statistics of all study variables. The study data consist of 12,244,537 home health episodes, and the table divides the data into three groups by the level of competition. The table indicates that highly competitive markets (HHI deciles 9 and 10) are different in several agency and market characteristics from other markets: those highly competitive markets tend to be urban areas and have a large number of hospital beds. A share of for-profit, free-standing, or newer agencies is larger in those markets than in other markets. Most agency entries/exits are observed in highly competitive markets.⁷ Over-time variability in HHI is also greater in those competitive markets (from 741.8 to 588.2 between 2001 and 2006; 21% decrease) than other markets (from 4,160.4 to 3,578.5; 14% decrease).⁸

Table II reports the coefficients on competition from the fixed-effects regressions. For functional improvements, the decile approach indicates that the point estimates tend to increase as competition increases in relatively concentrated markets, but then fall steeply in highly competitive markets (deciles 9 and 10). Competition has a negative relationship with the non-hospitalization measure with the largest negative effects in the last two deciles, indicating the poorest outcomes in the most competitive markets. For the number of visits, competition has a positive effect in most ranges, but as in other measures, quality drops sharply in the most competitive markets. When the functional form of competition is restricted as linear, the regressions pick up the relationship only in the middle range in all measures and mask an important nonlinear relationship between competition and quality.

The patterns indicated by the coefficients from the nonlinear models can be easily seen in Figure 2, which displays the predicted values of quality scores. The figure shows that when competition becomes very intense (deciles 9 and 10; HHI > 950), it puts large, downward pressure on quality for all three measures. The drop in the coefficients in these deciles is significant compared with other deciles for all measures (the bottom panel of Table II). This may be that the ease of exit makes exit a more viable option than investing in quality in very competitive markets.

We examine the magnitude of competition effects on the basis of the results on deciles 9 and 10 where the competition effect is strong. Estimated effects of intense competition on quality are very small: The probability of improving functional status decreases by 0.43–0.81 percentage points in deciles 9 and 10 (HHI > 950), compared with other markets. This effect is only 0.83–1.55% of the average functional improvements score (51.98%). For discharges without a hospitalization, there is a 0.63–0.97% point decrease in deciles 9 and 10 (HHI > 950), compared with other markets, which corresponds to 0.80–1.21% of the

⁷These highly competitive markets tend to concentrate in several states. More than 30% of those markets are in four states (CA, FL, IL, and TX) that experienced large expansion of the home health care industry during the study period. We analyzed our model separately for these four states and all other states, but found that the results from both groups were consistent with the primary analysis (data not shown but available upon request).

⁸The average HHI in all markets changed from 2,891.4 to 2,244.8.

mean value of the measure (78.3%). Finally, 0.3 fewer visits are offered in the most competitive markets than other markets (2.25% of the mean visits).

Results on other explanatory variables are generally consistent with basic expectations (Table AI). Health risk factors (smoking, drinking) and poor health status (e.g., depression) have negative effects on quality for all measures. Poorer functional status at baseline (e.g., having difficulty in transferring) has negative effects on functional improvements but results in more visits.

For comparison purposes, we report the results from the regressions without fixed effects (Table AI). The results indicate a strong unidirectional association between competition and quality in all three measures, suggesting that time-invariant market factors correlated with both competition and quality are omitted in these regressions.

Table III reports the results from separate analysis by CON status (fixed-effects models). The overall pattern of the results is consistent with the primary analysis. The coefficients on competition deciles in the functional improvements and visit models are mostly positive in both groups, except those on deciles 9 and 10 in CON states. The model of discharges without a hospitalization presents negative coefficients on most deciles with the largest coefficients on deciles 9 or 10 in both groups. The negative coefficients are generally larger in the analysis of CON states when compared to non-CON states. This indicates a more rapid deterioration of quality when entry is restricted by CON, suggesting that ease of exit plays a role in reducing home health quality.

Figure 3 shows the predicted values of quality scores from these models. Non-CON states have better functional outcomes and more visits than CON states in relatively competitive markets and have higher rates of discharges without a hospitalization in all ranges of competition. CON states show a steeper downward slope than non-CON states in relatively competitive markets for all quality measures. Although very intense competition (decile 10) appears to place slightly upward pressure on functional improvements in CON states, this hike is not significant compared with other deciles (the bottom panel of Table III).

6. ROBUSTNESS CHECKS

We estimate the model using other competition measures that better isolate agency entries/exits: county-level HHI and the number of agencies at zip code and county levels. The results from these analyses are consistent with the primary analysis (Figures S1 and S2): Competition has a nonlinear relationship with quality with a sharp fall in quality under intense competition. The estimated effects of competition on quality based on these alternative measures are slightly weaker than those from the primary analysis, possibly because alternative measures do not capture variation in competition from the changes in patient shares across market areas.

The results from other sensitivity analyses also confirm our finding in the primary analysis. The analysis with congestive heart failure patients shows a clear nonlinear relationship between competition and quality in all quality measures, suggesting that our finding is not driven by the over-time changes in patient compositions (Figure S3). The pattern of the

competition effect from both analyses of hospital-discharged and community-based patients is also consistent with the overall analysis, implying that our finding is not influenced by possible hospital-agency relationships (Figure S4).

7. DISCUSSION AND CONCLUSION

Promotion of provider competition has been an important element of health care policies. Antitrust laws have been applied to hospital and health insurance markets, and models of managed competition have been adopted in several settings. Recently, market-based quality initiatives (e.g., public reporting or P4P programs) have expanded in several settings. Given this trend, empirical evidence on the effect of competition on quality in diverse settings is essential. Analyzing Medicare home health care markets, we report three findings:

First, we found a nonlinear relationship between competition and home health quality: When competition becomes intense, quality sharply dropped in all measures. Although small, this negative effect of competition on quality suggests that the ease of exit may restrict the ability of competition to improve quality in home health care markets; however, this possibility is limited to highly competitive markets where there may have been many easy entries and where exits are likely to be a viable option.

Second, the separate analysis by CON status indicates a slightly stronger negative effect of competition on quality in CON states than in non-CON states. This finding supports the importance of considering the ease of exits as a factor regarding the relationship between competition and home health quality.

Third, the effect of competition on quality in most ranges of competition (other than in markets with very intense competition) differed by quality measure. The number of visits increased as competition increases whereas discharges without a hospitalization decreased with competition. This suggests that agencies may focus on certain aspects of quality that are easily assessable by patients to attract patients as competition increases. Or it could be that resource requirement to help patients avoid hospitalizations may be greater than what is needed to improve other quality measures, which may lead some agencies to choose to exit under competition.

Our finding is different from the prior literature in hospital markets, and a negative relationship of intense competition to quality is counterintuitive. This is likely to be due to the unique feature in home health care—service delivery in patients' homes. Thus, market entry does not require large capital investments, and some agencies may easily enter any profitable market and then simply leave the market if they are unable to attract consumers under competition. These low-cost entrants are likely to lack technical capacity to compete over and invest in quality (Bishop *et al.*, 1999). We may see this effect in the most competitive markets because there is less of a threat from entry when an abundance of firms is already in the marketplace. It is also possible that agencies in highly competitive markets may be unable to hire/retain high-quality nurses, which are the key input of home health care, because of the limited workforce supply of the market.

Given the unique service delivery model of home health care, it is not surprising that the prior findings in hospital markets did not completely translate to this market. What is surprising is that prior to this paper, there had been no assessment of how competition affects home health quality. It may have been assumed that experience in other settings would apply to home health care, but our finding suggests that market-specific features need to be considered in assessing whether competition is a useful policy instrument to promote quality. More evidence is necessary to guide the development of market-based policies that would be appropriate to home health care.

Interpretation of findings should incorporate important limitations. First, competition may have occurred over other dimensions in those markets than the quality measures we used; for example, agencies under intense competition may offer longer time or better quality visits than those serving less competitive markets. Although such resource use may not have improved patients' health outcomes, it may have increased patient satisfaction or comfort. Second, the fixed-effects analysis does not control for time-varying factors that affect both competition and patients' health outcomes. Although the analysis of a relatively homogenous population shows that our results are unlikely to be greatly influenced by unmeasured case mix, it is still possible that agencies facing increasing competition may have treated sicker patients than agencies with little change in competition. Third, functional improvements and hospitalization-avoided measures were constructed from assessment data, which are coded by home health staff and thus are subject to measurement/reporting errors. However, the consistent results from the analysis of the visit measure, which is obtained from the claims data, suggest that this possibility is unlikely. Further, because we controlled for time-constant factors through fixed effects, measurement errors would influence our results only if the changes in those errors were related to competition.

In summary, our study is the first to assess the relationship between competition and home health quality. We report different results than studies on hospital markets. The finding of small but negative effects of competition calls for future research to investigate mechanisms behind the results. Further evaluation of and more evidence on how home health care markets function are essential to guide the development of policies to improve quality.

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APPENDIX

Table AI

Regression results

Variables	Functional improvements		Discharges without a hospitalization		Number of visits	
	(N = 10,332,027)		(N = 12,240,500)		(N = 11,937,168)	
	Without fixed effects	With fixed effects	Without fixed effects	With fixed effects	Without fixed effects	With fixed effects
Competition						
Decile 1 (HHI 10,000)						
Decile 2 (HHI 4862)	1.311	0.145	-0.263	0.389	0.552	0.028
Decile 3 (HHI 3720)	1.330	0.168	-0.442	0.142	0.520	0.082
Decile 4 (HHI 2455)	1.013	0.145	-0.948	0.045	0.847	0.148
Decile 5 (HHI 1950)	1.102	0.422	-0.702	-0.354	0.880	0.272
Decile 6 (HHI 1604)	0.723	0.191	-0.773	-0.407	0.939	0.236
Decile 7 (HHI 1302)	1.621	0.462	-0.435	-0.498	0.948	0.206
Decile 8 (HHI 1093)	2.156	0.319	-0.442	-0.927	1.108	0.219
Decile 9 (HHI 950)	2.244	-0.453	-0.401	-1.526	1.620	0.079
Decile 10 (HHI 575)	1.556	-0.068	0.682	-1.955	2.160	-0.057
Age	-0.400	-0.396	0.086	0.079	-0.008	-0.009
Male	1.522	1.462	-2.829	-2.992	-0.297	-0.247
White	0.044	0.513	1.345	0.706	-0.159	-0.202
Medicaid buy-in status	-3.564	-3.432	-1.291	-1.459	-0.505	-0.468
Smoking	-1.687	-1.641	-1.560	-1.376	-0.249	-0.261
Drinking	1.426	1.363	1.431	1.271	-0.139	-0.065
Being obese	-3.937	-3.882	0.435	0.443	0.639	0.680
Cognitive problem	-3.827	-3.683	0.048	0.111	-0.253	-0.294
Vision impairment	-2.608	-2.501	-0.773	-0.650	0.498	0.462
Depression	-1.658	-1.552	-3.378	-3.432	0.522	0.491
Pain while walking	2.689	2.747	0.253	0.161	0.263	0.268
Shortness of breath	1.431	1.499	-4.331	-4.203	0.198	0.149
Incontinency	-1.844	-1.640	-2.821	-2.742	0.190	0.169
Dependency in bathing	2.026	2.036	-0.769	-0.794	0.800	0.840
Dependency in transferring	-2.463	-2.515	-1.458	-1.439	0.391	0.365
Dependency with ambulation	0.525	0.437	-1.582	-1.718	0.521	0.561
Dependency in taking medications	-2.975	-2.963	-3.015	-3.100	0.405	0.446
Having a caregiver	-0.609	-0.739	0.249	0.121	-0.110	-0.086
Behavioral problem	-0.519	-0.509	0.066	0.070	-0.203	-0.199
Hospital discharged	7.919	7.889	-2.661	-2.620	-1.176	-1.106
Distance	-0.004	-0.008	0.011	0.010	-0.008	-0.007
For profit agency	-0.449	-0.581	-0.539	-0.603	0.563	0.519
Facility-based	0.318	0.726	0.323	0.250	-0.289	-0.324
Branch operation	-0.549	-0.337	-0.132	-0.040	-0.020	-0.094
Agency size (Number of patients)						
300-1000	2.536	2.016	2.269	1.346	-0.599	-0.370
>1000	3.686	2.719	3.386	2.030	-1.092	-0.676
Number of Registered Nurse						
3-15	0.515	0.300	-0.458	-0.445	0.028	-0.013
>15	0.597	0.334	-1.179	-0.930	0.209	0.016

Variables	Functional improvements		Discharges without a hospitalization		Number of visits	
	(N = 10,332,027)		(N = 12,240,500)		(N = 11,937,168)	
	Without fixed effects	With fixed effects	Without fixed effects	With fixed effects	Without fixed effects	With fixed effects
Number of Licensed Practice Nurse	-0.823	-0.326	-0.357	-0.490	0.083	0.160
Number of aides						
1-9	-0.472	-0.564	-0.917	-0.598	0.350	0.307
>9	-0.795	-1.024	-2.162	-0.856	0.944	0.548
Medicare tenure	-0.030	-0.020	-0.038	-0.008	-0.017	-0.026
New entrants (<3 years)	-0.186	0.107	-0.310	-0.458	-0.105	0.064
Year 2	-0.287	-0.001	-1.055	-0.526	0.120	0.188
Year 3	1.293	1.644	-1.033	-0.419	-0.148	0.000
Year 4	3.029	3.480	-1.028	-0.275	-0.354	-0.153
Year 5	4.142	4.758	-0.707	0.135	-0.244	-0.032
Year 6	6.250	6.696	0.474	1.099	-0.288	-0.077
Number of home health users in a zip	0.000	0.000	0.001	0.000	0.000	0.000
College educated (%)	-0.048	-	0.068	-	-0.002	-
Median income	0.000	-	0.000	-	0.000	-
Population age over 65 years	0.135	-	0.095	-	-0.007	-
Rural area	-0.796	-	-1.294	-	0.194	-
Population density	0.000	-	0.000	-	0.000	-
Hospital beds/100	0.000	-	0.001	-	0.000	-
LTC facility beds/100	0.001	-	0.000	-	0.000	-
SNF beds/100	0.000	-	0.000	-	0.000	-
Nursing facilities beds	0.000	-	0.000	-	0.000	-
Constant	69.435	74.082	86.752	90.881	9.324	9.731

HHI: predicted Herfindahl-Hirschman Index; decile 1 is the reference group.

* $p < 0.10$;
 ** $p < 0.05$;
 *** $p < 0.01$.

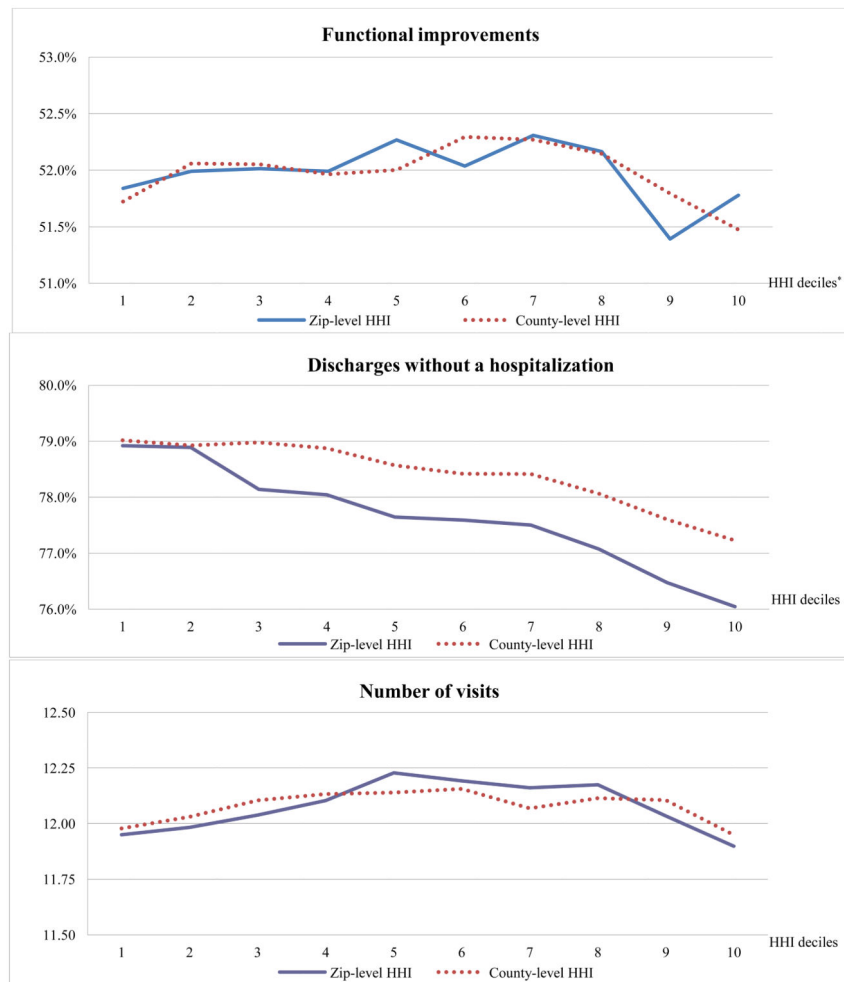


Figure A1.

Predicted quality scores from fixed effects models using Herfindahl Index

* HHI: Predicted Herfindahl Index;

Zip-level and county-level cut-off values are: HHI 10,000 and HHI 10,000 (decile 1), HHI 4,862 and HHI 4,168 (decile 2), HHI 3,720 and HHI 3,043 (decile 3), HHI 2,455 and HHI 2,364 (decile 4), HHI 1,950 and HHI 1,822 (decile 5), HHI 1,604 and HHI 1,399 (decile 6), HHI 1,302 and HHI 1,066 (decile 7), HHI 1,093 and HHI 835 (decile 8), HHI 950 and HHI 585 (decile 9), and HHI 575 and HHI 306 (decile 10).

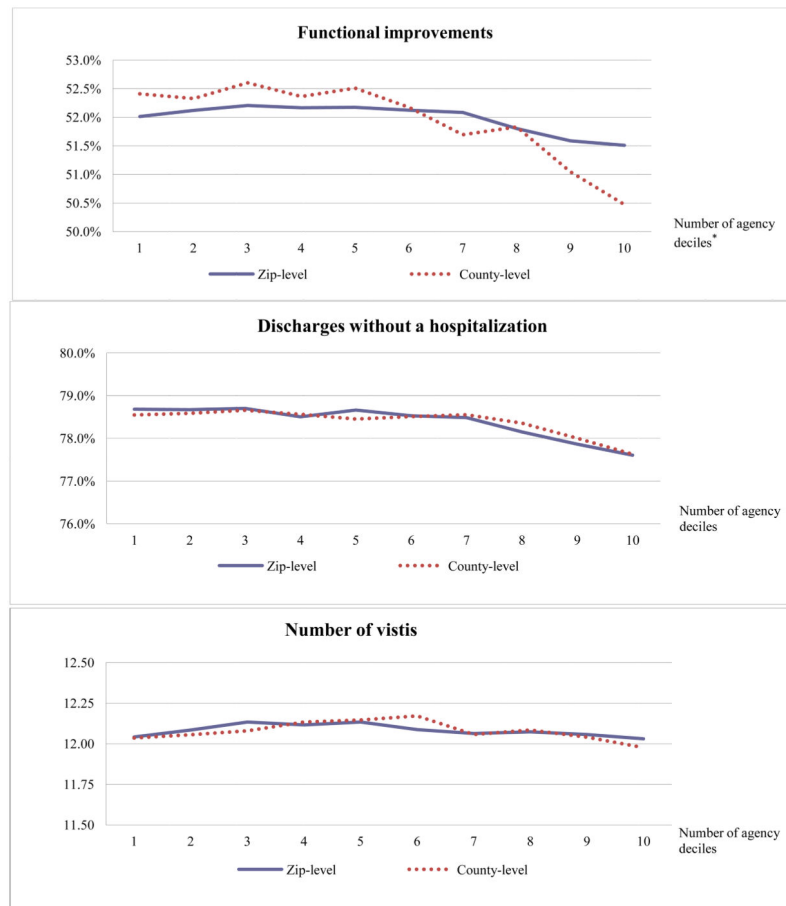


Figure A2.

Predicted quality scores from fixed effects models using number of agencies

* Zip-level and county-level cut-off values are: N = 3 and N = 7 (decile 1), N = 4 and N = 10 (decile 2), N = 5 and N = 14 (decile 3), N = 6 and N = 18 (decile 4), N = 7 and N = 24 (decile 5), N = 8 and N = 31 (decile 6), N = 11 and N = 40 (decile 7), N = 14 and N = 56 (decile 8), N = 19 and N = 122 (decile 9), and N = 58 and N = 378 (decile 10).

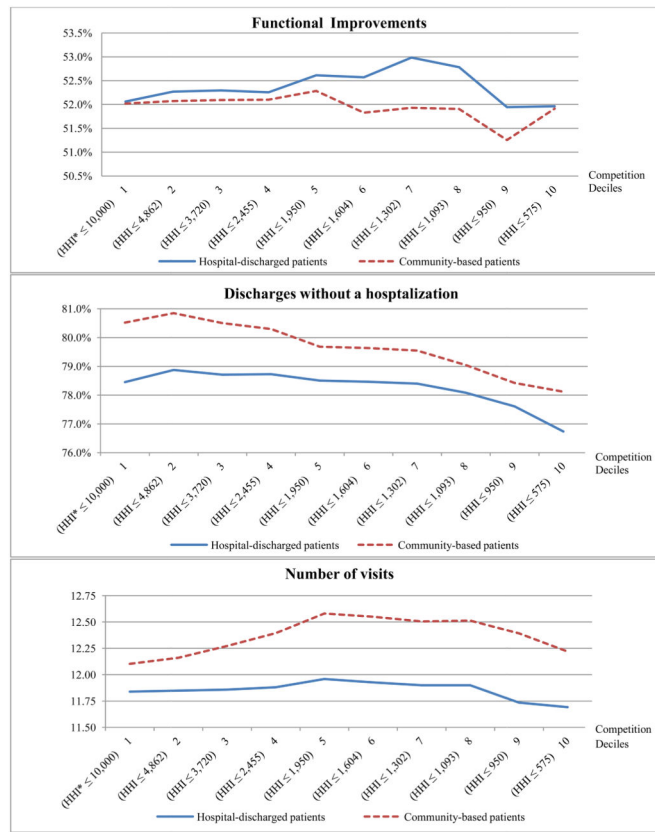


Figure A3.
 Predicted quality scores for hospital-discharged and community-based patients
 * HHI: Predicted Herfindahl Index

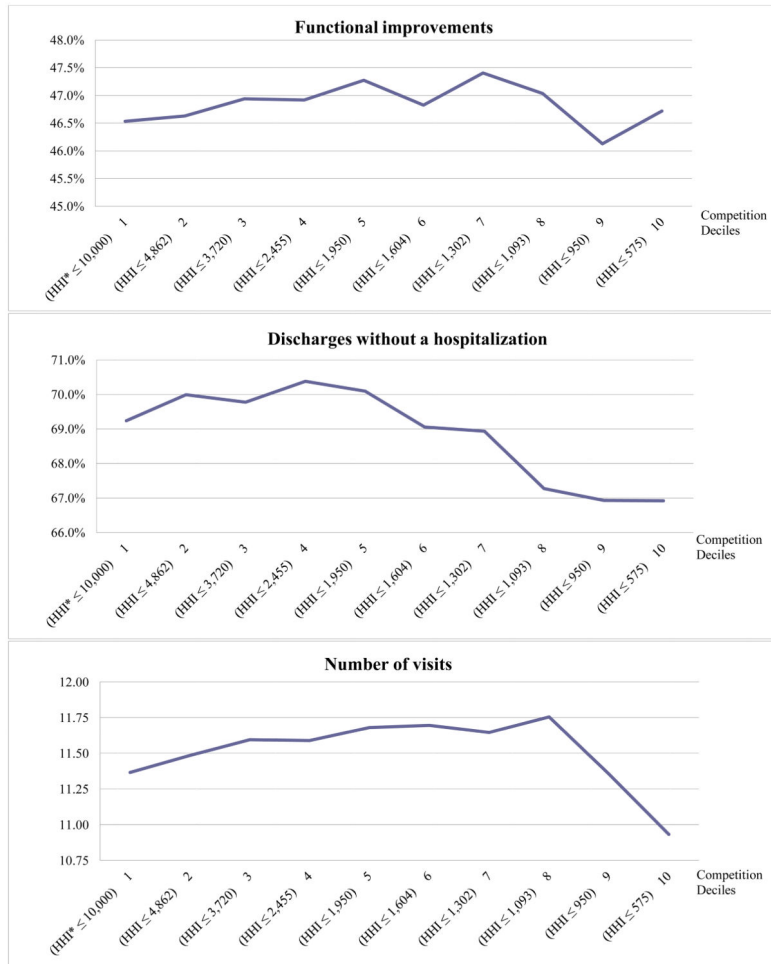


Figure A4.
 Predicted quality scores from analysis of patients with congestive heart failure
 * HHI: Predicted Herfindahl Index

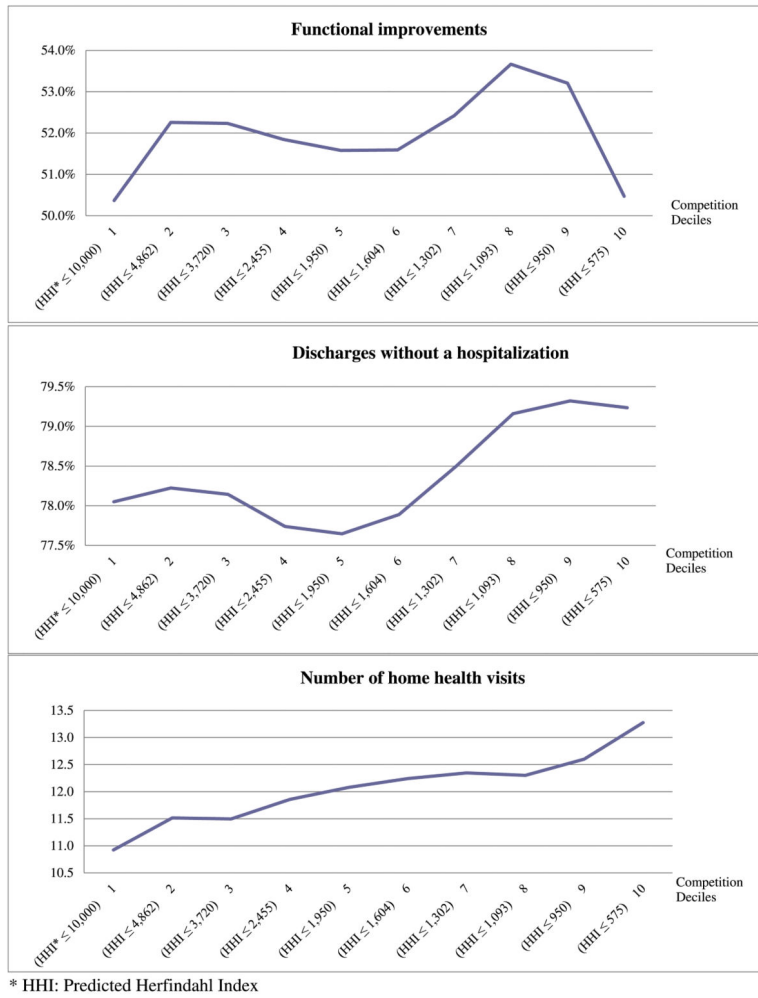
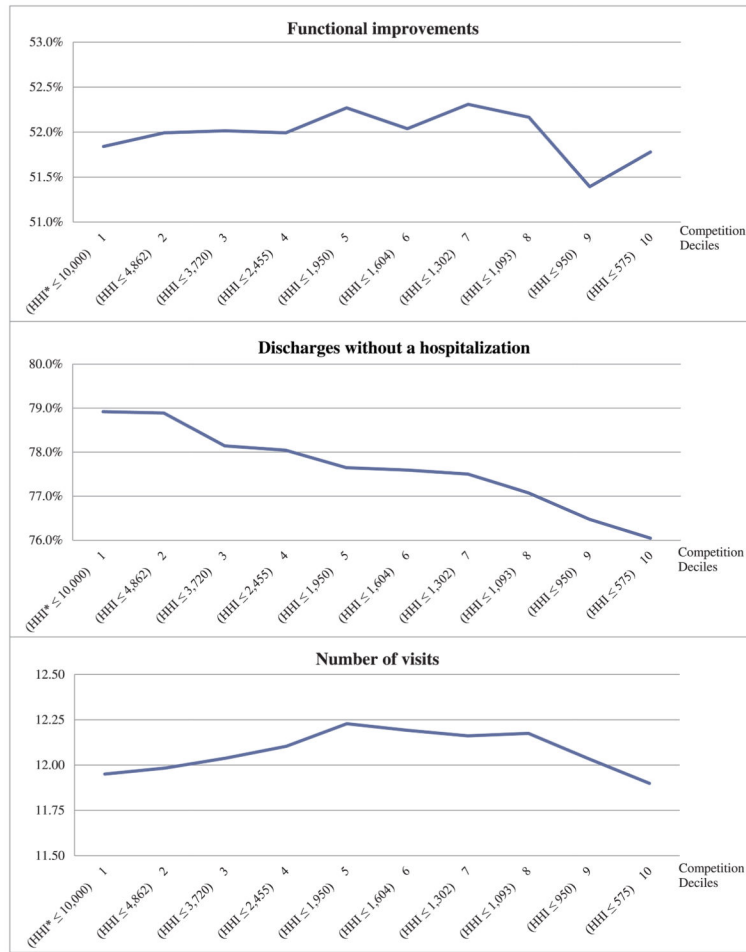
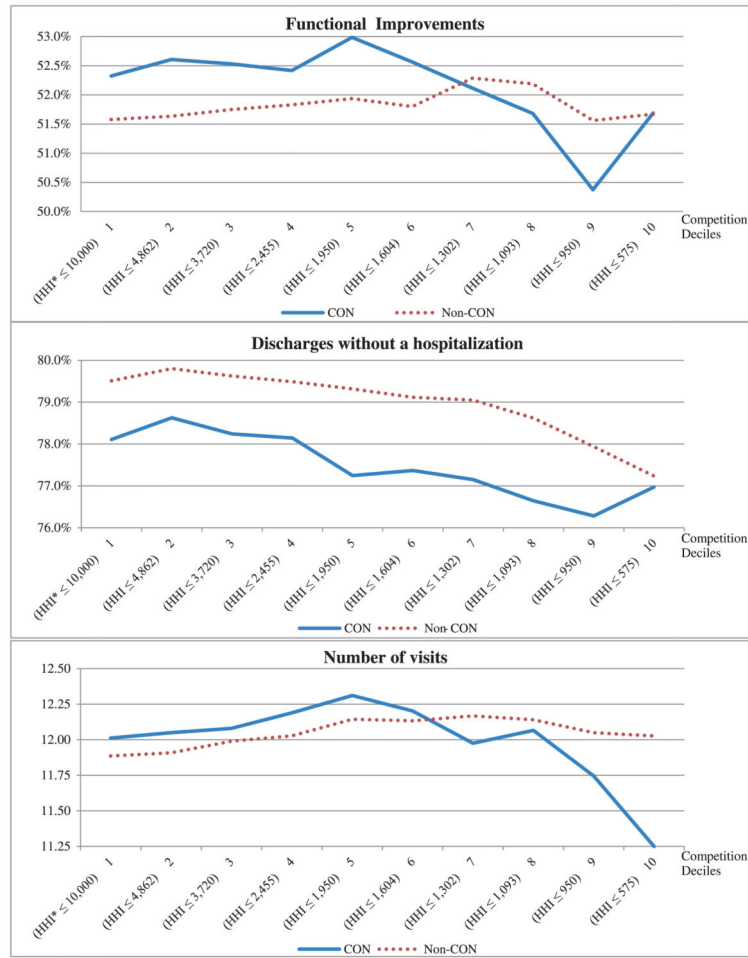


Figure 1.
Unadjusted quality scores by competition.



* HHI: Predicted Herfindahl Index

Figure 2.
Predicted quality scores from fixed effects models by competition.



* HHI: Predicted Herfindahl Index

Figure 3. Predicted quality scores by competition by Certificate of Need (CON) status.

Table 1

Descriptive statistics of study variables by the level of competition.

	Low competition ^d (N = 1,127,179)		Mid-range competition (N = 8,619,587)		Intense competition (N = 2,497,771)	
	Mean	SD	Mean	SD	Mean	SD
Dependent variables						
Functional improvements (%)	50.37	0.32	52.23	0.32	51.84	0.32
Discharges without hospitalization (%)	78.05	0.41	78.19	0.41	79.28	0.41
Number of home health visits	10.92	8.22	11.98	8.89	12.94	8.98
Competition measure						
Predicted Herfindahl–Hirschman Index (HHI)	6502	1363	2393	1025	585	247
Explanatory variables						
Age	80.09	7.69	77.99	7.70	80.11	7.88
Male	0.36	0.48	0.35	0.48	0.35	0.48
White	0.96	0.21	0.87	0.34	0.75	0.43
Medicaid buy-in status	0.15	0.36	0.17	0.37	0.26	0.44
Smoking	0.07	0.25	0.06	0.24	0.05	0.22
Drinking	0.02	0.12	0.01	0.11	0.01	0.10
Being obese	0.16	0.36	0.13	0.34	0.12	0.33
Cognitive problem	0.37	0.48	0.36	0.48	0.41	0.49
Vision impairment	0.59	0.49	0.58	0.49	0.65	0.48
Depression	0.23	0.42	0.20	0.40	0.21	0.40
Pain while walking at baseline	1.30	1.04	1.21	1.04	1.32	1.00
Shortness of breath at baseline	1.23	1.15	1.22	1.14	1.39	1.13
Incontinence at baseline	0.44	0.57	0.42	0.57	0.45	0.57
Dependency with bathing at baseline	2.55	1.34	2.55	1.34	2.40	1.27
Dependency with transferring at baseline	0.85	0.81	0.95	0.87	1.06	0.91
Dependency with ambulation at baseline	1.25	0.91	1.33	0.96	1.38	0.99
Dependency with taking medications at baseline	0.83	0.78	0.84	0.79	0.88	0.79
Having a caregiver	0.82	0.39	0.85	0.36	0.86	0.34
Behavioral problem	0.39	1.26	0.45	1.35	0.50	1.40
Hospital discharged	0.60	0.49	0.56	0.50	0.47	0.50

	Low competition ^a (N = 1,127,179)		Mid-range competition (N = 8,619,587)		Intense competition (N = 2,497,771)	
	Mean	SD	Mean	SD	Mean	SD
Distance	10.36	15.16	12.56	15.18	11.95	12.12
For profit agency	0.12	0.32	0.37	0.48	0.73	0.44
Facility-based	0.52	0.50	0.31	0.46	0.12	0.33
Branch operation	0.33	0.47	0.40	0.49	0.24	0.43
Number of Registered Nurse (RN)						
RN 3–15	0.49	0.50	0.36	0.48	0.44	0.50
RN >15	0.43	0.49	0.57	0.49	0.37	0.48
Number of Licensed Practice Nurse	0.16	0.37	0.34	0.48	0.35	0.48
Number of aides						
Aides 1–9	0.53	0.50	0.47	0.50	0.55	0.50
Aides >9	0.32	0.47	0.38	0.48	0.16	0.36
Medicare tenure	22.92	10.48	20.23	11.01	11.12	9.51
New entrants (<3 years)	0.99	0.12	0.95	0.21	0.79	0.41
Number of home health users	47.82	63.09	99.33	113.2	206.63	200.48
College educated (%)	17.77	7.36	21.54	10.14	24.37	7.01
Household median income (\$1000)	38.36	85.75	43.51	12.41	44.62	93.73
Population age over 65 (%)	15.38	3.61	13.17	3.44	11.41	4.48
Rural (%)	0.58	0.49	0.21	0.40	0.02	0.12
Population density	82.04	142.84	1092	4431	1685	1507
Number of hospital beds/100	198.62	275.33	1309	2043	8434	9024
Number of long-term facility beds/100	17.88	86.67	115.73	280.3	482.67	729.84
Number of skilled nursing facility beds/100	407.72	470.11	2139.8	3070	11,340	13,504
Number of nursing facilities beds/100	29.06	86.97	77.57	250.9	859.94	1373
Number of patients per agency	617.32	694.78	1757	4015	978.67	1111
Agency entries/exits						
Annual agency entries per zip	0.01	0.10	0.12	0.42	1.57	2.92
Annual agency exits per zip	0.01	0.10	0.04	0.20	0.36	1.07

SD, standard deviation.

^aLow competition: predicted Herfindahl–Hirschman Index (HHI) decile 1 (HHI > 4862); mid-range competition: HHI deciles 2–8 (950 < HHI < 4862); intense competition: HHI deciles 9 and 10 (HHI < 950).

Table II

Results from fixed effects regressions.

	<u>Functional improvements</u>	<u>Discharges without a hospitalization</u>	<u>Number of visits</u>
	(<i>N</i> = 10,332,027)	(<i>N</i> = 12,240,500)	(<i>N</i> = 11,937,168)
Linear model			
Competition (reversed HHI ^a)	0.116**	-0.082**	0.051***
Nonlinear model (decile approach)			
Competition deciles			
Decile 1 (HHI 10,000) ^b			
Decile 2 (HHI 4862)	0.145	0.389***	0.028
Decile 3 (HHI 3720)	0.168	0.142	0.082**
Decile 4 (HHI 2455)	0.145	0.045	0.148***
Decile 5 (HHI 1950)	0.422**	-0.354**	0.272***
Decile 6 (HHI 1604)	0.191	-0.407**	0.236***
Decile 7 (HHI 1302)	0.462*	-0.498**	0.206***
Decile 8 (HHI 1093)	0.319	-0.927***	0.219***
Decile 9 (HHI 950)	-0.453	-1.526***	0.079
Decile 10 (HHI 575)	-0.068	-1.955***	-0.057
Three-category competition			
Deciles 1–8 (HHI > 950) ^b			
Decile 9 (HHI 950)	-0.806***	-0.625***	-0.147***
Decile 10 (HHI 575)	-0.430**	-0.966***	-0.290***

The values of Akaike information criterion (AIC) and Bayesian information criterion (BIC) measures are as follows: for functional outcomes, 4,445,822 and 4,446,388 for the linear model; 4,445,614 and 4,446,293 for the decile model; and 4,445,654 and 4,446,234 for the three-category model; for discharges without hospitalization, 7,986,837 and 7,987,393 for the linear model; 7,986,706 and 7,987,374 for the decile model; 7,986,745 and 7,987,315 for the three-category model; and for the number of visits, both AIC and BIC are 58,000,000 in all models.

^aReversed HHI: predicted Herfindahl–Hirschman Index (HHI) values are subtracted from 10,000.

^bReference group.

* $p < 0.10$;

** $p < 0.05$;

*** $p < 0.01$.

Table III

Regression results by Certificate of Need (CON) status (fixed-effects models)

	Functional improvements		Discharges without hospitalization		Number of visits	
	CON states ^a	Non-CON states	CON states	Non-CON states	CON states	Non-CON states
<i>N</i>	3,522,989	6,809,038	4,194,566	8,045,944	4,081,468	7,855,700
Decile approach						
Competition deciles						
Decile 1 (HHI 10,000) ^b						
Decile 2 (HHI 4862)	0.282	0.057	0.517***	0.290**	0.037	0.022
Decile 3 (HHI 3720)	0.207	0.171	0.133	0.115	0.068	0.104**
Decile 4 (HHI 2455)	0.093	0.253	0.034	-0.021	0.177**	0.141**
Decile 5 (HHI 1950)	0.662***	0.359	-0.862***	-0.194	0.299***	0.258***
Decile 6 (HHI 1604)	0.239	0.222	-0.741**	-0.393	0.191*	0.247***
Decile 7 (HHI 1302)	-0.209	0.711**	-0.957***	-0.460*	-0.037	0.282***
Decile 8 (HHI 1093)	-0.642	0.612*	-1.463***	-0.890***	0.054	0.254***
Decile 9 (HHI 950)	-1.950***	-0.016	-1.824***	-1.573***	-0.267*	0.164*
Decile 10 (HHI 575)	-0.636	0.092	-1.138**	-2.272***	-0.762***	0.141
Three-category competition						
Deciles 1–8 (HHI 1093) ^b						
Decile 9 (HHI 950)	-1.335***	-0.677***	-0.379*	-0.703***	-0.304***	-0.109***
Decile 10 (HHI 575)	0.049	-0.615***	0.379	-1.304***	-0.791***	-0.144***

^a CON states are AL, AK, AR, GA, HI, KY, MD, MS, MT, NJ, NY, CA, SC, TN, VT, WA, WV, and DC.

^b HHI; predicted Herfindahl–Hirschman Index; decile 1 is the reference group.

* $p < 0.10$;

** $p < 0.05$;

*** $p < 0.01$.