

**Hospital-Level, Risk-Standardized Payment
Associated with a 30-Day Episode of Care for Pneumonia (Version 1.0)**

2013 Measure Methodology Report

Submitted By

Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation
(YNHHSC/CORE):

Nancy Kim, M.D., Ph.D.* – Project Lead
Lesli S. Ott, M.A., M.A. – Lead Analyst
Angela Hsieh, Ph.D. – Supporting Analyst
Steven Spivack, M.P.H. – Project Coordinator
Xiao Xu, M.A., Ph.D.* – Consulting Health Economist
Mark Volpe, B.S. – Research Assistant
Alex Liu, B.S. – Research Assistant
Meechen Okai, B.A. – Research Assistant
Susannah M. Bernheim, M.D., M.H.S.* – Project Director
Harlan M. Krumholz, M.D., S.M.* – Principal Investigator

*Yale School of Medicine

Prepared For:

Centers for Medicare & Medicaid Services (CMS)

September 2013

ACKNOWLEDGEMENTS

This study is a collaborative effort, and the study authors gratefully acknowledge and thank Zhenqiu Lin, Elizabeth Drye, Kanchana Bhat, and Lori Geary from Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation; Sharon-Lise Normand from Harvard School of Public Health; and Lein Han, Karen Nakano, Michael Rapp, and Kate Goodrich at the Centers for Medicare & Medicaid Services for their contributions to this work.

We also thank the Technical Expert Panel members, who provided helpful insight on key measure decisions. These members include:

Amanda Kowalski, PhD - Assistant Professor of Economics, Yale University

Anne-Marie Audet, MD, MSc, SM - Vice President, Health System Quality and Efficiency, Commonwealth Fund

David S. P. Hopkins, PhD - Senior Advisor, Pacific Business Group on Health

Donald Casey MD, MPH, MBA - Vice President and Medical Director, NYU Langone Medical Center

Kavita Patel, MD, MS - Managing Director for Clinical Transformation and Delivery, Engelberg Center for Healthcare Reform, Brookings Institution

Lesley Curtis, PhD, MS - Associate Professor in Medicine, Duke University

Peter Bach, MD, MAPP - Director, Center for Health Policy and Outcomes, Memorial Sloan-Kettering Cancer Center

Peter Lindenauer, MD, MSc - Associate Professor of Medicine, Tufts University; Medical Director, Clinical and Quality Informatics, Baystate Medical Center; Director, Center for Quality of Care Research

Scott Flanders, MD - Professor of Internal Medicine; Director of the Hospitalist Program, University of Michigan

Stephen Schmaltz, PhD, MS, MPH - Associate Director, Center for Database Management and Analysis, Joint Commission

Terry Golash, MD - Senior Medical Director, Aetna

Vivian Ho, PhD - James A. Baker III Institute Chair in Health Economics and Professor of Economics, Rice University

TABLE OF CONTENTS

| | |
|--|-----------|
| EXECUTIVE SUMMARY | 7 |
| 1. INTRODUCTION | 9 |
| 1.1. Background | 9 |
| 1.2. Assessing Cost of Care by Measuring Payments for Medicare Patients..... | 9 |
| 1.3. Measuring Pneumonia Payments | 9 |
| 1.4. Episode of Care | 10 |
| 1.5. Approach to Measure Development | 10 |
| 1.6. Aims of the Measure..... | 11 |
| 2. METHODS..... | 12 |
| 2.1. Overview of Measure Methodology..... | 12 |
| 2.2. Dataset..... | 12 |
| 2.3. Cohort | 13 |
| 2.3.1. Index Cohort Exclusions..... | 14 |
| 2.4. Outcome | 15 |
| 2.4.1. 30-day Timeframe..... | 16 |
| 2.4.2. Prorating Payments | 16 |
| 2.4.3. Transfer Scenarios | 16 |
| 2.4.4. Removing Payment Adjustments..... | 17 |
| 2.5. Calculating Payments for Different Care Settings, Services, and Supplies | 17 |
| 2.5.1. Inpatient Care Settings | 17 |
| 2.5.2. Outpatient Care Settings | 20 |
| 2.5.3. Other Care Settings..... | 25 |
| 2.5.4. Physicians, Physician Extenders, and Social Work Services..... | 27 |
| 2.5.5. Durable Medical Equipment/Prosthetics and Orthotics/Parenteral and Enteral Nutrition (DME/POS/PEN) | 28 |
| 2.6. Model Development and Validation Samples | 28 |
| 2.7. Approach to Risk Adjustment | 29 |
| 2.7.1. Complications of Hospitalization | 29 |
| 2.7.2. Case Mix Adjustment: Candidate Comorbid Risk Variables | 30 |
| 2.7.3. Case Mix Adjustment: Choice of Functional Form..... | 30 |
| 2.7.4. Final Variable Selection..... | 31 |
| 2.8. Statistical Approach to Risk-Standardized Payment (RSP) | 35 |
| 2.8.1. Hospital Performance Reporting | 36 |
| 2.8.2. Creating Interval Estimates..... | 37 |
| 3. RESULTS | 39 |
| 3.1. Model Development and Validation Results | 39 |
| 3.1.1. Results of Risk-Adjustment Model in Development and Validation Samples | 41 |
| 3.2. Final Model Results..... | 47 |
| 3.2.1. Distribution of Unadjusted and Adjusted Hospital-Specific Pneumonia 30-Day Episode-of- Care Payment..... | 49 |
| 3.3. Measure Testing | 52 |
| 3.3.1. Reliability Testing..... | 52 |

| | |
|--|-----------|
| 3.3.2. Validity Testing..... | 52 |
| 4. MAIN FINDINGS / SUMMARY | 55 |
| 5. REFERENCES | 56 |
| 6. APPENDICES | 58 |
| Appendix A. Potential Complications in the Index Admission for Pneumonia Payment Model | 58 |
| Appendix B. ICD-9-CM Codes Included in Final Cohort | 63 |
| Appendix C. Example of Included and Excluded Payments When Counting the 30-Day Episode of Care for a Patient with an Index Admission on May 3 and Discharged on May 8 | 64 |
| Appendix D. Stripped/Standardized Payment Diagrams | 65 |
| Appendix E. Technical Expert Panel Member Roster..... | 74 |

LIST OF TABLES

| | |
|--|----|
| Table 1. Most Frequent DRGs in Pneumonia Patients in 2009..... | 18 |
| Table 2. 2008-2009 Pneumonia Payment Model Development and Validation Samples..... | 29 |
| Table 3. 2009 Pneumonia Payment Model Candidate Variables | 32 |
| Table 4. 2009 Pneumonia Payment Model Final Variables | 34 |
| Table 5. Description of 2008-2009 Development and Validation Samples | 39 |
| Table 6. 2008-2009 Pneumonia Payment Model Risk Factor Frequencies in Development and Validation Samples | 39 |
| Table 7. Generalized Linear Model Results for 2009 Development Sample A1 (N=167,456 at 4,586 hospitals)..... | 41 |
| Table 8. Generalized Linear Model Results for 2009 Validation Sample A2 (N=167,457 at 4,574 hospitals) | 43 |
| Table 9. Generalized Linear Model Results for 2008 Validation Sample B (N=365,536 at 4,644 hospitals)..... | 44 |
| Table 10. Generalized Linear Model Performance for 2008-2009 Development and Validation Samples..... | 46 |
| Table 11. Hierarchical Generalized Linear Model Results for Full 2008-2009 Sample | 47 |
| Table 12. Distribution of Unadjusted and Risk-Standardized Payments for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined) | 50 |

LIST OF FIGURES

| | |
|---|----|
| Figure 1.Index Pneumonia Cohort for the 2008-2009 Calendar Year Sample..... | 15 |
| Figure 2.Episode of Care for Transfer Patient..... | 17 |
| Figure 3.Distribution of Unadjusted Patient-Level Total Payments for a Pneumonia 30-Day Episode of Care (2009 Sample A; N=334,913 Patients)..... | 31 |
| Figure 4.Analysis Steps..... | 38 |
| Figure 5.Distribution of Pneumonia Episode-of-Care Unadjusted Payments for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined) | 51 |
| Figure 6.Distribution of Pneumonia Episode-of-Care RSPs for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined)..... | 51 |

EXECUTIVE SUMMARY

This technical report describes the development of a hospital-level, risk-standardized 30-day episode-of-care payment measure for pneumonia developed by Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation (YNHHSC/CORE) under contract with the Centers for Medicare & Medicaid Services (CMS). A risk-standardized payment measure for a pneumonia episode of care that spans from admission through 30 days post-admission provides information that will support hospital and national efforts to optimize and coordinate care.

Context of Medicare Spending and Value Assessments

In 2012 total Medicare expenditures were \$574.2 billion, representing 3.6% of gross domestic product (GDP). Current estimates suggest that Medicare spending will increase to 5.6% of GDP by 2035.¹ The growth in Medicare spending highlights the need to incentivize high value care. A critical first step in moving toward high value care is to provide transparency of costs of care that is comparable across providers. In this report, we describe the development of a “cost” measure that evaluates the cost of care for Medicare patients from the CMS perspective. We developed this measure to include a 30-day episode of care to provide insight into the cost of practice patterns that occur during inpatient admission and immediately thereafter. The measure specifications are aligned with current quality of care measures so that the costs of care can be interpreted in the context of the health outcomes they deliver. In this way, the measure can facilitate the profiling of hospital value and encourage the most efficient delivery of high quality care.

Using Payments for Medicare Patients

Costs are often approximated using hospital charges, converting hospital charges to costs based on cost-to-charge ratios, or estimating Medicare payments. Because we are interested in measuring costs from Medicare’s perspective, we focused on payments made for Medicare patients for a 30-day episode of care for pneumonia. Payments for Medicare patients are calculated using both Medicare claims and CMS data. Using CMS’s clearly defined Prospective Payment Systems and Fee Schedules in combination with Medicare claims allows for the removal of payment adjustments that are not directly related to care (for example, geographic factors and policy adjustments) across all care settings, services, and supplies.

Measuring Pneumonia

By focusing on one specific condition, value assessments may provide actionable feedback to hospitals and incentivize targeted improvements in care. Pneumonia is a common condition among the elderly with substantial variability in payments due to different practice patterns. Quality measures for pneumonia, such as 30-day pneumonia risk-standardized mortality rate (RSMR), are already publicly reported. In the context of its publicly reported quality measures, pneumonia is an ideal condition in which to assess payments for Medicare patients and relative hospital value.

30-Day Episode of Care

When considering hospital payments, we focused on an “episode of care” triggered by admission for several key reasons. First, hospitalizations represent brief periods of illness that require ongoing management post-discharge. Second, decisions made at the admitting hospital affect payments for care in the immediate post-discharge period. Third, assigning payments for a continuous episode of care to admitting hospitals may reveal practice variations in the full care of the illness that can result in increased payments. Fourth, a 30-day preset window provides a standard observation period by which

to compare all hospitals. Lastly, we designed the pneumonia payment measure to be aligned with pneumonia quality measures, like CMS's publicly reported pneumonia mortality measure, which is reported 30 days after admission. The pneumonia payment measure captures payments for Medicare patients across multiple care settings, services, and supplies (inpatient, outpatient, skilled nursing facility, home health, hospice, physician/clinical laboratory/ambulance services, and durable medical equipment, prosthetics/orthotics, and supplies).

Payment Calculation

The overarching goal of the measure is to calculate payments that reflect differences in the care provided for patients with pneumonia rather than differences based on geography or policy adjustments. In order to remove payment adjustments unrelated to clinical care we developed the measure by “stripping” or “standardizing” payments as detailed below:

- Stripping refers to removing geographic differences and policy adjustments in payment rates for individual services.
- Standardizing refers to averaging payments across geographic areas for those services where geographic differences in payment cannot be stripped.

By removing payment adjustments unrelated to clinical care, our measure reflects differences in payment due to practice variation at the hospital level. The body of the report presents the current measure specifications, methodology, and results in detail. Although the methodology of this payment measure is developed for pneumonia, it can be applied to other disease conditions such as acute myocardial infarction (AMI) and heart failure (HF).

Risk-Adjustment and Statistical Model

To compare relative hospital payments, we adjusted for hospital case-mix by including patient age and comorbid conditions that are clinically relevant to pneumonia and have strong relationships with the payment outcome. To calculate hospital-specific risk-standardized payments, we estimated hierarchical generalized linear models. This strategy accounts for within-hospital correlation of the observed outcomes (total payments) and accommodates the assumption that underlying differences in quality across hospitals lead to systematic differences in outcomes.

Findings

Wide variation in payments for a pneumonia episode of care persists after considering transfers, removing Medicare payment adjustments that are not related to clinical care (e.g., geographic factors and policy adjustments), and adjusting for case mix.

1. INTRODUCTION

1.1. Background

In 2012 total Medicare expenditures were \$574.2 billion, representing 3.6% of gross domestic product (GDP). Current estimates suggest that Medicare spending will increase to 5.6% of GDP by 2035 due to both an increase in the Medicare population as well as Medicare spending on each beneficiary.¹ The growth in Medicare spending is unsustainable and highlights the need to create incentives for high value care. A critical first step in moving toward high value care is to define an approach to calculate costs that is transparent to consumers and fair to providers. In this report, we describe the development of a “cost” measure that evaluates the cost of care for Medicare patients from the CMS perspective. This measure, using standardized payments, reflects differences in the management of care for patients with pneumonia both during hospitalization and immediately post-discharge.

Payments, however, are difficult to interpret in isolation. Some high payment hospitals may have better clinical outcomes when compared with low payment hospitals; other high payment hospitals may not. In an effort to identify practice patterns that may be expensive without conferring a quality benefit, the pneumonia payment measure specifications are aligned with current quality of care measures such as CMS’s 30-day pneumonia risk-standardized mortality rate (RSMR). In this way the measure can facilitate the profiling of hospital value and encourage the most efficient delivery of high quality care.

A payment measure that fairly profiles hospitals by adjusting for hospital case-mix and standardizes payments for geography is congruent with national efforts to increase the transparency of our healthcare system. Although the pneumonia payment measure is not intended to be used in payment programs, when interpreted in the context of CMS’s 30-day pneumonia RSMR, it can provide key insights into those systems of care that provide high value as a patient moves from the inpatient to the outpatient setting. Because the payment measure spans an episode of care, it is complementary to and may uniquely inform innovative payment models such as bundled payments and Accountable Care Organizations (ACOs), both of which seek to improve healthcare value by optimizing the coordination of care across care settings.²

1.2. Assessing Cost of Care by Measuring Payments for Medicare Patients

There are many different ways to measure cost including, but not limited to, approximations using hospital charges, conversions of charges to costs using cost-to-charge ratios, and estimations based on Medicare payments. **For this task, we have defined the “cost” of care as payments made for Medicare patients for a pneumonia episode of care.**

1.3. Measuring Pneumonia Payments

Pneumonia is one of the leading causes of hospitalization for Americans 65 and over and costs roughly \$10 billion in aggregate costs.³ It is a common condition in the elderly with a substantial range in payments due to different practice patterns. Furthermore, because 30-day all-cause mortality and readmission measures for pneumonia are already publicly reported, pneumonia serves as a model condition for assessing relative value for an episode of care that begins with an acute hospitalization. By

focusing on one specific condition, value assessments may provide actionable feedback to CMS and hospitals to incentivize targeted improvements in care.

1.4. Episode of Care

When considering payments to hospitals, we focused on a 30-day “episode of care” triggered by admission for several key reasons. First, hospitalizations represent a brief period of acute illness that requires ongoing management post-discharge. Second, decisions made at the admitting hospital affect not only the hospitalization payments, but payments for care in the immediate post-discharge period. Third, assessing payments for a continuous episode of care may reveal practice variations in the full care of the illness that triggered admission. For instance, lower inpatient payments may be counterbalanced by greater dependence on post-acute care, such as skilled nursing, in some regions. Such patterns would not be visible in an inpatient-only measure. Fourth, a 30-day preset window provides a standard observation period by which to compare all hospitals. Lastly, when pairing payments with quality, measures should be aligned as much as possible. Most publicly reported quality measures are reported for a 30-day period after admission or discharge (for example, CMS’s 30-day RSMR and RSRR for pneumonia).

Using the Chronic Condition Warehouse (CCW) data, we tracked payments for Medicare patients through the 30-day post-admission period. The CCW data are derived from Medicare claims in the Standard Analytic Files and contain payment information for all care settings, services, and supplies. The CCW data provide a unique opportunity to gain insight into a cascade of medical events triggered by pneumonia hospitalization and the payments associated with those events. The specific goal of this task is to sum payments for Medicare patients, including index admission as well as post-discharge payments, for: readmission or other post-discharge inpatient care, skilled nursing facilities, outpatient providers, home health agencies, hospice care, physician/clinical laboratory/ambulance services, and durable medical equipment, prosthetics/orthotics, and supplies. This work will be used to better understand differences in the patterns of post-discharge care and associated payments made for Medicare patients across a continuum of care beginning with a hospitalization for pneumonia and following patients 30 days after hospital admission.

1.5. Approach to Measure Development

We developed this measure in accordance with national guidelines and in consultation with clinical and measurement experts, key stakeholders, and the public. The proposed measure is consistent with the technical approach to outcomes measurement set forth in the National Quality Forum (NQF) guidance for outcomes measures,⁴ CMS’s Measure Management System (MMS),⁵ and the guidance articulated in the American Heart Association’s scientific statements, “Standards for Statistical Models Used for Public Reporting of Health Outcomes”⁶ and “Standards for Measures Used for Public Reporting of Efficiency in Health Care.”⁷ During the measure development process, we obtained expert and stakeholder input via two mechanisms: first, through regular discussions with an advisory working group, and second, through meetings with a national Technical Expert Panel (TEP).

We held regular conference calls with our working group throughout the measure development phase. The working group included clinicians and other professionals with expertise in cardiology, biostatistics, health economics, measure development, and quality improvement. The working group meetings addressed key issues surrounding measure development, including detailed discussions regarding

specific decisions (for example, defining the appropriate measure cohort) to ensure the methodological rigor of the measure.

In addition to the working group and in alignment with CMS's MMS, we convened a TEP consisting of a group of recognized experts and stakeholders in relevant fields to provide input and feedback during measure development. To form the TEP, we posted a public call for nominations and selected individuals representing a range of perspectives including those of physicians, health economists, consumers, hospitals, and purchasers. In contrast to the working group meetings, the TEP meetings followed a more structured format consisting of the presentation of key issues, relevant data, and our proposed approach. This presentation was followed by open discussion of these issues with TEP members.

We posted the measure specifications and a summary of the TEP discussions publicly, after which we underwent a 40-day public comment period. We collected these comments through the MMS website and summarized them for CMS. We also posted the comments verbatim on the MMS website. We considered all submitted comments during the final stages of measure development.

1.6. Aims of the Measure

The primary objective of this work is to develop a 30-day episode-of-care pneumonia payment measure that:

1. captures differences in the care provided by hospitals for patients with pneumonia,
2. accounts for differences in the care coordinated by hospitals immediately post-discharge,
3. removes variation in payments due to payment adjustments that are not directly related to clinical care (e.g., geography and policy adjustments),
4. adjusts for hospital case-mix,
5. assesses relative performance of hospitals, and
6. aligns with pneumonia quality measures.

Using administrative claims data, we measure risk-standardized payments for Medicare patients for an episode of care that begins with an index admission for pneumonia and ends 30 days after the index admission. The pneumonia payment measure captures payments for Medicare patients across multiple care settings, services, and supplies (inpatient, outpatient, skilled nursing facility, home health, hospice, physician/clinical laboratory/ambulance services, and durable medical equipment, prosthetics/orthotics, and supplies). We remove payment adjustments unrelated to clinical care decisions. By risk-standardizing the payment measure, we are able to adjust for the case mix at any given hospital and compare a specific hospital's pneumonia payment to an average hospital with a similar case mix. Key decisions in the development of the pneumonia payment measure are aligned with key decisions in CMS's 30-day pneumonia RSMR measure.

Our methodology is developed in accordance with accepted standards for outcomes measure development, including appropriate risk adjustment to allow for fair profiling of institutions and transparency of specifications.

Please note that for easy reference, we sometimes refer to the hospital-level, risk-standardized payment measure for a 30-day episode of care for pneumonia simply as the pneumonia payment measure in this document.

2. METHODS

2.1. Overview of Measure Methodology

We developed a hospital-level, risk-standardized payment measure for a 30-day episode of care for pneumonia. The measure comprises a single summary risk-standardized payment and uses index admissions from two years of CCW data (2008-2009) to assess hospital performance. This measure is intended to capture differences in payment for a 30-day episode of care for pneumonia at the hospital level. Payments for Medicare patients can vary for a number of reasons, including:

1. hospital practice patterns,
2. payment adjustments that reflect geography (e.g., paying different amounts for the same service in different parts of the country),
3. payment adjustments that reflect policies (e.g., indirect medical education and disproportionate share adjustments) that serve a broader mission of CMS, but do not reflect medical care, and
4. patient case mix.

To isolate payment variation that reflects practice patterns rather than CMS payment adjustments, we “strip” or “standardize” payments for each care setting. Stripping refers to removing geographic differences and policy adjustments in payment rates for individual services from the total payment for that service. Standardizing refers to averaging payments across geographic areas for those services where geographic differences in payment cannot be stripped. Stripping and standardizing the payments allows for a fair comparison across hospitals based solely on payments for decisions related to clinical care, as described in Section 2.5.

We adjust for case mix differences across hospitals by risk adjusting for patients’ comorbid conditions identified in claims for acute inpatient hospital stays, hospital outpatient care, and physician, radiology, and laboratory services for the 12 months prior to the index admission as well as select conditions indicated by secondary diagnosis codes on index admission. We do not risk adjust for diagnoses that may be complications of care during the index admission (Appendix A. Potential Complications in the Index Admission for Pneumonia Payment Model)

We used CMS Condition Category groups (CCs) to define the comorbid risk-adjustment variables. Additionally, we risk adjust for the patients’ age.

We use generalized linear modeling to estimate the risk-adjustment model and validate the model via a split-sample process. An additional year of data was used for temporal validation of the risk-adjustment model as well. We then use hierarchical generalized linear regression to isolate a hospital-specific payment signal and to account for the clustering of admissions within each hospital. Finally, we calculate predicted and expected payments (as defined in 35) for each hospital.

2.2. Dataset

The CCW data are derived from the Medicare claims in the Standard Analytic Files. The CCW data contain data from the Medicare fee-for-service (FFS) institutional and non-institutional claims, enrollment and eligibility information, and assessment data for up to 100% of the Medicare beneficiary population for particular conditions. The data are organized by predefined chronic conditions including

pneumonia, but can also be used to define individualized patient cohorts as described below. The annual CCW datasets include claims data from all seven standard files (inpatient, skilled nursing facility, outpatient, home health agency, hospice, carrier, and durable medical equipment) that can be linked across care settings, services, supplies, and years using a unique patient identifier. Specific information available in the CCW data includes diagnosis codes, procedure codes, quantity/units of services used, and payments made by CMS, patients, and other insurers to care providers. We describe our methodology for estimating payments for a pneumonia episode of care below.

2.3. Cohort

Although the CCW data make a pre-defined cohort of pneumonia available, to develop the measure **we created our own pneumonia cohort from the CCW 2008 and 2009 100% sample of FFS beneficiaries to be aligned with CMS's publicly reported 30-day pneumonia RSMR**. Consistent with CMS's 30-day pneumonia RSMR, the measure includes hospitalizations with a principal discharge diagnosis of pneumonia as classified by the International Classification of Diseases, Ninth revision, Clinical Modification (ICD-9-CM) codes 480.0, 480.1, 480.2, 480.3, 480.8, 480.9, 481, 482.0, 482.1, 482.2, 482.30, 482.31, 482.32, 482.39, 482.40, 482.41, 482.42, 482.49, 482.81, 482.82, 482.83, 482.84, 482.89, 482.9, 483.0, 483.1, 483.8, 485, 486, 487.0, and 488.11. A full description of ICD-9-CM codes in the final cohort can be found in Appendix B. An **index hospitalization** is the initial pneumonia admission that triggers the 30-day episode of care for this payment measure. The measure includes only those hospitalizations from short-stay acute care hospitals in the index cohort. The measure restricts the cohort to patients 65 and older and enrolled in FFS Medicare Parts A and B (with no Medicare Advantage coverage).

If a patient had more than one eligible index pneumonia admission in 2008 or 2009, a randomly selected pneumonia admission per year is included in the measure for two main reasons. First, repeated pneumonia hospitalizations for the same patient are not independent events. Including all pneumonia admissions from the same patient would introduce additional clustering of data within patients which can further complicate the analytic model. Second, this strategy is consistent with CMS's 30-day pneumonia RSMR. After randomly selecting the index admission, any subsequent hospitalizations (including additional pneumonia hospitalizations) within the 30-day post-admission period will be treated as readmissions as part of the first admission's episode of care.

Consistent with CMS's 30-day pneumonia RSMR, the measure considers admissions with transfers as a single inpatient hospitalization. To confirm the diagnosis, patients with pneumonia who transferred from one facility to another are required to have a principal discharge diagnosis of pneumonia at both hospitals. The measure does not include transfers directly from the emergency department (ED) to a second hospital in our transfer scenario because the CMS payment structure does not classify ED care as an inpatient admission. In these cases, the episode of care begins with an inpatient admission at the receiving hospital.

2.3.1. Index Cohort Exclusions

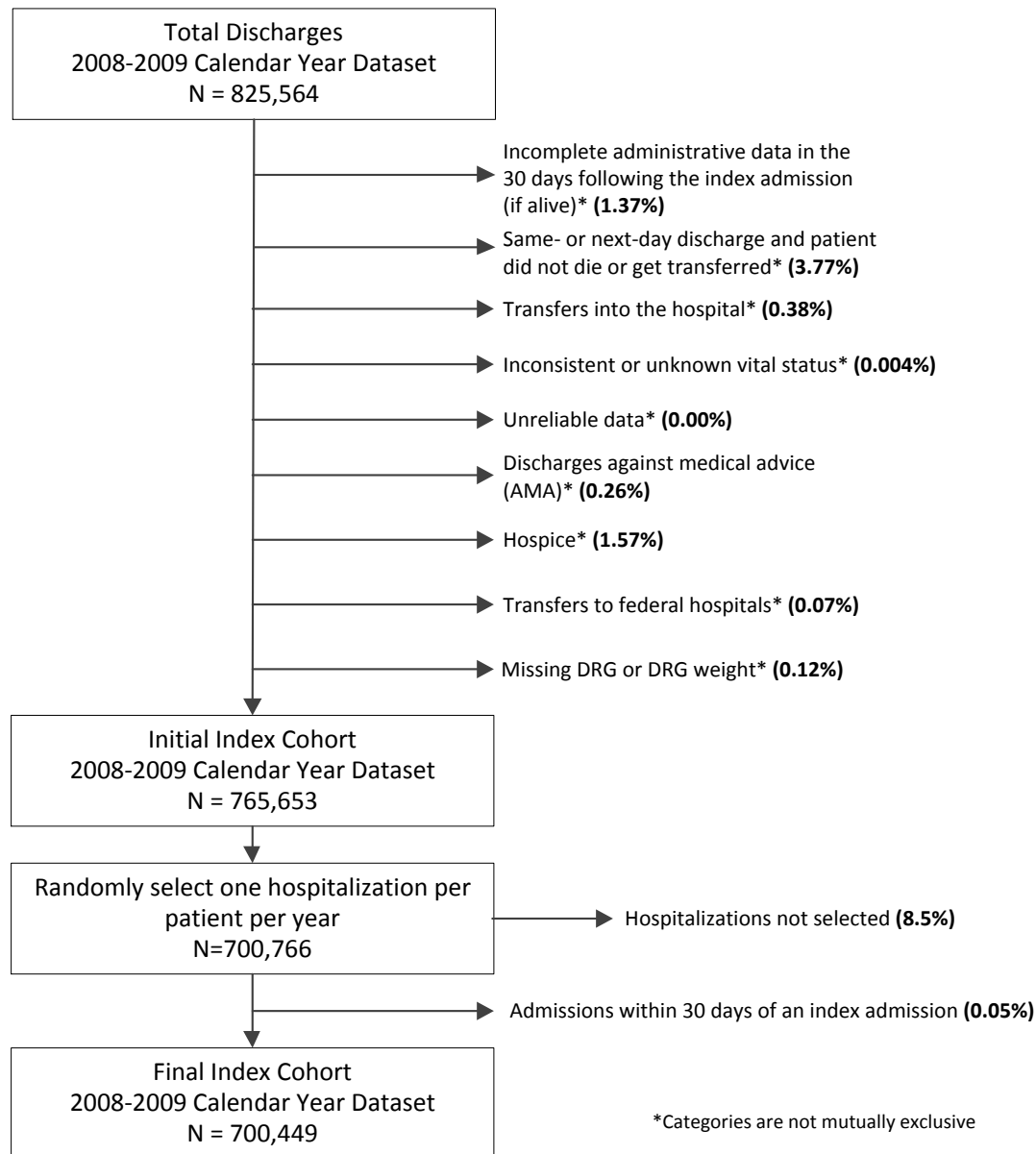
We applied several exclusion criteria to the cohort of index admissions as delineated below and in Figure 1:

- Hospitalizations for patients without at least 30 days of post-admission enrollment in FFS Medicare
Rationale: This is necessary in order to identify the outcome (payments) in the dataset over the analytic period.
- Hospitalizations for patients admitted and discharged on the same day (and not transferred or deceased)
Rationale: These patients likely did not suffer clinically significant pneumonia.
- Hospitalizations for patients transferred into the hospital
Rationale: The episode of care begins with the first admitting hospital. If a patient is transferred, the payments for that second hospitalization are counted as part of the full episode payment associated with the first admitting hospital. That is to say, transferred patients are included in the measure, but the accepting hospital is not considered an index stay.
- Hospitalizations for patients with claims that contain inconsistent or unknown vital status
Rationale: We exclude stays for patients that include inconsistent data (for example, date of death precedes date of admission).
- Hospitalizations for patients with claims that contain unreliable data
Rationale: We exclude stays for patients that include unreliable data (for example, age is greater than 115 or gender from enrollment data and claim are incongruent).
- Hospitalizations for patients discharged against medical advice (AMA)
Rationale: Hospitals had limited opportunity to implement high quality care.
- Hospitalizations for patients with hospice enrollment within one year prior to or on the date of an index admission
Rationale: This exclusion is made for CMS's 30-day pneumonia RSMR and allows the cohort to be as closely aligned with this measure as possible.
- Hospitalizations for patients transferred to federal hospitals
Rationale: We do not have claims data for these hospitals, so including these patients would cause payments to be underestimated.
- Hospitalizations for patients without a diagnosis related group (DRG) or DRG weight for their index hospitalization
Rationale: We cannot calculate a payment for these patients' index admission; this would make the entire episode of care appear substantially less expensive.

- Hospitalizations for patients with an index admission within 30 days of a previous index admission

Rationale: This exclusion criterion is applied after one admission per patient per year is randomly selected; therefore it is only applicable to the multi-year combined data.

Figure 1. Index Pneumonia Cohort for the 2008-2009 Calendar Year Sample



2.4. Outcome

The primary outcome of this measure is the hospital-level, risk-standardized payment for a pneumonia episode of care. The pneumonia payment measure captures payments for Medicare patients across

multiple care settings, services, and supplies (inpatient, outpatient, skilled nursing facility, home health, hospice, physician/clinical laboratory/ambulance services, and durable medical equipment, prosthetics/orthotics, and supplies). We remove payment adjustments unrelated to clinical care decisions. By risk standardizing the payment measure, we are able to adjust for case mix at any given hospital and compare a specific hospital's pneumonia payment to an average hospital with a similar case mix. We define our analytic timeframe as beginning with the index admission for pneumonia to 30 days post-admission.

2.4.1. 30-day Timeframe

We considered 30 days post-admission as a clinically reasonable time frame for multiple reasons:

- a. Within a 30-day time frame, payments are more likely attributable to care received during the index hospitalization and during the transition to the post-discharge setting.
- b. The 30-day preset window provides a standard observation period by which to compare all hospitals.
- c. The 30-day post-admission time frame is consistent with other CMS measures endorsed by the NQF and publicly reported by CMS, including CMS's 30-day pneumonia RSMR. We designed the pneumonia payment measure to align with CMS's 30-day pneumonia RSMR to facilitate assessments of health care value.

2.4.2. Prorating Payments

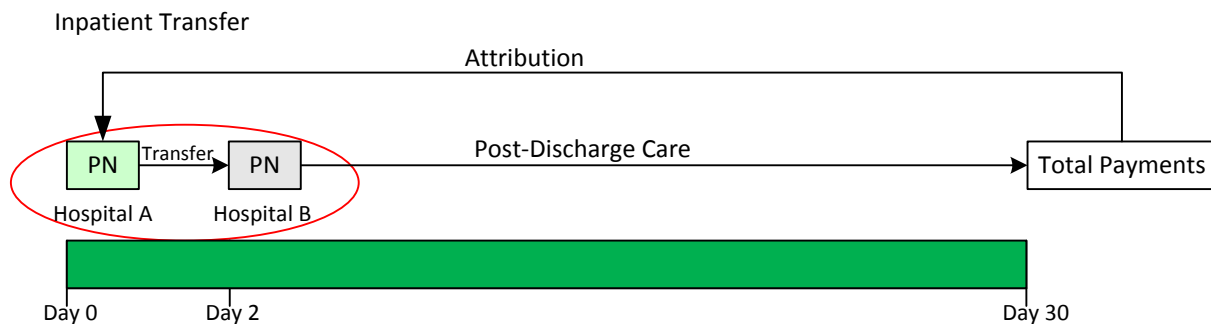
Some claims overlap the beginning or end date of the analytic timeframe. If a claim for payment began prior to the index admission but ended in the analytic timeframe, it was excluded from our calculation. If a claim for payment began within the analytic timeframe, but ended after the last date of our 30-day post-admission period, we prorated the payment for the claim over the days in the analytic timeframe (Appendix C).

2.4.3. Transfer Scenarios

Medicare reduces payments when patients are transferred to another inpatient prospective payment system (IPPS) hospital and have a length of stay at least one day fewer than the geometric mean length of stay for the DRG. Under this policy, transferring hospitals are paid a per diem rate. For stays at the transferring hospital that are equal to or greater than the geometric mean length of stay for the DRG, transferring hospitals receive a full DRG payment.⁸ We assign the per diem rate or the full DRG rate to the transferring hospital where applicable, and then add it to the payment for the hospital that received the transfer patient to calculate the payment for the index admission. We then aggregate total patient-level payments for each post-discharge care setting over the defined time period.

Because the episode of care begins at the time of index admission, we assign this combined inpatient payment along with any payments made for post-discharge care to the transferring hospital (Figure 2). This approach aligns with CMS's 30-day pneumonia RSMR.

Figure 2. Episode of Care for Transfer Patient



2.4.4. Removing Payment Adjustments

The overarching goal of the measure is to calculate payments that reflect differences in the care provided for patients with pneumonia rather than differences in payments based on geography (for example, cost of living and wage index) or policy adjustments (for example, indirect medical education and disproportionate share). Because these payment adjustments do not reflect the care delivered by hospitals, we remove geography and policy adjustments when calculating payments for each care setting, service, and supply by stripping or standardizing as described below.

2.5. Calculating Payments for Different Care Settings, Services, and Supplies

Medicare pays for health care services using a number of different payment systems that are generally organized by delivery setting (Appendix D). These payment systems consider not only the products the Medicare patient is buying in each setting, but also the characteristics of the care provider, the extent to which the same product may be furnished in different settings, and the market circumstances that affect providers' costs. Payment amounts within each payment system are usually updated annually (for example, the IPPS) with some fee schedules having quarterly updates (for example, Durable Medical Equipment/Prosthetics and Orthotics [DME/POS]). Information on CMS reimbursement rates for each care setting are made publicly available through either final rules published in the Federal Register or fee schedules provided on the CMS website. A summary of Medicare's reimbursement system for most care settings is publicly available at the Medicare Payment Advisory Committee (MedPAC) website.⁸ Below, we describe the key features of these payment systems and how we use these CMS payment algorithms to determine an episode-of-care payment for pneumonia that isolates clinical care decisions. Appendix D provides payment diagrams for all care settings along with our approach to stripping or standardizing payments.

2.5.1. Inpatient Care Settings

2.5.1.1. Acute Inpatient Hospitals

Medicare beneficiaries sometimes require hospitalization for an acute illness.

How Medicare Reimburses Acute Inpatient Hospitals

Medicare pays most acute inpatient hospitals through a prospective payment system (PPS). This system uses DRG-specific weights to calculate a payment above or below the fixed payment, known as the base payment rate (operating and capital), which reflects the cost (labor and non-labor) to deliver care to a patient for an average Medicare hospitalization. The DRG payment covers routine operating costs attributable to patient care, including nursing services, room and board, and diagnostic and ancillary services. In addition to the primary discharge diagnosis, DRGs account for up to eight secondary diagnoses and up to six procedures performed during the stay. Other factors that inform DRG assignment are age, gender, and discharge destination. CMS assigns a unique weight to each DRG indicating the relative costliness of inpatient treatment for patients in a given DRG. Conditions that involve greater resource utilization (usually associated with procedures, comorbidities, or complications) are assigned higher DRG weights.

Table 1 demonstrates the calculation of payments for the most frequent DRGs in our 2009 cohort. These DRGs are ordered by the amount of the DRG payment made to hospitals rather than by the frequency in our cohort.

Table 1. Most Frequent DRGs in Pneumonia Patients in 2009

| DRG | MS-DRG Title | Surgical | DRG Weight | Payment* | % of Index Admissions |
|-----|---|----------|------------|-------------|-----------------------|
| 207 | Respiratory system diagnosis w ventilator support 96+ hours | No | 5.1055 | \$28,348.70 | 1% |
| 981 | Extensive O.R. procedure unrelated to principal diagnosis w MCC | Yes | 5.0238 | \$27,895.05 | .5% |
| 166 | Other resp system O.R. procedures w MCC | Yes | 3.6912 | \$20,495.68 | 1% |
| 208 | Respiratory system diagnosis w ventilator support <96 hours | No | 2.1801 | \$12,105.18 | 1% |
| 177 | Respiratory infections & inflammations w MCC | No | 2.0393 | \$11,323.38 | 3% |
| 178 | Respiratory infections & inflammations w CC | No | 1.4983 | \$8,319.43 | 3% |
| 193 | Simple pneumonia & pleurisy w MCC | No | 1.4327 | \$7,955.18 | 28% |
| 179 | Respiratory infections & inflammations w/o CC/MCC | No | 1.0419 | \$5,785.23 | 1% |
| 194 | Simple pneumonia & pleurisy w CC | No | 1.0056 | \$5,583.67 | 39% |
| 195 | Simple pneumonia & pleurisy w/o CC/MCC | No | 0.7316 | \$4,062.27 | 21% |

* This amount is arrived at by multiplying the FY 2009 operating and capital base payment amounts by the DRG weight

Medicare makes a number of payment adjustments which affect the total payment for an inpatient stay. Three major categories of adjustments include geography, policy, and outlier payments. Medicare adjusts for differences across hospitals in cost of living (geographic factor) and labor costs (wage index). Policy adjustments can result in additional payments to reflect the cost of teaching medical trainees (indirect medical education) and providing care to low-income patients (disproportionate share). Finally, Medicare makes “outlier payments” for admissions when the hospital’s gross costs exceed a threshold amount that includes the DRG rate plus the amount payable for indirect medical education, disproportionate share payments, and a fixed dollar amount set annually by CMS. Outlier payments are not automatic: a hospital must make a specific request and must identify the actual cost associated with each outlier case.

Approach to Stripping Payments

In our calculation of payments for the index pneumonia hospitalization, we omit geographic factors and policy adjustments. We first multiply the operating and capital base payment rates by the DRG weight for each claim to arrive at our stripped payment. Medicare reduces payments when patients are transferred to another IPPS hospital and have a length of stay at least one day less than the geometric mean length of stay for the DRG. Under this policy, transferring hospitals are paid either a per diem rate or, for stays that are equal to or greater than the geometric mean length of stay for the DRG, a full DRG payment. When applicable, we include this rule in our payment calculation. We then add any applicable outlier payments (after removing any wage index adjustment) that hospitals receive for unusually high-cost claims where applicable.

2.5.1.2. Inpatient Psychiatric Facilities (IPFs)

Medicare beneficiaries sometimes require hospitalization for an acute psychiatric illness.

How Medicare Reimburses IPFs

Medicare pays IPFs through a PPS. Under the IPF PPS, federal per diem base rates are adjusted for geographic factors, patient characteristics (psychiatric DRG, age, comorbidities, and length of stay), and facility characteristics (urban/rural and indirect medical education). Additional payments are made to IPFs based on the presence of a qualifying ED, the number of electroconvulsive therapy (ECT) treatments furnished, and outlier payments for cases with very high costs.

Approach to Stripping Payments

We multiply the base payment by adjustments for the patients' psychiatric DRG, age, and comorbidities, and omit any adjustments for wage index, cost of living, or facility characteristics. We then account for length of stay, presence of an ED, and any ECT treatments to arrive at our stripped payment. We add outlier payments but remove the wage index adjustment for these payments where applicable.

2.5.1.3. Inpatient Rehabilitation Facilities (IRFs)

After a hospitalization, some patients need intensive inpatient rehabilitation services such as physical, occupational, or speech therapy. To qualify for treatment in an inpatient rehabilitation setting, patients must be able to tolerate and benefit from three hours of therapy per day. These settings may be freestanding hospitals or specialized, hospital-based units.

How Medicare Reimburses IRFs

Medicare pays IRFs through a PPS. Under the IRF PPS, the IRF base rate is adjusted for geographic factors, patient characteristics (case mix group), facility characteristics (urban/rural, disproportionate share, and indirect medical education), length of stay, and outlier payments. Case mix groups are informed primarily by the patient's condition (age, comorbidities, functional and cognitive statuses, and diagnoses requiring rehabilitation). Each case mix group has a national relative weight reflecting the expected relative costliness of treatment for patients in that specific case mix group compared with the average Medicare inpatient rehabilitation patient.

Approach to Stripping Payments

We multiply the base payment rate by the case mix group weight and omit any adjustments for wage index or facility characteristics. We then adjust for length of stay to arrive at our stripped payment. Where applicable, we add outlier payments but remove the wage index adjustment for these payments.

2.5.1.4. Long Term Care Hospitals (LTCHs)

Patients with clinically complex problems, such as multiple acute or chronic conditions, may need hospital care for extended periods of time. LTCHs must have an average Medicare length of stay greater than 25 days.

How Medicare Reimburses LTCHs

Medicare pays LTCHs through a PPS. Under the LTCH PPS, the LTCH base rate is adjusted for geographic factors, patient characteristics (Medicare severity long-term care [MS-LTC]-DRG), length of stay, and outlier payments. MS-LTC-DRGs are informed primarily by the patient's condition (age, gender, principal and secondary diagnoses, procedures, and discharge status). Each MS-LTC-DRG has a national relative weight reflecting the expected relative costliness of treatment for patients in that specific LTC-DRG compared with the average Medicare LTC patient.

Approach to Stripping Payments

We multiply the base payment rate by the MS-LTC-DRG weight and omit any adjustments for wage index. We then adjust for length of stay to arrive at our stripped payment. Where applicable, we add outlier payments but remove the wage index adjustment for these payments.

2.5.2. Outpatient Care Settings

Medicare pays for some outpatient services under the Outpatient Prospective Payment System (OPPS), including most hospital-based outpatient services. Outpatient services that do not fall under the OPPS are reimbursed using other fee schedules or payment systems (e.g., Medicare Clinical Diagnostic Laboratory Fee Schedule) as detailed later in this document.

2.5.2.1. Hospital Outpatient Services and Community Mental Health Centers (CMHCs)

Medicare beneficiaries receive a wide range of services in hospital outpatient departments. These vary from simple injections to complex procedures requiring anesthesia, and can include emergency room visits as well as observation stays. CMHCs provide outpatient as well as partial hospitalization services to Medicare beneficiaries, including physician services, psychiatric nursing, counseling, and social services.

How Medicare Reimburses Hospital Outpatient Services and CMHCs

Medicare pays for most hospital outpatient services provided to Medicare beneficiaries using the OPPTS. Partial hospitalization services furnished by CMHCs are also reimbursed under the OPPTS. All services are paid according to ambulatory payment classifications (APCs), which group services according to similar clinical characteristics and in terms of resources required. Healthcare common procedure coding system (HCPCS) codes are grouped into over 500 APCs. Each APC is weighted and has a prospective payment amount associated with it. APC payments may be discounted when certain services or procedures, such as bilateral procedures, are provided.

A conversion factor (similar to a base payment) is multiplied by a wage index to account for geographic variations in hospitals' labor costs. This number is then multiplied by the APC relative weight. In addition, add-ons such as pass-through payments for new drugs and technical devices, outlier payments for high-cost services, and hold harmless payments for certain hospitals are applied.

Approach to Stripping Payments

We multiply the conversion factor by the APC weight and omit any adjustments for wage index. We then account for reduced or discontinued procedures, where applicable, as well as unit count to arrive at our OPPTS stripped payment. We do not include pass-through payments for new drugs and technical devices or hold harmless payments for certain hospitals. For outpatient hospital services not paid under the OPPTS, we apply the clinical lab fee schedule, ambulance fee schedule, physician fee schedule, DME/POS/PEN fee schedule, and Part B drug fee schedule where applicable. Also, where applicable, we add outlier payments but remove the wage index adjustment for the payments.

2.5.2.2. Comprehensive Outpatient Rehabilitation Facilities (CORFs) and Outpatient Rehabilitation Facilities (ORFs)

Outpatient therapy services include physical therapy, occupational therapy, and speech-language pathology services. Medicare covers these services if they are furnished by a skilled professional, are appropriate and effective for a patient's condition, and are reasonable in terms of frequency and duration. The beneficiary must be under the care of a physician, have a treatable condition, and be improving.

How Medicare Reimburses CORFs and ORFs

Medicare pays for outpatient rehabilitation therapy according to fees established in the physician fee schedule. Under this fee schedule, a conversion factor set by Medicare is adjusted for complexity of service/expense as well as geographic factors. The unit of payment is each individual service. All services are classified and reported to CMS according to their HCPCS code. Payment rates are based on relative values units (RVUs), which account for the relative costliness of the following components of the service provided: clinician's work, practice expenses, and malpractice insurance. A separate geographic practice cost index (GPCI) for each of these work components reflects geographic differences in these costs in the market where the service is rendered.

Approach to Stripping Payments

We multiply the conversion factor by the work RVU, transitioned non-facility practice expense RVU, and malpractice insurance RVU weights and omit any adjustments for work GPCI, non-facility practice expertise GPCI, and/or malpractice insurance GPCI to arrive at our stripped payment.

2.5.2.3. Renal Dialysis Facilities (RDFs)

Individuals with end-stage renal disease require dialysis or renal transplant to survive. Medicare pays for both hemodialysis and peritoneal dialysis.

How Medicare Reimburses RDFs

Medicare pays dialysis providers a predetermined composite rate that is intended to cover the bundle of services, tests, certain drugs, and supplies required for either facility-based or home-based dialysis treatments. The composite rate is then adjusted for geographic factors. A drug add-on further supplements the payment, and CMS provides an additional adjustment for case mix using a patient's age, body surface area, and body mass index. Facility-based payments are capped at an amount equal to three dialysis sessions per week; however, home-based dialysis may be provided more frequently.

Approach to Stripping Payments

Given that renal dialysis payment rates are adjusted by patient-specific body measurements that are not available in our data, we begin with the actual payment made to an RDF for patient care (including patient out-of-pocket payments) and remove payment adjustment attributable to wages using the RDF wage index published by CMS.

2.5.2.4. Rural Health Clinics (RHCs)

RHCs are clinics that are located in areas designated by the Bureau of the Census as rural, and by the Secretary of the Department of Health and Human Services as

underserved. Services rendered by approved RHCs to Medicare beneficiaries are covered under Medicare.

How Medicare Reimburses RHCs

Payments to RHCs for covered services furnished to Medicare patients are made by an all-inclusive rate for each visit. This rate includes services from providers as well as supplies. Each year Congress determines this RHC per visit payment limit.

Approach to Stripping Payments

We begin with the actual payment made to an RHC for patient care and remove payment adjustment attributable to wages using the skilled nursing facility (SNF) state-specific rural wage index published by CMS.

2.5.2.5. Federally Qualified Health Clinics (FQHCs)

FQHCs provide access to primary care in areas where primary care resources are constrained. FQHCs are required to be community-centered and either not-for-profit or public organizations that emphasize coordination of care.

How Medicare Reimburses FQHCs

Payments are made much like they are made to RHCs. FQHC payments are an all-inclusive per visit amount based on reasonable costs. The FQHC payment methodology includes one urban and one rural payment limit.

Approach to Payments

Given the resources necessary to determine whether each FQHC is located in a rural or urban area, we did not adjust for wages in the current data. We use the total payment received by the FQHC as the payment for a FQHC claim.

2.5.2.6. Ambulatory Surgical Centers (ASCs)

ASCs are distinct facilities that furnish only ambulatory surgery.

How Medicare Reimburses ASCs

Medicare pays ASCs through a PPS. The unit of service is the individual surgical procedure. All services are paid according to APCs, which group services according to similar clinical characteristics and in terms of resources required. Each APC is weighted and has a prospective payment amount associated with it. APC payments may be discounted when certain services or procedures, such as bilateral procedures, are provided.

A conversion factor (similar to a base payment) is multiplied by a wage index to account for geographic variations in ASCs' labor costs. This number is then multiplied by the APC relative weight.

Approach to Stripping Payments

We begin with the conversion factor, omit any adjustments for wage index, multiply by the APC weight, multiply by the unit count, and make adjustments for multiple, reduced, or continued procedures where applicable.

2.5.2.7. Laboratory Services

Clinical lab services are tests on specimens taken from the human body (e.g., blood or urine) and used to help physicians diagnose or assess health.

How Medicare Reimburses Laboratory Services

Medicare pays for laboratory services using state-specific fee schedules. Individual lab services are identified by a HCPCS code.

Approach to Standardizing Payments

For each lab service on the clinical diagnostic laboratory fee schedule, we calculate the standard unit payment by taking the average of the payments across all states. We then multiply the average payment for a particular service by the unit count for that service. For lab services reimbursed under the automated multi-channel chemistry code, we use the total payment received by the lab.

2.5.2.8. Ambulance Services

Medicare beneficiaries sometimes require ambulance services for transportation.

How Medicare Reimburses Ambulance Services

Medicare pays for ambulance services using a fee schedule that pays separately for type of mileage (ground or air) and level of support (based on RVUs) provided during the trip. Reimbursements are also adjusted for geographic differences in labor cost, as well as for service within urban or rural locations. Mileage type and level of support are indicated on the ambulance fee schedule by HCPCS code.

Approach to Standardizing Payments

We first calculate the average of the urban and rural mileage rates for each type of mileage at each level of ambulance service support for each state, and use these average state mileage and service rates to calculate a national average mileage and service rate for each HCPCS code. We then multiply this national average rate by the unit count.

2.5.2.9. Part B Drugs

Medicare makes payments for drugs or biologicals that are administered by infusion or injection and not usually self-administered.

How Medicare Reimburses Part B Drugs

Medicare pays for Part B prescription drugs using a national fee schedule (i.e., there is no variation from state to state).

Approach to Payments

We assign the national fee schedule amount to all Part B Drug claims and multiply this amount by the unit count.

2.5.3. Other Care Settings

2.5.3.1. Skilled Nursing Facilities (SNFs)

Beneficiaries who need short-term skilled care on an inpatient basis following a hospital stay of at least three days are eligible to receive covered services in a SNF.

How Medicare Reimburses SNFs

Medicare pays for SNFs through a PPS. Under the SNF PPS, Medicare assigns a different per diem base payment rate to SNFs based on their urban or rural status for each of three components of care: a nursing component, a therapy component, and a non-case mix-adjusted component reflecting the costs of room and board and administrative services. Daily payments to SNFs are then determined by adjusting the base payment rates for geographic differences in labor cost and by adjusting the nursing component and therapy components of the base payment rates by patient characteristics (resource utilization groups [RUG]). RUGs are informed primarily by the patient's condition (comorbidities, activities of daily living score, therapy, and service use) and are intended to group patients with similar expected service needs. Each RUG has a nursing relative weight and a therapy relative weight reflecting the expected relative costliness of treatment for patients in that specific RUG compared with the average Medicare beneficiary in a SNF. In addition, SNFs receive a 128% increase in the Medicare PPS per diem payment for patients with acquired immunodeficiency syndrome (AIDS).

Approach to Standardizing Payments

We average the urban and rural SNF per diem base rates, multiply by the RUG weights, and omit adjustment factors for the wage index. We then multiply this number by the number of days the patient is in a SNF and add a 128% AIDS adjustment if applicable. For critical access hospitals' swing-bed SNF claims, we use the total payment received by the

SNF and remove the portion of the payment attributable to wage differences across geographic locations using the SNF state-specific rural wage index published by CMS.

2.5.3.2. Home Health Agencies (HHAs)

Beneficiaries who are generally confined to their homes and need skilled care from a nurse, physical therapist, or speech therapist on a part-time or intermittent basis are eligible to receive certain medical services at home. Covered services delivered by HHAs include: skilled nursing care; physical occupational, and speech therapy; medical social work; and home health aide services.

How Medicare Reimburses HHAs

Medicare pays HHAs using a PPS and purchases home health services in units of 60-day episodes. Under the HHA PPS, Medicare assigns a base payment rate which is first adjusted for geographic factors and then adjusted for patient characteristics (by assigning each patient to a home health resource group [HHRG]). HHRG assignments are based on clinical and functional status as well as service use, and have a national relative weight reflecting the costliness of patients in that group compared with the average Medicare home health patient. Adjustments are also made for patients who receive fewer than five home health visits, are transferred to another HHA, or are discharged and readmitted to the same HHA within the 60-day time frame. Further adjustments are made for outlier payments and non-routine medical supplies. When there are fewer than five home health visits in the 60-day time frame, Medicare pays HHAs using the Low Utilization Payment Adjustment (LUPA) per visit rate, which is discipline-specific and depends on whether the visit was for home health aide, medical social services, occupational therapy, physical therapy, skilled nursing, or speech language pathology therapy. HHAs receive an add-on for LUPA episodes that occur as initial episodes in a sequence of adjacent episodes, or as the only episode.

Approach to Stripping Payments

We multiply the base payment by the HHRG weight and omit adjustment factors for the wage index. We then modify this total if the patient is transferred to another HHA or discharged and readmitted to the same HHA before 60 days. We then add any DME/POS/Oxygen add-ons or outlier payments (after removing the wage index adjustment) when applicable. For patients with fewer than five home health visits in the 60-day time frame, we apply the LUPA per visit payment rates with LUPA add-ons when applicable.

2.5.3.3. Hospice

Terminally ill beneficiaries, defined as having a life expectancy of six months or less, may receive hospice care. Hospice benefits cover a wide range of services including: physicians, skilled nursing, counseling, medical social services, drugs for pain control and

symptom management, physical, occupational, and speech therapy, home health aides, and inpatient respite care.

How Medicare Reimburses Hospice

Medicare pays hospices for each day a beneficiary is eligible and under hospice care regardless of the amount of services provided on any given day. Payments are made according to a fee schedule that has individual base payment amounts for four categories of care: routine home care, continuous home care, inpatient respite care, and general inpatient care. Each hospice payment rate is then adjusted for geographic factors. Routine home care, inpatient respite care, and general inpatient care are paid the geographically-adjusted daily rate. Continuous home care is paid a geographically-adjusted hourly rate when care is delivered during a period of crisis and is provided in the home for eight or more hours in a 24-hour period beginning at midnight. Any applicable physician fees are added to the total hospice payment.

Approach to Stripping Payments

For continuous home care, we divide the base payment by 24 hours and multiply it by the number of hours of care and add any physician fees where applicable. For routine home care, inpatient respite care, and general inpatient care, we multiply the base payment by the number of days of care and add any applicable physician fees.

2.5.4 Physicians, Physician Extenders, and Social Work Services

Medicare beneficiaries sometimes require the care of physicians or physician extenders for a number of different clinical services.

How Medicare Reimburses Physician, Physician Extenders, and Social Work Services

Medicare uses a fee schedule based on a list of services and their corresponding payment rates to compensate individual providers. Medicare pays a higher physician fee for services provided in non-facility settings, such as physicians' offices, and a lower physician fee for services furnished in facilities, such as hospitals. Physician fees are lower in facility settings because physicians' practice costs are generally lower in facilities. Also, in this case, Medicare pays both the facility and the physician. Each service has a weight, or RVU, that measures the relative costliness of three components of resources used to provide physician services: physician work, practice expenses, and malpractice insurance.

Medicare also uses three GPCIs to adjust for geographic factors related to physician work, practice expenses, and malpractice insurance, respectively. To arrive at the payment amount a conversion factor is multiplied by the total of the RVU weight multiplied by the GPCI weight for each type of resource. Adjustments are then made for certain circumstances such as multiple surgical procedures performed on the same day for the same patient, preoperative and postoperative management without surgical care, or bilateral surgery. Adjustments in payment

are also made for care given by non-physicians, such as physician assistants and clinical social workers.

Approach to Stripping Payments

For services provided in a facility setting (for example, the hospital outpatient department), we multiply the conversion factor by the work RVU, transitioned facility practice expense RVU, and malpractice insurance RVU weights, and omit any adjustments for work GPCI, facility practice expertise GPCI, and/or malpractice insurance GPCI. For services provided in a non-facility setting (for example, a physician's office), we multiply the conversion factor by the work RVU, transitioned non-facility practice expense RVU, and malpractice insurance RVU weights, and omit any adjustments for work GPCI, non-facility practice expertise GPCI, and/or malpractice insurance GPCI. We then adjust this total for the circumstances listed in the paragraph above and make any adjustments for care given by non-physicians. This adjusted payment amount is then multiplied by the unit count of the service provided.

2.5.5 Durable Medical Equipment/Prosthetics and Orthotics/Parenteral and Enteral Nutrition (DME/POS/PEN)

Beneficiaries who require medical equipment, prosthetics, orthotics, other supplies, or parenteral and enteral nutrition to treat their illness receive it through DME/POS/PEN.

How Medicare Reimburses DME

Medicare pays for DME/POS/PEN using a combination of state-specific fee schedules (for DME/POS) and a national fee schedule (for PEN).

Approach to Standardizing Payments

For DME/POS claims, we average the payment rate across the state for each item (identified by HCPCS code) on the fee schedule. Where applicable, we adjust the payment rates for new, used, or rental equipment. We then multiply by the unit count. If a patient receives Part B drugs in conjunction with DME, we add the Part B drug payment.

For PEN claims, we assign items the amounts specified in the national fee schedule.

2.6. Model Development and Validation Samples

For model development, we used the full 2008 and 2009 calendar years 100% sample of pneumonia patients to derive the cohort. To define the outcome, we used the full calendar years of 2008 and 2009 as well as January 2010 data to cover the 30-day episode-of-care period for index admissions in December 2009. All final model results presented in Sections 3.2 and 3.3 were produced using this sample. To determine variables for inclusion in the model (variable selection), we used a randomly selected 50% sample of the full 2009 sample (Sample A1). We used the other half of the full 2009 sample (Sample A2) and full 2008 sample (Sample B) to assess model validity. Table 2 summarizes the different data samples and their purposes.

Table 2.2008-2009 Pneumonia Payment Model Development and Validation Samples*

| Sample | % of Total Sample | Purpose |
|----------------------------|---------------------------------|---|
| Sample A (Full Sample) | 100% 2009 | Development (cohort, outcome definition, and determination of functional form of risk-adjustment model) |
| Sample A1 (Development) | 50% 2009 (randomly selected) | Development (variable selection; validity testing) |
| Sample A2 (Validation) | 50% 2009 (remaining 50%) | Development (validity testing) |
| Sample B (Validation) | 100% 2008 | Development (cohort, outcome definition, and validity testing) |

2.7. Approach to Risk Adjustment

The goal of risk adjustment for this measure is to account for patient age and comorbid conditions that are clinically relevant and have strong relationships with the outcome, while illuminating important quality differences between hospitals.

Comorbidities for inclusion in risk adjustment are identified in administrative claims during the 12 months prior to and including the index admission. To assemble the more than 15,000 ICD-9 codes into clinically coherent variables for risk adjustment, the measure employs the publicly available CMS CCs to group ICD-9 codes into CCs,⁹ and selects comorbidities on the basis of clinical relevance and statistical significance.

The measure does not adjust for the patient's admission source or discharge disposition (for example, a skilled nursing facility) because these factors are associated with the structure of the health care system and the different care patterns the measure seeks to illuminate. Because hospitals should not be held to different standards of care based on the demographics of their patients, the measure does not adjust for socioeconomic status (SES), gender, race, or ethnicity. Variation in payments associated with these characteristics may indicate differences in the care provided to vulnerable populations, and adjusting for these factors would obscure these disparities. The measure does not adjust for hospital characteristics either (for example, teaching status), since this would hold different types of hospitals to different standards, and because such characteristics may exist on a causal pathway to the outcome rather than act as confounders. This approach is consistent with NQF guidelines.¹⁰

2.7.1. Complications of Hospitalization

Complications occurring during hospitalization are not comorbid illnesses and may reflect hospital quality of care; therefore, they should not be used for risk adjustment. Although adverse events during hospitalization may increase the payments for a pneumonia episode of care, including them as covariates in a risk-adjusted model could obscure payment differentials related to the quality of care delivered by hospitals. YNNHSC/CORE has previously reviewed every CMS-CC and identified those which, if they only occur during the index hospitalization, would be considered potential complications rather than comorbidities. For example, fluid,

* 2008 payments were inflation adjusted to 2009 dollars

electrolyte or base disorders; sepsis; and acute liver failure are CMS-CCs that could potentially be complications of care (Appendix A).

2.7.2. Case Mix Adjustment: Candidate Comorbid Risk Variables

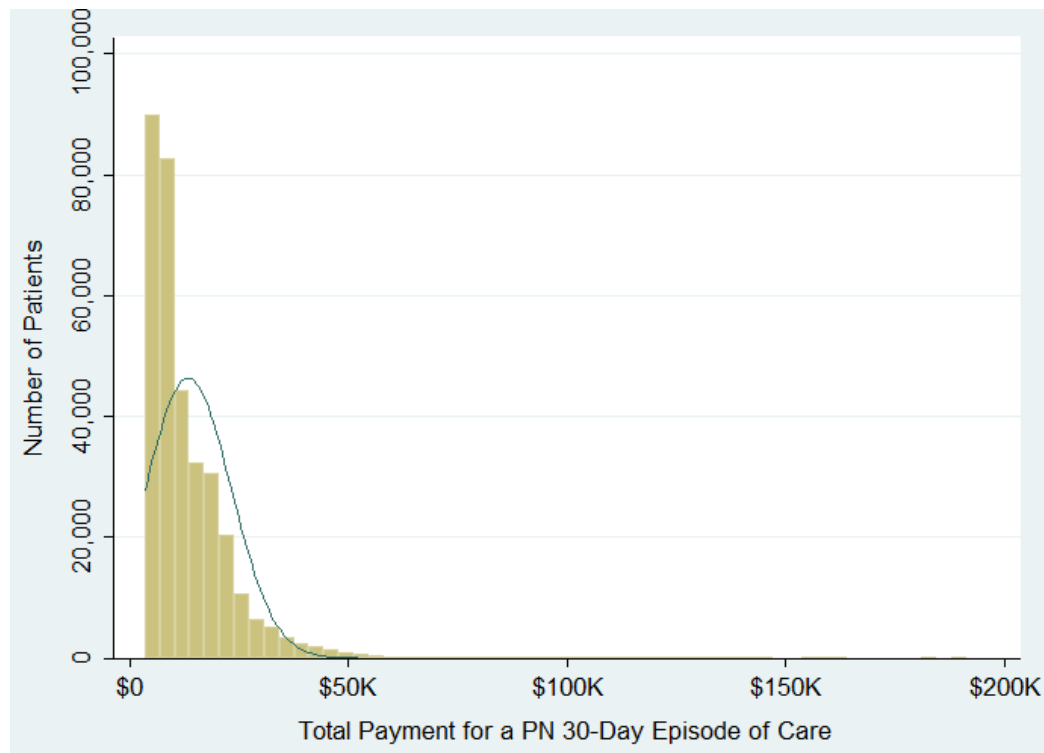
Our goal was to develop a parsimonious model that accounted for differences in patient case mix at the time of index admission that were strongly associated with total payment for a pneumonia 30-day episode of care. The candidate variables for the model were derived from secondary diagnoses of the index hospital stay (excluding potential complications), inpatient data, outpatient hospital data, and carrier files for physician, radiology and laboratory services during the 12 months prior to the index hospital stay.

To select candidate variables, we started with the 189 CCs. We used the ICD-9-to-CC assignment map, which is maintained by CMS and posted on the [QualityNet](#) website. A team of clinicians reviewed all 189 CCs and excluded those that were not relevant to the Medicare population or not clinically relevant to the pneumonia payment outcome (for example, attention deficit disorder and female infertility). Some of these CCs were combined into clinically coherent groups. The remaining clinically relevant CCs, along with age, were selected as candidate comorbid risk variables. A complete list of candidate variables is presented in Table 3.

2.7.3 Case Mix Adjustment: Choice of Functional Form

As is typical with data for healthcare payments, our dependent variable – total payment for a pneumonia 30-day episode of care – is both right-skewed and leptokurtotic (skewness= 2.9; kurtosis = 18.5). This is illustrated in Figure 3. To address estimation problems that can arise with non-normally distributed data, we employed the algorithm suggested by Manning & Mullahy.¹¹ Using this algorithm and Sample A, we compared several alternative models in order to determine the best estimation approach. Based on these assessments, we chose to estimate a generalized linear model with a log link and a Poisson distribution.

Figure 3. Distribution of Unadjusted Patient-Level Total Payments for a Pneumonia 30-Day Episode of Care (2009 Sample A; N=334,913 Patients)



2.7.4. Final Variable Selection

To inform variable selection, we performed a modified approach to stepwise generalized linear model regression. We used Sample A1 to create 1,000 bootstrap samples. For each sample, we ran a generalized linear model that included all candidate variables. Specifically, let Y_{ij} denote the outcome (i.e., total payment for a pneumonia 30-day episode of care) for the j^{th} patient admitted to the i^{th} hospital; and \mathbf{Z}_{ij} denotes the candidate risk factors where $\mathbf{Z}_{ij} = (Z_{1ij}, Z_{2ij}, \dots, Z_{pij})$ is a set of p patient-specific variables (e.g., age, comorbid conditions). Let I denote the total number of hospitals and n_i the number of index patient stays in hospital i . We assume the outcome is related linearly to the risk factors via a known link function, $h(\cdot)$, as follows:

$$h(Y_{ij}) = \alpha + \beta \mathbf{Z}_{ij} \quad (1)$$

In our case, $h(\cdot)$ is the log link, and we assumed a Poisson distribution for the outcome. We estimated these generalized linear models using the SAS software system (SAS 9.3 GENMOD procedure).

The results were summarized to show the percentage of times that each of the candidate variables was significantly associated with pneumonia payment (at the $p < 0.05$ level) in the 1,000 bootstrap samples (for example, 70% would mean that the candidate variable was significant at

p<0.05 in 70% of the bootstrap samples). We also assessed the direction and magnitude of the regression coefficients.

The working group reviewed these results and decided to retain all risk-adjustment variables above a 90% cutoff (in other words, to retain variables that were significant at the p<0.05 level in at least 90% of the bootstrap samples). We chose the 90% cutoff because variables above this threshold demonstrated a relatively robust association with pneumonia payment and were clinically relevant. The final risk-adjustment pneumonia payment model included 48 variables (Table 4).

Table 3.2009 Pneumonia Payment Model Candidate Variables

| Category | Variable | CC |
|-------------------|--|-----------------|
| Demographics | Age (65 – 74) | N/A |
| Demographics | Age (75 – 84) | N/A |
| Demographics | Age (>=85) | N/A |
| Cardiovascular | Respirator Dependence/Respiratory Arrest/Cardiorespiratory Failure | 77-79 |
| Cardiovascular | Congestive Heart Failure | 80 |
| Cardiovascular | Acute Coronary Syndrome | 81-82 |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction | 83 |
| Cardiovascular | Coronary Atherosclerosis/Other Chronic Ischemic Heart Disease | 84 |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic | 85 |
| Cardiovascular | Valvular and Rheumatic Heart Disease | 86 |
| Cardiovascular | Congenital Cardiac/Circulatory Defect | 87-88 |
| Cardiovascular | Hypertensive Heart Disease and/or Renal Disease or Encephalopathy | 89-90 |
| Cardiovascular | Hypertension | 91 |
| Other Comorbidity | History of Infection | 1, 3-5 |
| Other Comorbidity | Septicemia/Shock | 2 |
| Other Comorbidity | Other Infectious Diseases | 6 |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia | 7 |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers | 8 |
| Other Comorbidity | Lymphatic, Head And Neck, Brain, and Other Major Cancers | 9 |
| Other Comorbidity | Breast, Prostate, Colorectal and Other Cancers and Tumors | 10 |
| Other Comorbidity | Other Respiratory and Heart Neoplasms | 11 |
| Other Comorbidity | Other Digestive and Urinary Neoplasms | 12 |
| Other Comorbidity | Other Neoplasms | 13 |
| Other Comorbidity | Benign Neoplasms of Skin, Breast, Eye | 14 |
| Other Comorbidity | Diabetes and DM Complications | 15-19, 119, 120 |
| Other Comorbidity | Protein-Calorie Malnutrition | 21 |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders | 22 |
| Other Comorbidity | Disorders of Fluid/Electrolyte/Acid-Base | 23 |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids | 24 |
| Other Comorbidity | Liver Disease | 25-28 |
| Other Comorbidity | Other Hepatitis and Liver Disease | 29 |
| Other Comorbidity | Gallbladder and Biliary Tract Disorders | 30 |
| Other Comorbidity | Intestinal Obstruction/Perforation | 31 |
| Other Comorbidity | Pancreatic Disease | 32 |

| Category | Variable | CC |
|-------------------|--|-------------------------|
| Other Comorbidity | Inflammatory Bowel Disease | 33 |
| Other Comorbidity | Peptic Ulcer, Hemorrhage, Other Specified Gastrointestinal Disorders | 34 |
| Other Comorbidity | Appendicitis | 35 |
| Other Comorbidity | Other Gastrointestinal Disorders | 36 |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis | 37 |
| Other Comorbidity | Rheumatoid Arthritis and Inflammatory Connective Tissue Disease | 38 |
| Other Comorbidity | Disorders of The Vertebrae and Spinal Discs | 39 |
| Other Comorbidity | Osteoarthritis of Hip or Knee | 40 |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders | 41 |
| Other Comorbidity | Musculoskeletal and Connective Tissue Disorders | 42-43 |
| Other Comorbidity | Severe Hematological Disorders | 44 |
| Other Comorbidity | Disorders of Immunity | 45 |
| Other Comorbidity | Coagulation Defects and Other Specified Hematological Disorders | 46 |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease | 47 |
| Other Comorbidity | Delirium and Encephalopathy | 48 |
| Other Comorbidity | Dementia and Senility | 49-50 |
| Other Comorbidity | Drug/Alcohol Dependence/Psychosis | 51-52 |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence | 53 |
| Other Comorbidity | Major Psychiatric Disorders | 54-56 |
| Other Comorbidity | Personality Disorders | 57 |
| Other Comorbidity | Depression/Anxiety | 58-59 |
| Other Comorbidity | Other Psychiatric Disorders | 60 |
| Other Comorbidity | Mental Retardation or Developmental Disability | 61-65 |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation | 67-69, 100-101, 177-178 |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy | 70-71 |
| Other Comorbidity | Multiple Sclerosis and Parkinson's | 72-73 |
| Other Comorbidity | Seizure Disorders and Convulsions | 74 |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage | 75 |
| Other Comorbidity | Mononeuropathy, Other Neurological Conditions/Injuries | 76 |
| Other Comorbidity | Arrhythmias | 92-93 |
| Other Comorbidity | Other and Unspecified Heart Disease | 94 |
| Other Comorbidity | Stroke | 95-96 |
| Other Comorbidity | Precerebral Arterial Occlusion and Transient Cerebral Ischemia | 97 |
| Other Comorbidity | Cerebrovascular Disease and Aneurysm | 98-99 |
| Other Comorbidity | Cerebrovascular Disease and Late Effects | 102-103 |
| Other Comorbidity | Vascular or Circulatory Disease | 104-106 |
| Other Comorbidity | Cystic Fibrosis | 107 |
| Other Comorbidity | COPD | 108 |
| Other Comorbidity | Fibrosis of Lung or Other Chronic Lung Disorder | 109 |
| Other Comorbidity | Asthma | 110 |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias | 111 |
| Other Comorbidity | Pneumococcal Pneumonia, Emphysema, Lung Abscess | 112 |
| Other Comorbidity | Viral and Unspecified Pneumonia, Pleurisy | 113 |
| Other Comorbidity | Pleural Effusion/Pneumothorax | 114 |
| Other Comorbidity | Other Lung Disorders | 115 |
| Other Comorbidity | Legally Blind | 116 |

| Category | Variable | CC |
|-------------------|---|--------------|
| Other Comorbidity | Major Eye Infections/Inflammations | 117 |
| Other Comorbidity | Retinal Detachment | 118 |
| Other Comorbidity | Retinal Disorders, Except Detachment and Vascular Retinopathies | 121 |
| Other Comorbidity | Glaucoma | 122 |
| Other Comorbidity | Other Eye Disorders | 124 |
| Other Comorbidity | Significant Ear, Nose, and Throat Disorders | 125 |
| Other Comorbidity | Hearing Loss | 126 |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders | 127 |
| Other Comorbidity | All Major Organ Transplants | 128, 174-175 |
| Other Comorbidity | Dialysis Status | 130 |
| Other Comorbidity | Renal Failure | 131 |
| Other Comorbidity | Nephritis | 132 |
| Other Comorbidity | Urinary Obstruction And Retention | 133 |
| Other Comorbidity | Incontinence | 134 |
| Other Comorbidity | Urinary Tract Infection | 135 |
| Other Comorbidity | Other Urinary Tract Disorders | 136 |
| Other Comorbidity | Pelvic Inflammatory Disease | 138 |
| Other Comorbidity | Other Female Genital Disorders | 139 |
| Other Comorbidity | Male Genital Disorders | 140 |
| Other Comorbidity | Decubitus Ulcer or Chronic Skin Ulcer | 148-149 |
| Other Comorbidity | Extensive Burns | 150-151 |
| Other Comorbidity | Cellulitis, Local Skin Infection | 152 |
| Other Comorbidity | Other Dermatological Disorders | 153 |
| Other Comorbidity | Head Injury | 154-156 |
| Other Comorbidity | Vertebral Fractures | 157 |
| Other Comorbidity | Hip Fracture/Dislocation | 158 |
| Other Comorbidity | Major Fracture, Except Of Skull, Vertebrae, or Hip | 159 |
| Other Comorbidity | Internal Injuries | 160 |
| Other Comorbidity | Traumatic Amputation and Other Injuries | 161-162 |
| Other Comorbidity | Poisonings and Allergic Reaction | 163 |
| Other Comorbidity | Major Complications of Medical Care and Trauma | 164 |
| Other Comorbidity | Other Complications of Medical Care | 165 |
| Other Comorbidity | Major Symptoms, Abnormalities | 166 |
| Other Comorbidity | Minor Symptoms, Signs, Findings | 167 |

Table 4.2009 Pneumonia Payment Model Final Variables

| Category | Variable | CC |
|-------------------|--|--------|
| Demographics | Age (65 – 74) | N/A |
| Demographics | Age (75 – 84) | N/A |
| Demographics | Age (>=85) | N/A |
| Cardiovascular | Respirator Dependence/Respiratory Arrest/Cardiorespiratory Failure | 77-79 |
| Cardiovascular | Congestive Heart Failure | 80 |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction | 83 |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic | 85 |
| Cardiovascular | Valvular and Rheumatic Heart Disease | 86 |
| Cardiovascular | Hypertension | 91 |
| Other Comorbidity | History of Infection | 1, 3-5 |

| Category | Variable | CC |
|-------------------|---|-------------------------|
| Other Comorbidity | Other Infectious Diseases | 6 |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia | 7 |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers | 8 |
| Other Comorbidity | Lymphatic, Head And Neck, Brain, and Other Major Cancers | 9 |
| Other Comorbidity | Diabetes and DM Complications | 15-19, 119, 120 |
| Other Comorbidity | Protein-Calorie Malnutrition | 21 |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders | 22 |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids | 24 |
| Other Comorbidity | Other Gastrointestinal Disorders | 36 |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis | 37 |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders | 41 |
| Other Comorbidity | Severe Hematological Disorders | 44 |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease | 47 |
| Other Comorbidity | Delirium and Encephalopathy | 48 |
| Other Comorbidity | Dementia and Senility | 49-50 |
| Other Comorbidity | Drug/Alcohol Dependence/Psychosis | 51-52 |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence | 53 |
| Other Comorbidity | Major Psychiatric Disorders | 54-56 |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation | 67-69, 100-101, 177-178 |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy | 70-71 |
| Other Comorbidity | Multiple Sclerosis and Parkinson's | 72-73 |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage | 75 |
| Other Comorbidity | Arrhythmias | 92-93 |
| Other Comorbidity | Stroke | 95-96 |
| Other Comorbidity | Vascular or Circulatory Disease | 104-106 |
| Other Comorbidity | COPD | 108 |
| Other Comorbidity | Fibrosis of Lung or Other Chronic Lung Disorder | 109 |
| Other Comorbidity | Asthma | 110 |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias | 111 |
| Other Comorbidity | Pleural Effusion/Pneumothorax | 114 |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders | 127 |
| Other Comorbidity | Dialysis Status | 130 |
| Other Comorbidity | Renal Failure | 131 |
| Other Comorbidity | Decubitus Ulcer or Chronic Skin Ulcer | 148-149 |
| Other Comorbidity | Head Injury | 154-156 |
| Other Comorbidity | Vertebral Fractures | 157 |
| Other Comorbidity | Hip Fracture/Dislocation | 158 |
| Other Comorbidity | Major Fracture, Except Of Skull, Vertebrae, or Hip | 159 |
| Other Comorbidity | Internal Injuries | 160 |
| Other Comorbidity | Major Symptoms, Abnormalities | 166 |

2.8. Statistical Approach to Risk-Standardized Payment (RSP)

To calculate hospital-specific RSPs, we estimate hierarchical generalized linear models using Samples A and B. This strategy accounts for within-hospital correlation of the observed outcomes and accommodates the assumption that underlying differences in quality across hospitals lead to systematic

differences in outcomes. We model the total payment as a function of patient age and select comorbidities with a hospital-specific random effect.

We use the following strategy to calculate the hospital-specific RSPs. We calculate these payments as the ratio of “predicted” pneumonia payment to expected pneumonia payment, and multiply by the national unadjusted average pneumonia payment. The predicted pneumonia payment for each hospital is estimated using its patient mix and an estimated hospital-specific intercept. The expected pneumonia payment for each hospital is estimated given the same patient mix but the average intercept among all hospitals in the sample.

Operationally, the expected pneumonia payment for each hospital is obtained by summing the expected pneumonia payments for all patients in the hospital. The expected pneumonia payment for each patient is calculated via the hierarchical model by applying the estimated regression coefficients to the observed patient characteristics and adding the average intercept. The predicted pneumonia payment for each hospital is calculated by summing the predicted pneumonia payments for all patients in the hospital. The predicted pneumonia payment for each patient is calculated through the hierarchical model by applying the estimated regression coefficients to the patient characteristics observed and adding the hospital-specific intercept.

More specifically, we use a hierarchical generalized linear model to account for the natural clustering of observations within hospitals and adjust for the selected risk factors. The model employs a log link and a Poisson distribution with a hospital-specific random effect as follows:

$$h(Y_{ij}) = \alpha_i + \beta Z_{ij} \quad (2)$$

$$\alpha_i = \mu + \omega_i; \quad \omega_i \sim N(0, \tau^2) \quad (3)$$

where α_i represents the hospital-specific intercept, Z_{ij} is defined the same as in equation (1), μ is the average intercept across all hospitals in the sample, and τ^2 is the between-hospital variance component.¹² This model separates within-hospital variation from between-hospital variation. The hierarchical generalized linear models are estimated using the SAS software system (SAS 9.3 GLIMMIX procedure).

2.8.1 Hospital Performance Reporting

Using the selected set of risk factors, we fit the hierarchical generalized linear model defined by Equations (2) - (3) and estimate the parameters, $\hat{\mu}$, $\{\alpha_1, \alpha_2, \dots, \alpha_I\}$, $\hat{\beta}$, and $\hat{\tau}^2$. We calculate a standardized outcome measure, RSP_i , for each hospital by computing the ratio of the predicted pneumonia payment to the expected pneumonia payment, and multiplying by the national unadjusted average pneumonia payment, \bar{Y} . Specifically, we calculate

$$\text{Predicted} \quad \hat{y}_{ij}(Z_{ij}) = h^{-1}(\hat{\alpha}_i + \hat{\beta} Z_{ij}) \quad (4)$$

$$\text{Expected} \quad \hat{e}_{ij}(Z_{ij}) = h^{-1}(\hat{\mu} + \hat{\beta} Z_{ij}) \quad (5)$$

$$\widehat{RSP}_i(Z_{ij}) = \frac{\sum_{j=1}^{n_i} \hat{y}_{ij}(Z)}{\sum_{j=1}^{n_i} \hat{e}_{ij}(Z)} \times \bar{y} \quad (6)$$

Again, i indexes hospitals, j indexes patients within hospitals, and n_i is the number of patients within hospital i . If “predicted” total payment is higher (or lower) than “expected” total payment for a given hospital, then its \widehat{RSP}_i will be higher (or lower) than the national unadjusted average payment. For each hospital, we can compute an interval estimate of RSP_i to characterize the level of uncertainty around the point estimate using bootstrapping simulations. The point estimate and interval estimate can be used to characterize and compare hospital performance (e.g., higher than expected, as expected, or lower than expected). See Figure 4 for our overall analysis steps.

2.8.2 Creating Interval Estimates

Because the statistic described in Equation 6 (Section 2.8.1), i.e., \widehat{RSP}_i , is a complex function of parameter estimates, we use the re-sampling technique – bootstrapping – to derive an interval estimate. Bootstrapping has the advantage of avoiding unnecessary distributional assumptions.

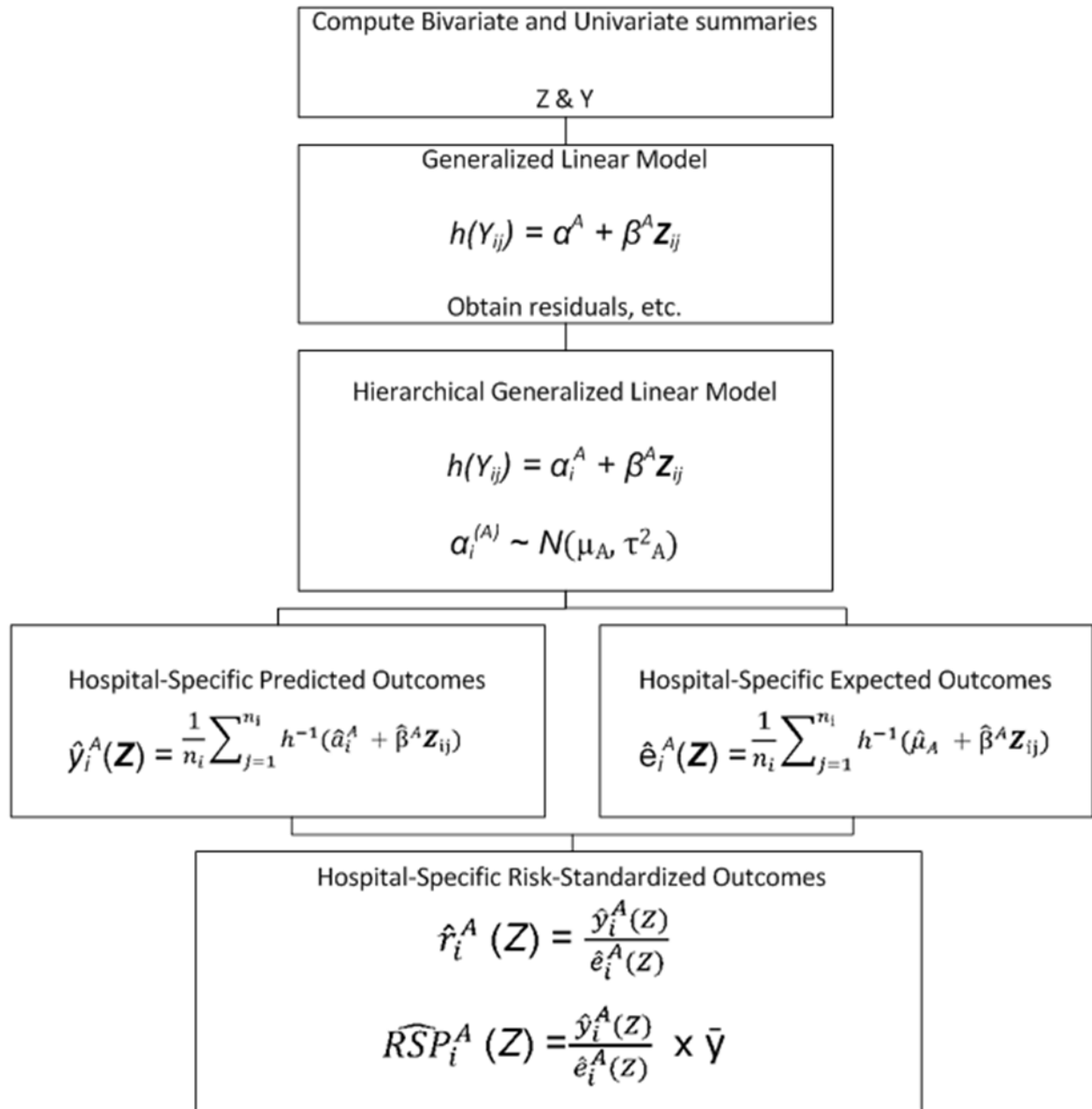
Algorithm:

Let I denote the total number of hospitals in the sample. We repeat steps 1-4 below for B times, where B is the number of bootstrap samples desired (with b indexes the b th bootstrap sample):

1. Sample I hospitals with replacement.
2. Fit the hierarchical generalized linear model using all patients within each sampled hospital. If some hospitals are selected more than once in a bootstrapped sample, we treat them as distinct so that we have I random effects to estimate the variance components. At the conclusion of Step 2, we have:
 - a. $\hat{\beta}^{(b)}$ (estimated regression coefficients of the risk factors)
 - b. The parameters governing the random effects, hospital adjusted outcomes, distribution, $\hat{\mu}^{(b)}$ and $\hat{\tau}^{2(b)}$
 - c. The set of hospital-specific intercepts and corresponding variances, $\{\hat{\alpha}_i^{(b)}, \widehat{var}(\alpha_i^{(b)}); i = 1, 2, \dots, I\}$
3. We generate a hospital random effect by sampling from the distribution of the hospital-specific distribution obtained in Step 2c. We approximate the distribution for each random effect by a normal distribution. Thus, we draw $\alpha_i^{(b*)} \sim N(\hat{\alpha}_i^{(b)}, \widehat{var}(\hat{\alpha}_i^{(b)}))$ for the unique set of hospitals sampled in Step 1.
4. Within each unique hospital i sampled in Step 1, and for each patient j in that hospital, we calculate $\hat{y}_{ij}^{(b)}$, $\hat{e}_{ij}^{(b)}$, and $\widehat{RSP}_i(Z)^{(b)}$ where $\hat{\beta}^{(b)}$ and $\hat{\mu}^{(b)}$ are obtained from Step 2 and $\hat{\alpha}_i^{(b*)}$ is obtained from Step 3.

Ninety-five percent interval estimates (or alternative interval estimates) for the hospital-standardized outcome can be computed by identifying the 2.5th and 97.5th percentiles of the B estimates (or the percentiles corresponding to the alternative desired intervals).¹³

Figure 4. Analysis Steps



3. RESULTS

3.1. Model Development and Validation Results

Table 5 shows the number of index admissions and number of hospitals associated with each of the samples used for measure development and validation, as outlined in Section 2.6.

Table 5. Description of 2008-2009 Development and Validation Samples

| Sample | % of Total Sample | Purpose | Number of Index Admissions | Number of Hospitals |
|-------------------------|------------------------------|---|----------------------------|---------------------|
| Sample A (Full Sample) | 100% 2009 | Development (cohort, outcome definition, determination of functional form of risk-adjustment model) | 334,913 | 4,619 |
| Sample A1 (Development) | 50% 2009 (randomly selected) | Development (variable selection; validity testing) | 167,456 | 4,586 |
| Sample A2 (Validation) | 50% 2009 (remaining 50%) | Development (validity testing) | 167,457 | 4,574 |
| Sample B (Validation) | 100% 2008 | Development (cohort, outcome definition, and validity testing) | 365,536 | 4,644 |

The frequencies of final selected risk factors for all samples, as shown in Table 6, are consistent across the development and validation samples.

Table 6. 2008-2009 Pneumonia Payment Model Risk Factor Frequencies in Development and Validation Samples

| Risk-Adjustment Category | Risk-Adjustment Variable | 2009 Sample A1 (%) | 2009 Sample A2 (%) | 2008 Sample B (%) |
|--------------------------|---|--------------------|--------------------|-------------------|
| Intercept | N/A | | | |
| Demographics | Age (65 – 74) | 27.35 | 27.22 | 25.86 |
| Demographics | Age (75 – 84) | 39.63 | 39.64 | 40.46 |
| Demographics | Age (>=85) | 33.02 | 33.15 | 33.67 |
| Cardiovascular | Respiratory Arrest/Cardiorespiratory Failure/Respirator Dependence (CC 77-79) | 18.28 | 18.36 | 16.78 |
| Cardiovascular | Congestive Heart Failure (CC 80) | 38.44 | 38.42 | 37.81 |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction (CC 83) | 13.92 | 13.79 | 14.24 |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic (CC 85) | 1.90 | 1.90 | 1.76 |
| Cardiovascular | Valvular and Rheumatic Heart Disease (CC 86) | 22.70 | 22.44 | 22.78 |
| Cardiovascular | Hypertension (CC 91) | 80.22 | 80.23 | 79.12 |
| Other Comorbidity | History of Infection (CC 1, 3-5) | 2.53 | 2.49 | 2.34 |
| Other Comorbidity | Other Infectious Diseases (CC 6) | 35.73 | 35.76 | 34.93 |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia (CC 7) | 5.14 | 5.07 | 4.85 |

| Risk-Adjustment Category | Risk-Adjustment Variable | 2009 Sample A1 (%) | 2009 Sample A2 (%) | 2008 Sample B (%) |
|---------------------------------|---|---------------------------|---------------------------|--------------------------|
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers (CC 8) | 6.78 | 6.78 | 6.27 |
| Other Comorbidity | Lymphatic, Head and Neck, Brain, and Other Major Cancers (CC 9) | 5.85 | 5.82 | 5.57 |
| Other Comorbidity | Diabetes and Diabetes Complications (CC 15-19, 119-120) | 39.52 | 39.49 | 38.02 |
| Other Comorbidity | Protein-Calorie Malnutrition (CC 21) | 11.39 | 11.46 | 10.16 |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders (CC 22) | 8.56 | 8.63 | 7.65 |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids (CC 24) | 69.44 | 69.40 | 66.55 |
| Other Comorbidity | Other Gastrointestinal Disorders (CC 36) | 57.49 | 57.59 | 56.58 |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis (CC 37) | 1.93 | 1.90 | 1.88 |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders (CC 41) | 22.11 | 21.83 | 21.67 |
| Other Comorbidity | Severe Hematological Disorders (CC 44) | 4.37 | 4.40 | 4.12 |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease(CC 47) | 50.94 | 51.16 | 49.07 |
| Other Comorbidity | Delirium and Encephalopathy (CC 48) | 6.61 | 6.74 | 6.05 |
| Other Comorbidity | Dementia and Senility (CC 49, 50) | 28.63 | 28.71 | 28.86 |
| Other Comorbidity | Drug/Alcohol Psychosis or Dependence (CC 51, 52) | 2.61 | 2.62 | 2.53 |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence (CC 53) | 10.01 | 9.85 | 9.56 |
| Other Comorbidity | Major Psychiatric Disorders (CC 54-56) | 12.25 | 12.35 | 12.11 |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation (CC 67-69, 100, 101, 177, 178) | 6.31 | 6.37 | 6.16 |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy (CC 70, 71) | 8.60 | 8.72 | 8.12 |
| Other Comorbidity | Multiple Sclerosis and Parkinson's (CC 72, 73) | 4.50 | 4.50 | 4.63 |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage (CC 75) | 0.57 | 0.58 | 0.48 |
| Other Comorbidity | Arrhythmias (CC 92, 93) | 40.87 | 41.06 | 39.70 |
| Other Comorbidity | Stroke (CC 95, 96) | 9.93 | 9.78 | 10.16 |
| Other Comorbidity | Vascular or Circulatory Disease(CC 104-106) | 40.55 | 40.63 | 39.37 |
| Other Comorbidity | COPD (CC 108) | 53.15 | 53.35 | 52.20 |
| Other Comorbidity | Fibrosis of lung or other chronic lung disorder (CC 109) | 16.11 | 16.40 | 15.81 |
| Other Comorbidity | Asthma (CC 110) | 10.95 | 11.17 | 10.95 |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias (CC 111) | 6.90 | 6.97 | 6.58 |
| Other Comorbidity | Pleural Effusion/Pneumothorax (CC 114) | 14.92 | 14.88 | 13.56 |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders (CC 127) | 34.82 | 34.88 | 34.28 |

| Risk-Adjustment Category | Risk-Adjustment Variable | 2009 Sample A1 (%) | 2009 Sample A2 (%) | 2008 Sample B (%) |
|--------------------------|---|--------------------|--------------------|-------------------|
| Other Comorbidity | Dialysis Status (CC 130) | 2.42 | 2.29 | 2.28 |
| Other Comorbidity | Renal Failure (CC 131) | 23.97 | 23.84 | 21.35 |
| Other Comorbidity | Decubitus Ulcer of Skin or Chronic Skin Ulcer (CC 148, 149) | 11.16 | 10.92 | 10.97 |
| Other Comorbidity | Head Injury (CC 154-156) | 7.02 | 6.94 | 6.45 |
| Other Comorbidity | Vertebral Fractures (CC 157) | 5.06 | 5.10 | 5.15 |
| Other Comorbidity | Hip Fracture/Dislocation (CC 158) | 4.55 | 4.52 | 4.54 |
| Other Comorbidity | Major Fracture, Except of Skull, Vertebrae, or Hip (CC 159) | 2.72 | 2.70 | 2.60 |
| Other Comorbidity | Internal Injuries (CC 160) | 1.06 | 1.08 | 0.99 |
| Other Comorbidity | Major Symptoms, Abnormalities (CC 166) | 80.50 | 80.50 | 79.34 |

3.1.1. Results of Risk-Adjustment Model in Development and Validation Samples

Table 7 reports the estimated coefficients, standard errors, payment ratios (PR) (exponentiated coefficient estimate), and 95% confidence intervals for the PRs associated with each risk factor generated from the 2009 development sample (sample A1). Table 8 and Table 9 present the same information for the 2009 and 2008 validation samples. PRs are similar across samples.

Table 7. Generalized Linear Model Results for 2009 Development Sample A1 (N=167,456 at 4,586 hospitals)

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Intercept | N/A | 9.330 | 0.007 | - | - |
| Demographics | Age (65 – 74) | -0.460 | 0.005 | 0.955 | (0.945 – 0.965) |
| Demographics | Age (75 – 84) | -0.026 | 0.004 | 0.974 | (0.966 – 0.982) |
| Demographics | Age (>=85) | 0.000 | - | 1.000 | - |
| Cardiovascular | Respiratory Arrest/Cardiorespiratory Failure/Respirator Dependence (CC 77-79) | 0.068 | 0.005 | 1.071 | (1.060 – 1.081) |
| Cardiovascular | Congestive Heart Failure (CC 80) | 0.051 | 0.004 | 1.052 | (1.044 – 1.061) |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction (CC 83) | -0.023 | 0.005 | 0.977 | (0.967 – 0.987) |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic (CC 85) | 0.066 | 0.013 | 1.068 | (1.041 – 1.095) |
| Cardiovascular | Valvular and Rheumatic Heart Disease (CC 86) | 0.018 | 0.004 | 1.018 | (1.009 – 1.027) |
| Cardiovascular | Hypertension (CC 91) | -0.015 | 0.005 | 0.985 | (0.976 – 0.995) |
| Other Comorbidity | History of Infection (CC 1, 3-5) | 0.134 | 0.011 | 1.144 | (1.119 – 1.169) |
| Other Comorbidity | Other Infectious Diseases (CC 6) | 0.037 | 0.004 | 1.037 | (1.030 – 1.045) |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia (CC 7) | 0.058 | 0.009 | 1.059 | (1.042 – 1.077) |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers (CC 8) | 0.036 | 0.007 | 1.036 | (1.021 – 1.051) |
| Other Comorbidity | Lymphatic, Head and Neck, Brain, and Other Major Cancers (CC 9) | 0.047 | 0.008 | 1.048 | (1.033 – 1.064) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Other Comorbidity | Diabetes and Diabetes Complications (CC 15-19, 119-120) | 0.027 | 0.004 | 1.027 | (1.020 – 1.035) |
| Other Comorbidity | Protein-Calorie Malnutrition (CC 21) | 0.195 | 0.006 | 1.216 | (1.201 – 1.231) |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders (CC 22) | 0.054 | 0.007 | 1.055 | (1.042 – 1.068) |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids (CC 24) | -0.045 | 0.004 | 0.956 | (0.949 – 0.964) |
| Other Comorbidity | Other Gastrointestinal Disorders (CC 36) | -0.045 | 0.004 | 0.956 | (0.949 – 0.963) |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis (CC 37) | 0.048 | 0.013 | 1.049 | (1.023 – 1.075) |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders (CC 41) | -0.026 | 0.004 | 0.974 | (0.966 – 0.982) |
| Other Comorbidity | Severe Hematological Disorders (CC 44) | 0.062 | 0.008 | 1.063 | (1.046 – 1.081) |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease(CC 47) | 0.043 | 0.004 | 1.044 | (1.037 – 1.052) |
| Other Comorbidity | Delirium and Encephalopathy (CC 48) | 0.027 | 0.007 | 1.027 | (1.014 – 1.041) |
| Other Comorbidity | Dementia and Senility (CC 49, 50) | 0.037 | 0.004 | 1.038 | (1.029 – 1.046) |
| Other Comorbidity | Drug/Alcohol Psychosis or Dependence (CC 51, 52) | 0.067 | 0.011 | 1.069 | (1.046 – 1.091) |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence (CC 53) | -0.043 | 0.006 | 0.958 | (0.946 – 0.969) |
| Other Comorbidity | Major Psychiatric Disorders (CC 54-56) | 0.069 | 0.006 | 1.072 | (1.060 – 1.083) |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation (CC 67-69, 100, 101, 177, 178) | 0.058 | 0.007 | 1.059 | (1.044 – 1.075) |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy (CC 70, 71) | 0.026 | 0.006 | 1.026 | (1.013 – 1.039) |
| Other Comorbidity | Multiple Sclerosis and Parkinson's (CC 72, 73) | 0.048 | 0.008 | 1.049 | (1.033 – 1.064) |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage (CC 75) | 0.087 | 0.023 | 1.091 | (1.044 – 1.140) |
| Other Comorbidity | Arrhythmias (CC 92, 93) | 0.016 | 0.004 | 1.016 | (1.008 – 1.023) |
| Other Comorbidity | Stroke (CC 95, 96) | 0.033 | 0.006 | 1.033 | (1.021 – 1.045) |
| Other Comorbidity | Vascular or Circulatory Disease(CC 104-106) | 0.027 | 0.004 | 1.027 | (1.020 – 1.035) |
| Other Comorbidity | COPD (CC 108) | 0.026 | 0.004 | 1.026 | (1.018 – 1.034) |
| Other Comorbidity | Fibrosis of lung or other chronic lung disorder (CC 109) | 0.022 | 0.005 | 1.022 | (1.012 – 1.032) |
| Other Comorbidity | Asthma (CC 110) | -0.048 | 0.006 | 0.953 | (0.942 – 0.964) |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias (CC 111) | 0.032 | 0.007 | 1.032 | (1.018 – 1.047) |
| Other Comorbidity | Pleural Effusion/Pneumothorax (CC 114) | 0.051 | 0.005 | 1.052 | (1.041 – 1.063) |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders (CC 127) | -0.033 | 0.004 | 0.968 | (0.960 – 0.975) |
| Other Comorbidity | Dialysis Status (CC 130) | 0.159 | 0.011 | 1.172 | (1.148 – 1.197) |
| Other Comorbidity | Renal Failure (CC 131) | 0.067 | 0.004 | 1.070 | (1.060 – 1.079) |
| Other Comorbidity | Decubitus Ulcer of Skin or Chronic Skin Ulcer (CC 148, 149) | 0.057 | 0.006 | 1.059 | (1.048 – 1.071) |
| Other Comorbidity | Head Injury (CC 154-156) | 0.035 | 0.006 | 1.036 | (1.023 – 1.049) |
| Other Comorbidity | Vertebral Fractures (CC 157) | 0.065 | 0.008 | 1.067 | (1.051 – 1.082) |
| Other Comorbidity | Hip Fracture/Dislocation (CC 158) | 0.031 | 0.007 | 1.031 | (1.017 – 1.046) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Other Comorbidity | Major Fracture, Except of Skull, Vertebrae, or Hip (CC 159) | 0.039 | 0.010 | 1.040 | (1.020 – 1.060) |
| Other Comorbidity | Internal Injuries (CC 160) | 0.064 | 0.018 | 1.066 | (1.030 – 1.103) |
| Other Comorbidity | Major Symptoms, Abnormalities (CC 166) | 0.053 | 0.005 | 1.054 | (1.043 – 1.065) |

Table 8. Generalized Linear Model Results for 2009 Validation Sample A2 (N=167,457 at 4,574 hospitals)

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Intercept | N/A | 9.335 | 0.007 | - | - |
| Demographics | Age (65 – 74) | -0.041 | 0.005 | 0.960 | (0.950 – 0.970) |
| Demographics | Age (75 – 84) | -0.020 | 0.004 | 0.981 | (0.973 – 0.988) |
| Demographics | Age (>=85) | 0.000 | - | 1.000 | - |
| Cardiovascular | Respiratory Arrest/Cardiorespiratory Failure/Respirator Dependence (CC 77-79) | 0.071 | 0.005 | 1.073 | (1.063 – 1.084) |
| Cardiovascular | Congestive Heart Failure (CC 80) | 0.052 | 0.004 | 1.054 | (1.045 – 1.062) |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction (CC 83) | -0.039 | 0.005 | 0.961 | (0.952 – 0.971) |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic (CC 85) | 0.045 | 0.012 | 1.046 | (1.021 – 1.072) |
| Cardiovascular | Valvular and Rheumatic Heart Disease (CC 86) | 0.021 | 0.004 | 1.022 | (1.013 – 1.030) |
| Cardiovascular | Hypertension (CC 91) | -0.018 | 0.005 | 0.983 | (0.974 – 0.992) |
| Other Comorbidity | History of Infection (CC 1, 3-5) | 0.143 | 0.012 | 1.154 | (1.128 – 1.181) |
| Other Comorbidity | Other Infectious Diseases (CC 6) | 0.037 | 0.004 | 1.037 | (1.030 – 1.045) |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia (CC 7) | 0.063 | 0.009 | 1.065 | (1.047 – 1.083) |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers (CC 8) | 0.041 | 0.007 | 1.042 | (1.027 – 1.057) |
| Other Comorbidity | Lymphatic, Head and Neck, Brain, and Other Major Cancers (CC 9) | 0.051 | 0.008 | 1.052 | (1.036 – 1.068) |
| Other Comorbidity | Diabetes and Diabetes Complications (CC 15-19, 119-120) | 0.030 | 0.004 | 1.031 | (1.023 – 1.039) |
| Other Comorbidity | Protein-Calorie Malnutrition (CC 21) | 0.189 | 0.006 | 1.208 | (1.194 – 1.222) |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders (CC 22) | 0.063 | 0.006 | 1.066 | (1.052 – 1.079) |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids (CC 24) | -0.043 | 0.004 | 0.958 | (0.950 – 0.965) |
| Other Comorbidity | Other Gastrointestinal Disorders (CC 36) | -0.045 | 0.004 | 0.956 | (0.949 – 0.963) |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis (CC 37) | 0.063 | 0.013 | 1.065 | (1.038 – 1.092) |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders (CC 41) | -0.027 | 0.004 | 0.974 | (0.966 – 0.982) |
| Other Comorbidity | Severe Hematological Disorders (CC 44) | 0.069 | 0.009 | 1.072 | (1.054 – 1.090) |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease (CC 47) | 0.030 | 0.004 | 1.031 | (1.023 – 1.039) |
| Other Comorbidity | Delirium and Encephalopathy (CC 48) | 0.027 | 0.007 | 1.027 | (1.014 – 1.041) |
| Other Comorbidity | Dementia and Senility (CC 49, 50) | 0.043 | 0.004 | 1.044 | (1.036 – 1.052) |
| Other Comorbidity | Drug/Alcohol Psychosis or Dependence (CC 51, 52) | 0.038 | 0.011 | 1.039 | (1.016 – 1.062) |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence (CC | -0.032 | 0.006 | 0.968 | (0.957 – 0.980) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| | 53) | | | | |
| Other Comorbidity | Major Psychiatric Disorders (CC 54-56) | 0.061 | 0.005 | 1.063 | (1.052 – 1.074) |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation (CC 67-69, 100, 101, 177, 178) | 0.070 | 0.007 | 1.072 | (1.057 – 1.088) |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy (CC 70, 71) | 0.021 | 0.006 | 1.021 | (1.009 – 1.034) |
| Other Comorbidity | Multiple Sclerosis and Parkinson's (CC 72, 73) | 0.044 | 0.008 | 1.045 | (1.029 – 1.061) |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage (CC 75) | 0.086 | 0.023 | 1.090 | (1.042 – 1.140) |
| Other Comorbidity | Arrhythmias (CC 92, 93) | 0.020 | 0.004 | 1.020 | (1.012 – 1.027) |
| Other Comorbidity | Stroke (CC 95, 96) | 0.037 | 0.006 | 1.038 | (1.026 – 1.050) |
| Other Comorbidity | Vascular or Circulatory Disease(CC 104-106) | 0.028 | 0.004 | 1.029 | (1.021 – 1.036) |
| Other Comorbidity | COPD (CC 108) | 0.021 | 0.004 | 1.021 | (1.013 – 1.029) |
| Other Comorbidity | Fibrosis of lung or other chronic lung disorder (CC 109) | 0.008 | 0.005 | 1.008 | (0.999 – 1.018) |
| Other Comorbidity | Asthma (CC 110) | -0.050 | 0.006 | 0.951 | (0.940 – 0.961) |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias (CC 111) | 0.044 | 0.007 | 1.045 | (1.031 – 1.059) |
| Other Comorbidity | Pleural Effusion/Pneumothorax (CC 114) | 0.039 | 0.005 | 1.040 | (1.029 – 1.050) |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders (CC 127) | -0.040 | 0.004 | 0.961 | (0.954 – 0.968) |
| Other Comorbidity | Dialysis Status (CC 130) | 0.170 | 0.011 | 1.185 | (1.159 – 1.211) |
| Other Comorbidity | Renal Failure (CC 131) | 0.070 | 0.004 | 1.072 | (1.063 – 1.081) |
| Other Comorbidity | Decubitus Ulcer of Skin or Chronic Skin Ulcer (CC 148, 149) | 0.050 | 0.006 | 1.051 | (1.040 – 1.063) |
| Other Comorbidity | Head Injury (CC 154-156) | 0.029 | 0.007 | 1.029 | (1.016 – 1.042) |
| Other Comorbidity | Vertebral Fractures (CC 157) | 0.064 | 0.007 | 1.067 | (1.051 – 1.082) |
| Other Comorbidity | Hip Fracture/Dislocation (CC 158) | 0.051 | 0.008 | 1.052 | (1.035 – 1.069) |
| Other Comorbidity | Major Fracture, Except of Skull, Vertebrae, or Hip (CC 159) | 0.045 | 0.010 | 1.046 | (1.026 – 1.066) |
| Other Comorbidity | Internal Injuries (CC 160) | 0.080 | 0.016 | 1.083 | (1.049 – 1.117) |
| Other Comorbidity | Major Symptoms, Abnormalities (CC 166) | 0.049 | 0.005 | 1.050 | (1.040 – 1.061) |

Table 9. Generalized Linear Model Results for 2008 Validation Sample B (N=365,536 at 4,644 hospitals)

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Intercept | N/A | 9.287 | 0.005 | - | - |
| Demographics | Age (65 – 74) | -0.060 | 0.004 | 0.942 | (0.935 – 0.948) |
| Demographics | Age (75 – 84) | -0.028 | 0.003 | 0.973 | (0.967 – 0.978) |
| Demographics | Age (>=85) | 0.000 | - | 1.000 | - |
| Cardiovascular | Respiratory Arrest/Cardiorespiratory Failure/Respirator Dependence (CC 77-79) | 0.062 | 0.004 | 1.064 | (1.056 – 1.071) |
| Cardiovascular | Congestive Heart Failure (CC 80) | 0.045 | 0.003 | 1.046 | (1.040 – 1.052) |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction (CC 83) | -0.028 | 0.003 | 0.973 | (0.966 – 0.979) |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic (CC 85) | 0.072 | 0.009 | 1.074 | (1.056 – 1.093) |
| Cardiovascular | Valvular and Rheumatic Heart Disease (CC 86) | 0.013 | 0.003 | 1.013 | (1.007 – 1.019) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Cardiovascular | Hypertension (CC 91) | -0.015 | 0.003 | 0.985 | (0.979 – 0.991) |
| Other Comorbidity | History of Infection (CC 1, 3-5) | 0.127 | 0.009 | 1.136 | (1.117 – 1.155) |
| Other Comorbidity | Other Infectious Diseases (CC 6) | 0.041 | 0.003 | 1.042 | (1.037 – 1.047) |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia (CC 7) | 0.060 | 0.006 | 1.062 | (1.049 – 1.075) |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers (CC 8) | 0.045 | 0.005 | 1.046 | (1.035 – 1.057) |
| Other Comorbidity | Lymphatic, Head and Neck, Brain, and Other Major Cancers (CC 9) | 0.049 | 0.005 | 1.051 | (1.040 – 1.061) |
| Other Comorbidity | Diabetes and Diabetes Complications (CC 15-19, 119-120) | 0.027 | 0.002 | 1.028 | (1.023 – 1.033) |
| Other Comorbidity | Protein-Calorie Malnutrition (CC 21) | 0.184 | 0.005 | 1.203 | (1.192 – 1.213) |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders (CC 22) | 0.063 | 0.005 | 1.065 | (1.055 – 1.075) |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids (CC 24) | -0.038 | 0.003 | 0.963 | (0.958 – 0.968) |
| Other Comorbidity | Other Gastrointestinal Disorders (CC 36) | -0.031 | 0.002 | 0.970 | (0.965 – 0.975) |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis (CC 37) | 0.050 | 0.008 | 1.051 | (1.034 – 1.069) |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders (CC 41) | -0.015 | 0.003 | 0.985 | (0.980 – 0.991) |
| Other Comorbidity | Severe Hematological Disorders (CC 44) | 0.067 | 0.006 | 1.069 | (1.056 – 1.082) |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease(CC 47) | 0.037 | 0.003 | 1.038 | (1.033 – 1.043) |
| Other Comorbidity | Delirium and Encephalopathy (CC 48) | 0.034 | 0.005 | 1.035 | (1.025 – 1.045) |
| Other Comorbidity | Dementia and Senility (CC 49, 50) | 0.048 | 0.003 | 1.049 | (1.043 – 1.055) |
| Other Comorbidity | Drug/Alcohol Psychosis or Dependence (CC 51, 52) | 0.055 | 0.007 | 1.056 | (1.041 – 1.071) |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence (CC 53) | -0.034 | 0.004 | 0.967 | (0.959 – 0.975) |
| Other Comorbidity | Major Psychiatric Disorders (CC 54-56) | 0.063 | 0.004 | 1.065 | (1.057 – 1.072) |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation (CC 67-69, 100, 101, 177, 178) | 0.060 | 0.005 | 1.062 | (1.052 – 1.073) |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy (CC 70, 71) | 0.025 | 0.004 | 1.026 | (1.017 – 1.035) |
| Other Comorbidity | Multiple Sclerosis and Parkinson's (CC 72, 73) | 0.058 | 0.005 | 1.059 | (1.049 – 1.070) |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage (CC 75) | 0.047 | 0.018 | 1.049 | (1.013 – 1.086) |
| Other Comorbidity | Arrhythmias (CC 92, 93) | 0.021 | 0.003 | 1.021 | (1.016 – 1.027) |
| Other Comorbidity | Stroke (CC 95, 96) | 0.029 | 0.004 | 1.029 | (1.021 – 1.037) |
| Other Comorbidity | Vascular or Circulatory Disease(CC 104-106) | 0.026 | 0.003 | 1.026 | (1.021 – 1.031) |
| Other Comorbidity | COPD (CC 108) | 0.026 | 0.003 | 1.026 | (1.021 – 1.032) |
| Other Comorbidity | Fibrosis of lung or other chronic lung disorder (CC 109) | 0.018 | 0.003 | 1.018 | (1.012 – 1.025) |
| Other Comorbidity | Asthma (CC 110) | -0.045 | 0.004 | 0.956 | (0.949 – 0.963) |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias (CC 111) | 0.049 | 0.005 | 1.051 | (1.041 – 1.061) |
| Other Comorbidity | Pleural Effusion/Pneumothorax (CC 114) | 0.038 | 0.004 | 1.039 | (1.032 – 1.046) |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders (CC 127) | -0.032 | 0.002 | 0.969 | (0.964 – 0.974) |
| Other Comorbidity | Dialysis Status (CC 130) | 0.141 | 0.008 | 1.151 | (1.135 – 1.169) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Other Comorbidity | Renal Failure (CC 131) | 0.066 | 0.003 | 1.069 | (1.062 – 1.075) |
| Other Comorbidity | Decubitus Ulcer of Skin or Chronic Skin Ulcer (CC 148, 149) | 0.054 | 0.004 | 1.055 | (1.047 – 1.063) |
| Other Comorbidity | Head Injury (CC 154-156) | 0.028 | 0.004 | 1.028 | (1.019 – 1.037) |
| Other Comorbidity | Vertebral Fractures (CC 157) | 0.061 | 0.005 | 1.063 | (1.052 – 1.073) |
| Other Comorbidity | Hip Fracture/Dislocation (CC 158) | 0.036 | 0.005 | 1.036 | (1.026 – 1.046) |
| Other Comorbidity | Major Fracture, Except of Skull, Vertebrae, or Hip (CC 159) | 0.056 | 0.007 | 1.057 | (1.043 – 1.071) |
| Other Comorbidity | Internal Injuries (CC 160) | 0.077 | 0.011 | 1.080 | (1.056 – 1.104) |
| Other Comorbidity | Major Symptoms, Abnormalities (CC 166) | 0.043 | 0.003 | 1.044 | (1.038 – 1.051) |

For each generalized linear model, we compute six summary statistics to assess model performance: calibration (a measure of over-fitting), predictive ratios by deciles and top 1% of predicted payment, distribution of residuals, mean absolute prediction error (MAPE), root-mean-square error (RMSE), and model chi-square. Model performance results are summarized in Table 10.

Over-fitting can result in the phenomenon in which a model describes the relationship between predictive variables and the outcome well in the development sample, but fails to provide valid predictions in new patients. Since the γ_0 in the validation sample is close to zero and the γ_1 is close to one, there is little evidence of over-fitting.

A predictive ratio is an estimator's ratio of predicted outcome to observed outcome.¹⁴ A predictive ratio of 1.0 indicates an accurate prediction. A ratio greater than 1.0 indicates overprediction, and a ratio less than 1.0 indicates underprediction.

Table 10. Generalized Linear Model Performance for 2008-2009 Development and Validation Samples

| Indices | 2009 Development Sample A1 | 2009 Validation Sample A2 | 2008 Validation Sample B |
|--|----------------------------|---------------------------|--------------------------|
| Number of hospital stays | 167,456 | 167,457 | 365,536 |
| Number of hospitals | 4,586 | 4,574 | 4,644 |
| Unadjusted mean payment (\$2009) | \$13,457 | \$13,415 | \$12,777 |
| Calibration (γ_0 , γ_1) [†] | (0,1) | (0.07,0.99) | (0.23,0.97) |
| Discrimination – Predictive Ratios First Decile | 1.14 | 1.13 | 1.13 |
| Discrimination – Predictive Ratios Second Decile | 1.05 | 1.06 | 1.05 |
| Discrimination – Predictive Ratios Third Decile | 1.01 | 1.01 | 1.01 |
| Discrimination – Predictive Ratios Fourth Decile | 0.99 | 0.98 | 0.98 |
| Discrimination – Predictive Ratios Fifth Decile | 0.97 | 0.97 | 0.96 |

[†] Over-Fitting Indices (γ_0 , γ_1) provide evidence of over-fitting and require several steps to calculate. Let b denote the *estimated* vector of regression coefficients. *Predicted Payment* (\hat{p}) = $\exp\{Xb\}$, and $Z = Xb$ (e.g., the linear predictor that is a scalar value for everyone). A new generalized linear model that includes only an intercept and a slope by regressing the Y on Z with a log link is fitted in the validation sample; e.g., $\ln(E(Y|Z)) = \gamma_0 + \gamma_1 Z$. Estimated values of γ_0 far from 0 and estimated values of γ_1 far from 1 provide evidence of over-fitting.

| Indices | 2009 Development Sample A1 | 2009 Validation Sample A2 | 2008 Validation Sample B |
|---|-------------------------------|------------------------------|-----------------------------|
| Discrimination – Predictive Ratios Sixth Decile | 0.95 | 0.95 | 0.95 |
| Discrimination – Predictive Ratios Seventh Decile | 0.95 | 0.95 | 0.95 |
| Discrimination – Predictive Ratios Eighth Decile | 0.96 | 0.97 | 0.95 |
| Discrimination – Predictive Ratios Ninth Decile | 0.98 | 0.98 | 0.99 |
| Discrimination – Predictive Ratios Tenth Decile | 1.06 | 1.05 | 1.06 |
| Discrimination – Predictive Ratios Top 1% (highest) | 1.16 | 1.16 | 1.17 |
| Residuals Lack of Fit (Pearson Residual Fall %) <-2 | 0.00% | 0.00% | 0.00% |
| Residuals Lack of Fit (Pearson Residual Fall %) [-2, 0) | 64.52% | 64.49% | 64.65% |
| Residuals Lack of Fit (Pearson Residual Fall %) [0, 2) | 30.25% | 30.25% | 30.19% |
| Residuals Lack of Fit (Pearson Residual Fall %) [2+ | 5.23% | 5.26% | 5.17% |
| MAPE | 6,524 | 6,486 | 6,040 |
| RMSE | 9,498 | 9,419 | 8,811 |
| Model χ^2 [DF] [§] (p-value) | 84845784 [48] (p<0.001) | 83530580 [48] (p<0.001) | 158769493 [48] (p<0.001) |

3.2. Final Model Results

The results presented below for the final hierarchical generalized linear model are for the full 2008-2009 combined samples (i.e. Sample A and Sample B combined). The list of covariates and coefficients, standard errors, PR, and 95% confidence intervals for the PR associated with each risk factor are shown in Table 11.

Table 11. Hierarchical Generalized Linear Model Results for Full 2008-2009 Sample

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Intercept | N/A | 9.289 | 0.004 | - | - |
| Demographics | Age (65 – 74) | -0.051 | 0.002 | 0.950 | (0.946 – 0.955) |
| Demographics | Age (75 – 84) | -0.024 | 0.002 | 0.976 | (0.972 – 0.980) |
| Demographics | Age (>=85) | 0.000 | - | 1.000 | - |
| Cardiovascular | Respiratory Arrest/Cardiorespiratory Failure/Respirator Dependence (CC 77-79) | 0.062 | 0.002 | 1.064 | (1.059 – 1.069) |
| Cardiovascular | Congestive Heart Failure (CC 80) | 0.056 | 0.002 | 1.057 | (1.053 – 1.061) |
| Cardiovascular | Angina Pectoris/Old Myocardial Infarction (CC 83) | -0.032 | 0.002 | 0.968 | (0.964 – 0.973) |
| Cardiovascular | Heart Infection/Inflammation, Except Rheumatic (CC 85) | 0.054 | 0.006 | 1.056 | (1.045 – 1.067) |

[§] Model χ^2 (DF) provides evidence of a global test of goodness of fit of the model, where the null hypothesis is that all the parameters of covariates are 0. Take 2 times the log likelihood from the full model with all covariates minus the log likelihood from the model with intercept only. It gives a chi-square statistic with the degree of freedom equal the number of variables tested.

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Cardiovascular | Valvular and Rheumatic Heart Disease (CC 86) | 0.003 | 0.002 | 1.003 | (0.999 – 1.007) |
| Cardiovascular | Hypertension (CC 91) | -0.019 | 0.002 | 0.981 | (0.977 – 0.985) |
| Other Comorbidity | History of Infection (CC 1, 3-5) | 0.125 | 0.005 | 1.133 | (1.122 – 1.143) |
| Other Comorbidity | Other Infectious Diseases (CC 6) | 0.033 | 0.002 | 1.034 | (1.030 – 1.037) |
| Other Comorbidity | Metastatic Cancer and Acute Leukemia (CC 7) | 0.055 | 0.004 | 1.057 | (1.048 – 1.065) |
| Other Comorbidity | Lung, Upper Digestive Tract, and Other Severe Cancers (CC 8) | 0.037 | 0.004 | 1.038 | (1.031 – 1.045) |
| Other Comorbidity | Lymphatic, Head and Neck, Brain, and Other Major Cancers (CC 9) | 0.046 | 0.004 | 1.047 | (1.040 – 1.054) |
| Other Comorbidity | Diabetes and Diabetes Complications (CC 15-19, 119-120) | 0.026 | 0.002 | 1.026 | (1.023 – 1.030) |
| Other Comorbidity | Protein-Calorie Malnutrition (CC 21) | 0.181 | 0.002 | 1.199 | (1.193 – 1.205) |
| Other Comorbidity | Other Significant Endocrine and Metabolic Disorders (CC 22) | 0.055 | 0.003 | 1.056 | (1.050 – 1.063) |
| Other Comorbidity | Obesity/Disorders of Thyroid, Cholesterol, Lipids (CC 24) | -0.041 | 0.002 | 0.960 | (0.956 – 0.963) |
| Other Comorbidity | Other Gastrointestinal Disorders (CC 36) | -0.031 | 0.002 | 0.970 | (0.966 – 0.973) |
| Other Comorbidity | Bone/Joint/Muscle Infections/Necrosis (CC 37) | 0.049 | 0.005 | 1.050 | (1.039 – 1.061) |
| Other Comorbidity | Osteoporosis and Other Bone/Cartilage Disorders (CC 41) | -0.021 | 0.002 | 0.979 | (0.975 – 0.983) |
| Other Comorbidity | Severe Hematological Disorders (CC 44) | 0.059 | 0.004 | 1.060 | (1.052 – 1.069) |
| Other Comorbidity | Iron Deficiency and Other/Unspecified Anemias and Blood Disease(CC 47) | 0.035 | 0.002 | 1.036 | (1.032 – 1.039) |
| Other Comorbidity | Delirium and Encephalopathy (CC 48) | 0.020 | 0.003 | 1.020 | (1.013 – 1.026) |
| Other Comorbidity | Dementia and Senility (CC 49, 50) | 0.042 | 0.002 | 1.043 | (1.039 – 1.047) |
| Other Comorbidity | Drug/Alcohol Psychosis or Dependence (CC 51, 52) | 0.059 | 0.005 | 1.060 | (1.050 – 1.071) |
| Other Comorbidity | Drug/Alcohol Abuse, Without Dependence (CC 53) | -0.029 | 0.003 | 0.972 | (0.966 – 0.977) |
| Other Comorbidity | Major Psychiatric Disorders (CC 54-56) | 0.059 | 0.002 | 1.060 | (1.055 – 1.066) |
| Other Comorbidity | Plegia, Paralysis, Spinal Cord Disorder and Amputation (CC 67-69, 100, 101, 177, 178) | 0.063 | 0.003 | 1.065 | (1.058 – 1.072) |
| Other Comorbidity | Muscular Dystrophy&/or Polyneuropathy (CC 70, 71) | 0.024 | 0.003 | 1.024 | (1.018 – 1.030) |
| Other Comorbidity | Multiple Sclerosis and Parkinson's (CC 72, 73) | 0.050 | 0.004 | 1.051 | (1.044 – 1.059) |
| Other Comorbidity | Coma, Brain Compression/Anoxic Damage (CC 75) | 0.061 | 0.010 | 1.063 | (1.043 – 1.084) |
| Other Comorbidity | Arrhythmias (CC 92, 93) | 0.016 | 0.002 | 1.016 | (1.013 – 1.020) |
| Other Comorbidity | Stroke (CC 95, 96) | 0.026 | 0.003 | 1.026 | (1.020 – 1.031) |
| Other Comorbidity | Vascular or Circulatory Disease(CC 104-106) | 0.022 | 0.002 | 1.023 | (1.019 – 1.026) |
| Other Comorbidity | COPD (CC 108) | 0.027 | 0.002 | 1.027 | (1.024 – 1.031) |
| Other Comorbidity | Fibrosis of lung or other chronic lung disorder (CC 109) | 0.012 | 0.002 | 1.012 | (1.007 – 1.016) |
| Other Comorbidity | Asthma (CC 110) | -0.052 | 0.003 | 0.950 | (0.945 – 0.955) |
| Other Comorbidity | Aspiration and Specified Bacterial Pneumonias (CC 111) | 0.036 | 0.003 | 1.036 | (1.030 – 1.043) |

| Risk-Adjustment Category | Risk-Adjustment Variable | Estimate | Standard Error | Payment Ratio (PR) | 95% Confidence Interval for PR |
|--------------------------|---|----------|----------------|--------------------|--------------------------------|
| Other Comorbidity | Pleural Effusion/Pneumothorax (CC 114) | 0.038 | 0.002 | 1.039 | (1.034 – 1.044) |
| Other Comorbidity | Other Ear, Nose, Throat, and Mouth Disorders (CC 127) | -0.031 | 0.002 | 0.969 | (0.966 – 0.973) |
| Other Comorbidity | Dialysis Status (CC 130) | 0.140 | 0.005 | 1.150 | (1.138 – 1.162) |
| Other Comorbidity | Renal Failure (CC 131) | 0.066 | 0.002 | 1.068 | (1.064 – 1.072) |
| Other Comorbidity | Decubitus Ulcer of Skin or Chronic Skin Ulcer (CC 148, 149) | 0.048 | 0.003 | 1.049 | (1.044 – 1.054) |
| Other Comorbidity | Head Injury (CC 154-156) | 0.028 | 0.003 | 1.028 | (1.022 – 1.035) |
| Other Comorbidity | Vertebral Fractures (CC 157) | 0.065 | 0.004 | 1.068 | (1.060 – 1.075) |
| Other Comorbidity | Hip Fracture/Dislocation (CC 158) | 0.041 | 0.004 | 1.042 | (1.035 – 1.050) |
| Other Comorbidity | Major Fracture, Except of Skull, Vertebrae, or Hip (CC 159) | 0.051 | 0.005 | 1.052 | (1.042 – 1.062) |
| Other Comorbidity | Internal Injuries (CC 160) | 0.066 | 0.007 | 1.069 | (1.053 – 1.084) |
| Other Comorbidity | Major Symptoms, Abnormalities (CC 166) | 0.044 | 0.002 | 1.045 | (1.040 – 1.050) |

3.2.1. Distribution of Unadjusted and Adjusted Hospital-Specific Pneumonia 30-Day Episode-of-Care Payment

The estimated between-hospital variance from the hierarchical generalized linear model is 0.035 (SE=0.003). The pneumonia payment for a hospital with one standard deviation above average was 1.45 times that of a hospital with one standard deviation below average.

Both unadjusted (Figure 5) and adjusted (Figure 6) payments from pneumonia admission to 30 days post-admission vary considerably across hospitals (Table 12). For hospitals with at least 25 cases, the hospital unadjusted pneumonia 30-day episode-of-care payment ranges from \$6,063 to \$30,164 across 4,155 hospitals with a median (interquartile range) of \$12,478 (\$11,139, \$13,858). The mean \pm SD hospital unadjusted payment is \$12,631 \pm \$2,266. After adjusting for patient and clinical characteristics, the RSP at the hospital-level has a mean \pm SD of \$13,237 \pm \$1,727 ranging from \$8,281 to \$27,975 across 4,155 hospitals. The median (interquartile range) risk-standardized hospital payment rate is \$13,118 (\$12,091, \$14,178).

While we include all hospitals when estimating the risk-adjustment model, we exclude hospitals with fewer than 25 total cases from the summary statistics below, since estimates for hospitals with fewer cases are less reliable, and CMS's past approach to public reporting has been not to report these results. The volume of pneumonia hospitalizations among the included hospitals ranges from 25 to 1,284 index pneumonia admissions, with a mean of 167 index admissions and a median of 124 index admissions.

Table 12. Distribution of Unadjusted and Risk-Standardized Payments for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined)

| Summary Statistic | Pneumonia Episode-of-Care Payment (Unadjusted) | Pneumonia Episode-of-Care Payment (Risk-Standardized) |
|-------------------|--|---|
| Mean | \$12,631 | \$13,237 |
| SD | \$2,266 | \$1,727 |
| Min | \$6,063 | \$8,281 |
| 10th Percentile | \$10,050 | \$11,226 |
| 25th Percentile | \$11,139 | \$12,091 |
| Median | \$12,478 | \$13,118 |
| 75th Percentile | \$13,858 | \$14,178 |
| 90th Percentile | \$15,281 | \$15,336 |
| Max | \$30,164 | \$27,975 |

Figure 5. Distribution of Pneumonia Episode-of-Care Unadjusted Payments for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined)

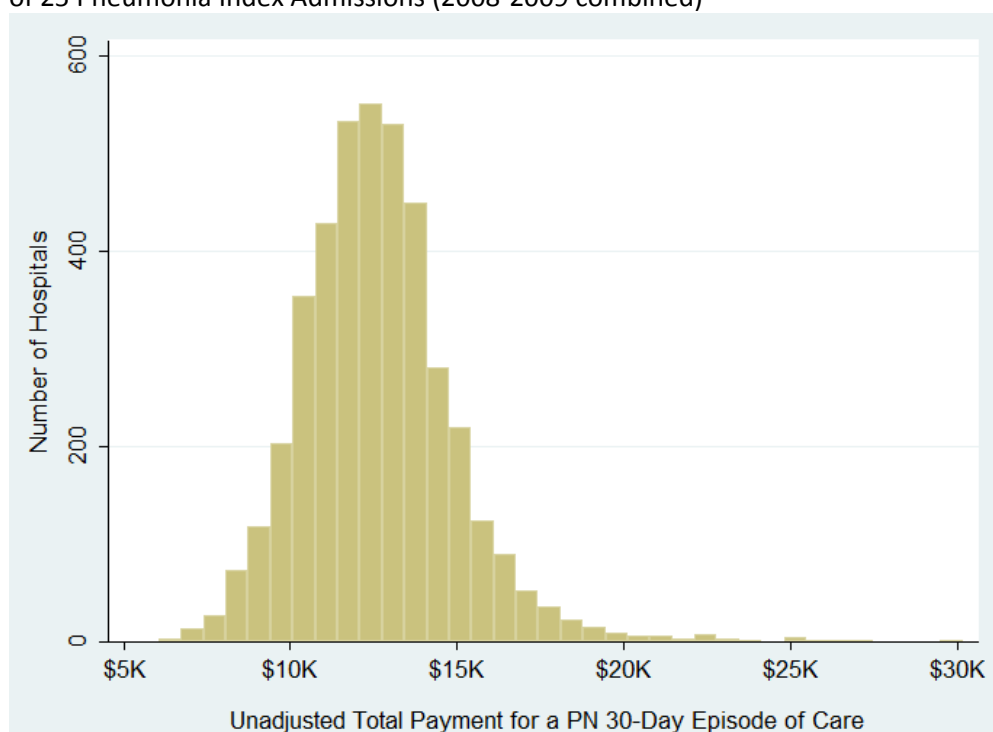
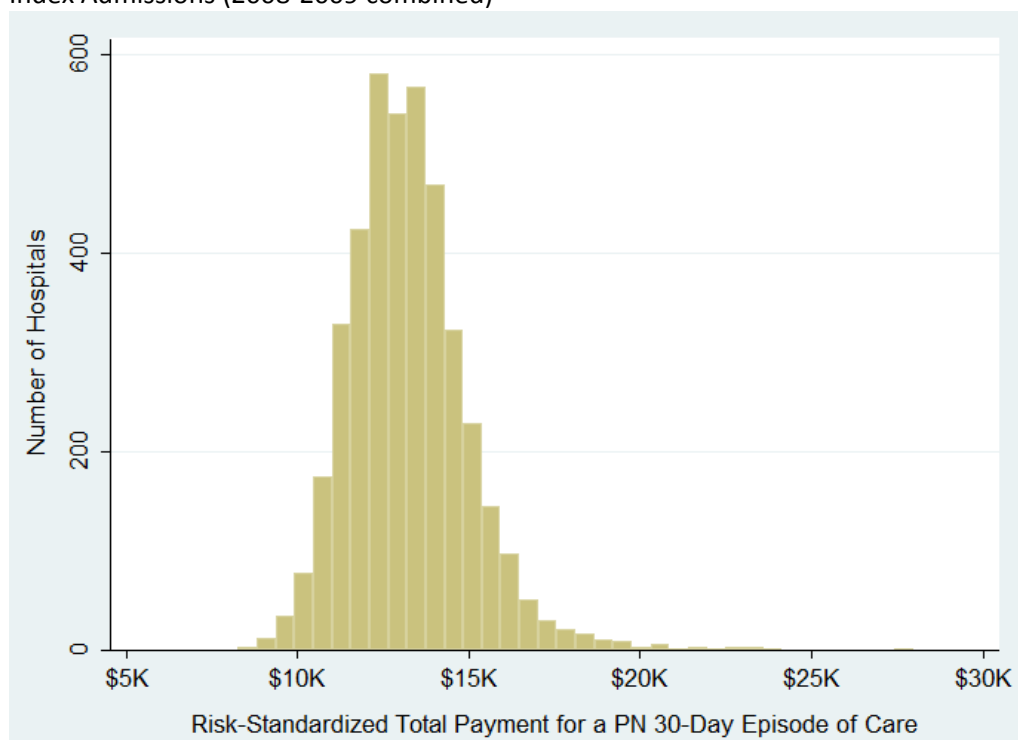


Figure 6. Distribution of Pneumonia Episode-of-Care RSPs for Hospitals with a Minimum of 25 Pneumonia Index Admissions (2008-2009 combined)



3.3. Measure Testing

3.3.1. Reliability Testing

We calculated the Intraclass Correlation Coefficient (ICC) in order to assess the reliability of the measure. The ICC score can be used to determine the extent to which assessments of a hospital using different but randomly selected subsets of patients produces similar measures of hospital performance. We calculated the RSP using a split-sample of the combined 2008-2009 data. Thus, we obtained two RSPs for each hospital, using an entirely distinct set of patients from the same time period. To the extent that the calculated measures of these two subsets agree, we have evidence that the measure assesses an attribute of the hospital, not of the patients. As a metric of agreement we calculated the ICC (2,1) as defined by Shrout and Fleiss.¹⁵

The agreement between the two independent assessments of each hospital was 0.825, which according to the conventional interpretation, is “almost perfect.”¹⁶

3.3.1.1. Data Element Reliability

In constructing the pneumonia payment measure, we aimed to utilize only those data elements from the claims that have both face validity and reliability. We avoided the use of fields that are coded inconsistently across hospitals or providers. Additionally, CMS has several hospital auditing programs in place to assess overall claims code accuracy, to ensure appropriate billing, and to recoup overpayment. CMS routinely conducts data analyses to identify potential problem areas and detect fraud, and audits important data fields used in our measures, including diagnosis and procedure codes, and other elements that are consequential to payment.¹⁷

3.3.2. Validity Testing

3.3.2.1. Validity of Claims-Based Measures

Our team has demonstrated the validity of claims-based measures for profiling hospitals for a number of prior measures by comparing either the measure results or the individual data elements against medical records. CMS validated the six NQF-endorsed claims-based measures currently in public reporting (mortality and readmission measures for AMI, heart failure, and pneumonia) with models that used medical record-abstracted data for risk adjustment. Specifically, claims model validation was conducted by building comparable models using abstracted medical record data for risk adjustment for heart failure patients (National Heart Failure data), AMI patients (Cooperative Cardiovascular Project data), and pneumonia patients (National Pneumonia Project dataset). When both models were applied to the same patient population, the hospital risk-standardized mortality and readmission rates estimated using the claims-based risk-

adjustment models had a high level of agreement with the results based on the medical record model, thus supporting the use of the claims-based models for public reporting.

3.3.2.2. Validity of Development Process

We are developing this measure in consultation with national guidelines for publicly reported outcomes measures, outside experts, and the public. The measure is consistent with the technical approach to outcomes measurement set forth in National Quality Forum (NQF) guidance for outcomes measures,¹⁸ CMS Measure Management System guidance, and the guidance articulated in the American Heart Association scientific statement “Standards for Statistical Models Used for Public Reporting of Health Outcomes.”¹⁹

In order to examine the face validity of our methods for estimating payments for a pneumonia episode of care, we compared our approach with two other measures that estimate payments for episodes of care. Specifically, we compared our methods with the:

- **American Board of Medical Specialties (ABMS) Acute Myocardial Infarction Episode of Care**, which estimates the cost of an episode of care for AMI at the hospital-level from the date of admission through 30 days post-admission for patients 18 years and older. They use claims data from all payers, including Medicare and private insurance. They standardize prices across three components of care: inpatient facility, ambulatory pharmacy, and “all other” (for example, evaluation and management, procedures, imaging, tests, and DME). Costs at the inpatient facility level are calculated based on DRG-level information and length of stay. Total inpatient costs are divided by inpatient days to arrive at a per diem multiplier. This per diem multiplier is used to calculate the inpatient facility cost for each unique episode of care. A similar strategy is applied to ambulatory pharmacy and “all other” costs. Risk adjustment includes comorbid conditions identified in the 12 months preceding the index AMI admission using both inpatient and outpatient claims. The hospital is the unit of reporting.
- **CMS Medicare Spending per Beneficiary (MSPB) measure**, which estimates the cost of an episode of care for all inpatient diagnoses at the hospital-level from three days prior to admission through 30 days post-discharge for Medicare FFS beneficiaries 18 years and older. Their cost outcome includes patient copayments and excludes geographic and policy adjustments. Risk adjustment includes age, hierarchical condition categories, enrollment status, long-term care variables, variable interaction terms, and MS-DRGs present 90 days prior to index admission. The hospital is the unit of reporting.

Although our measure is being developed independently of those above, we share several key decisions:

1. *Include episode of care*: Like ours, both measures begin with a hospitalization and end 30 days after admission (ours, ABMS) or discharge (MSPB). Conceptually, this strategy groups together those medical transactions that are temporally related to a hospitalization. In this way, the care provided during hospitalization, as well as the

transition of care to post-discharge settings is attributed to the provider or hospital of the index admission.

2. *Isolate resource utilization*: Like ours, both measures attempt to isolate payment differentials due to resource utilization by removing payment adjustments that do not reflect the clinical care delivered, such as geographic factors and policy adjustments (ours, MSPB), or standardizing payment amounts for isolated services, labs, or supplies (ABMS).
3. *Perform risk adjustment*: Like ours, both measures employ a thorough and transparent approach to risk adjustment, although the specific risk-adjustment strategies differ technically.

In addition, we will survey the TEP and asked each member to assess the face validity of our measure by rating the following statement using a six-point scale (1=Strongly Disagree, 2=Moderately Disagree, 3=Somewhat Disagree, 4=Somewhat Agree, 5=Moderately Agree, and 6=Strongly Agree):

“This is a measure of payments for Medicare patients for a 30-day pneumonia episode of care. The measure removes policy adjustments that are independent of care decisions and risk-adjusts based on case mix. The measure is intended to provide CMS a tool to compare payments across hospitals nationally to identify hospitals that have notably higher or lower payments associated with pneumonia care. To what extent does the committee agree that this measure accomplishes this purpose?”

4. MAIN FINDINGS / SUMMARY

We present a hierarchical generalized linear regression model for assessing hospital-level, risk-standardized payments for a 30-day episode of care associated with an index admission for pneumonia. Our approach to model development and risk adjustment is consistent with quality measure methods recommendations for publicly reported outcomes measures from NQF, CMS, and the American Heart Association scientific statement.⁴⁻⁷ This proposed measure is based on administrative claims data for FFS Medicare beneficiaries 65 years and older, and is being developed with extensive input from clinical and methodological experts with knowledge and experience relevant to quality measurement.

The study sample is appropriately defined, consisting of patients having an inpatient stay with a primary discharge diagnosis of pneumonia. The outcome is measured using stripped or standardized payments for Medicare patients starting with the index admission and continuing 30 days post-admission across all care settings, services, and supplies (except Part D). The risk-adjustment process accounts for patient age and comorbid conditions identified from: secondary diagnoses of the index hospital stay (excluding potential complications), inpatient data, outpatient hospital data, and carrier files for physician, radiology, and laboratory services during the 12 months prior to the index admission. The hierarchical generalized linear model accounts for hospital case mix and the clustering of patients within hospitals, thereby making the measure suitable for public reporting.

We find substantial variation in risk-standardized payments for a pneumonia episode of care across hospitals. Implementation of this measure in conjunction with CMS's 30-day pneumonia RSMR has the potential to improve the efficiency of care for patients with pneumonia. Although the payment methodology is developed in a pneumonia cohort, it can easily be applied to other disease conditions or episodes of care such as heart failure and AMI.

5. REFERENCES

1. Boards of Trustees of the Federal Hospital Insurance and Federal Supplementary Medical Insurance Trust Funds, *2013 Annual Report*, May 31, 2013.
2. Bundled Payments for Care Improvement (BPCI) Initiative: General Information 2013; <http://innovation.cms.gov/initiatives/bundled-payments/>. Accessed 8/2/2013, 2013.
3. Lindenauer PK, Lagu T, Shieh M, Pekow PS, Rothberg MB. Association of diagnostic coding with trends in hospitalizations and mortality of patients with pneumonia, 2003-2009. *JAMA : the journal of the American Medical Association*. 2012;307(13):1405-1413.
4. National Voluntary Consensus Standards for Patient Outcomes: Phases I and II. http://www.qualityforum.org/projects/Patient_Outcome_Measures_Phases1-2.aspx.
5. Measures Management System Overview. 2012. https://www.cms.gov/Medicare/Quality-Initiatives-Patient-Assessment-Instruments/MMS/index.html?redirect=/MMS/19_MeasuresManagementSystemBlueprint.asp. Accessed 09/27/2012.
6. Krumholz HM, Brindis RG, Brush JE, et al. Standards for statistical models used for public reporting of health outcomes: an American Heart Association Scientific Statement from the Quality of Care and Outcomes Research Interdisciplinary Writing Group: cosponsored by the Council on Epidemiology and Prevention and the Stroke Council. Endorsed by the American College of Cardiology Foundation. *Circulation*. Jan 24 2006;113(3):456-462.
7. Krumholz HM, Keenan PS, Brush JE, Jr., et al. Standards for measures used for public reporting of efficiency in health care: a scientific statement from the American Heart Association Interdisciplinary Council on Quality of Care and Outcomes Research and the American College of Cardiology Foundation. *Circulation*. Oct 28 2008;118(18):1885-1893.
8. Medpac. Medicare Background. 2011; http://www.medpac.gov/payment_basics.cfm. Accessed 09/27/2012.
9. Pope G, Ellis R, Ash A, et al. Principal Inpatient Diagnostic Cost Group Models for Medicare Risk Adjustment. *Health Care Financing Review*. 2000;21(3):26.
10. Measure Evaluation Criteria. 2011; http://www.qualityforum.org/docs/measure_evaluation_criteria.aspx. Accessed 09/26/2012.
11. Manning WG, Mullahy J. Estimating log models: to transform or not to transform? *Journal of health economics*. Jul 2001;20(4):461-494.
12. Gatsonia C. Hierarchical Generalized Linear Models in the Analysis of Variations in Health Care Utilization. *Journal of the American Statistical Association*. 1999;94(445):29-42.
13. Normand S-L, Wang Y, Krumholz H. Assessing surrogacy of data sources for institutional comparisons. *Health Services and Outcomes Research Methodology*. 2007;7(1):79-96.
14. Ash AS, Byrne-Logan S. How Well Do Models Work? Predicting Health Care Costs. *Proceedings of the Section on Statistics in Epidemiology. American Statistical Association*. 1998.
15. Shrout PE, Fleiss JL. Intraclass correlations: uses in assessing rater reliability. *Psychological bulletin*. 1979;86(2):420.
16. Landis JR, Koch GG. The measurement of observer agreement for categorical data. *biometrics*. 1977:159-174.
17. *Recovery Auditing in the Medicare and Medicaid Programs for Fiscal Year 2011*. Centers for Medicare and Medicaid Services;2011.

18. National Quality Forum. National voluntary consensus standards for patient outcomes, first report for phases 1 and 2: A consensus report
http://www.nysna.org/images/pdfs/practice/nqf_ana_outcomes_draft10.pdf. Accessed August 19, 2010.
19. Krumholz HM, Brindis RG, Brush JE, et al. Standards for statistical models used for public reporting of health outcomes - An American Heart Association scientific statement from the quality of care and outcomes research interdisciplinary writing group - Cosponsored by the Council on Epidemiology and Prevention and the Stroke Council - Endorsed by the American College of Cardiology Foundation. *Circulation*. Jan 24 2006;113(3):456-462.

6. APPENDICES

Appendix A. Potential Complications in the Index Admission for Pneumonia Payment Model

| CC # | Description | Potential Complication in Index Admission |
|-------|--|---|
| CC 1 | HIV/AIDS | No |
| CC 2 | Septicemia/Shock | Yes |
| CC 3 | Central Nervous System Infection | No |
| CC 4 | Tuberculosis | No |
| CC 5 | Opportunistic Infections | No |
| CC 6 | Other Infectious Diseases | Yes |
| CC 7 | Metastatic Cancer and Acute Leukemia | No |
| CC 8 | Lung, Upper Digestive Tract, and Other Severe Cancers | No |
| CC 9 | Lymphatic, Head and Neck, Brain, and Other Major Cancers | No |
| CC 10 | Breast, Prostate, Colorectal and Other Cancers and Tumors | No |
| CC 11 | Other Respiratory and Heart Neoplasms | No |
| CC 12 | Other Digestive and Urinary Neoplasms | No |
| CC 13 | Other Neoplasms | No |
| CC 14 | Benign Neoplasms of Skin, Breast, Eye | No |
| CC 15 | Diabetes with Renal Manifestation | No |
| CC 16 | Diabetes with Neurologic or Peripheral Circulatory Manifestation | No |
| CC 17 | Diabetes with Acute Complications | Yes |
| CC 18 | Diabetes with Ophthalmologic Manifestation | No |
| CC 19 | Diabetes with No or Unspecified Complications | No |
| CC 20 | Type I Diabetes Mellitus | No |
| CC 21 | Protein-Calorie Malnutrition | No |
| CC 22 | Other Significant Endocrine and Metabolic Disorders | No |
| CC 23 | Disorders of Fluid/Electrolyte/Acid-Base | Yes |
| CC 24 | Other Endocrine/Metabolic/Nutritional Disorders | No |
| CC 25 | End-Stage Liver Disease | No |
| CC 26 | Cirrhosis of Liver | No |
| CC 27 | Chronic Hepatitis | No |
| CC 28 | Acute Liver Failure/Disease | Yes |
| CC 29 | Other Hepatitis and Liver Disease | No |
| CC 30 | Gallbladder and Biliary Tract Disorders | No |
| CC 31 | Intestinal Obstruction/Perforation | Yes |
| CC 32 | Pancreatic Disease | No |
| CC 33 | Inflammatory Bowel Disease | No |
| CC 34 | Peptic Ulcer, Hemorrhage, Other Specified Gastrointestinal Disorders | Yes |
| CC 35 | Appendicitis | No |
| CC 36 | Other Gastrointestinal Disorders | No |
| CC 37 | Bone/Joint/Muscle Infections/Necrosis | No |
| CC 38 | Rheumatoid Arthritis and Inflammatory Connective Tissue Disease | No |
| CC 39 | Disorders of the Vertebrae and Spinal Discs | No |
| CC 40 | Osteoarthritis of Hip or Knee | No |

| CC # | Description | Potential Complication in Index Admission |
|-------|---|---|
| CC 41 | Osteoporosis and Other Bone/Cartilage Disorders | No |
| CC 42 | Congenital/Developmental Skeletal and Connective Tissue Disorders | No |
| CC 43 | Other Musculoskeletal and Connective Tissue Disorders | No |
| CC 44 | Severe Hematological Disorders | No |
| CC 45 | Disorders of Immunity | No |
| CC 46 | Coagulation Defects and Other Specified Hematological Disorders | Yes |
| CC 47 | Iron Deficiency and Other/Unspecified Anemias and Blood Disease | No |
| CC 48 | Delirium and Encephalopathy | Yes |
| CC 49 | Dementia | No |
| CC 50 | Senility, Nonpsychotic Organic Brain Syndromes/Conditions | No |
| CC 51 | Drug/Alcohol Psychosis | No |
| CC 52 | Drug/Alcohol Dependence | No |
| CC 53 | Drug/Alcohol Abuse, Without Dependence | No |
| CC 54 | Schizophrenia | No |
| CC 55 | Major Depressive, Bipolar, and Paranoid Disorders | No |
| CC 56 | Reactive and Unspecified Psychosis | No |
| CC 57 | Personality Disorders | No |
| CC 58 | Depression | No |
| CC 59 | Anxiety Disorders | No |
| CC 60 | Other Psychiatric Disorders | No |
| CC 61 | Profound Mental Retardation/Developmental Disability | No |
| CC 62 | Severe Mental Retardation/Developmental Disability | No |
| CC 63 | Moderate Mental Retardation/Developmental Disability | No |
| CC 64 | Mild/Unspecified Mental Retardation/Developmental Disability | No |
| CC 65 | Other Developmental Disability | No |
| CC 66 | Attention Deficit Disorder | No |
| CC 67 | Quadriplegia, Other Extensive Paralysis | No |
| CC 68 | Paraplegia | No |
| CC 69 | Spinal Cord Disorders/Injuries | No |
| CC 70 | Muscular Dystrophy | No |
| CC 71 | Polyneuropathy | No |
| CC 72 | Multiple Sclerosis | No |
| CC 73 | Parkinson's and Huntington's Diseases | No |
| CC 74 | Seizure Disorders and Convulsions | No |
| CC 75 | Coma, Brain Compression/Anoxic Damage | Yes |
| CC 76 | Mononeuropathy, Other Neurological Conditions/Injuries | No |
| CC 77 | Respirator Dependence/Tracheostomy Status | Yes |
| CC 78 | Respiratory Arrest | Yes |
| CC 79 | Cardio-Respiratory Failure and Shock | Yes |
| CC 80 | Congestive Heart Failure | Yes |
| CC 81 | Acute Myocardial Infarction | Yes |
| CC 82 | Unstable Angina and Other Acute Ischemic Heart Disease | Yes |
| CC 83 | Angina Pectoris/Old Myocardial Infarction | No |
| CC 84 | Coronary Atherosclerosis/Other Chronic Ischemic Heart Disease | No |
| CC 85 | Heart Infection/Inflammation, Except Rheumatic | No |
| CC 86 | Valvular and Rheumatic Heart Disease | No |

| CC # | Description | Potential Complication in Index Admission |
|--------|---|---|
| CC 87 | Major Congenital Cardiac/Circulatory Defect | No |
| CC 88 | Other Congenital Heart/Circulatory Disease | No |
| CC 89 | Hypertensive Heart and Renal Disease or Encephalopathy | No |
| CC 90 | Hypertensive Heart Disease | No |
| CC 91 | Hypertension | No |
| CC 92 | Specified Heart Arrhythmias | Yes |
| CC 93 | Other Heart Rhythm and Conduction Disorders | Yes |
| CC 94 | Other and Unspecified Heart Disease | Yes |
| CC 95 | Cerebral Hemorrhage | Yes |
| CC 96 | Ischemic or Unspecified Stroke | Yes |
| CC 97 | Precerebral Arterial Occlusion and Transient Cerebral Ischemia | Yes |
| CC 98 | Cerebral Atherosclerosis and Aneurysm | No |
| CC 99 | Cerebrovascular Disease, Unspecified | No |
| CC 100 | Hemiplegia/Hemiparesis | Yes |
| CC 101 | Diplegia (Upper), Monoplegia, and Other Paralytic Syndromes | Yes |
| CC 102 | Speech, Language, Cognitive, Perceptual | Yes |
| CC 103 | Cerebrovascular Disease Late Effects, Unspecified | No |
| CC 104 | Vascular Disease with Complications | Yes |
| CC 105 | Vascular Disease | Yes |
| CC 106 | Other Circulatory Disease | Yes |
| CC 107 | Cystic Fibrosis | No |
| CC 108 | Chronic Obstructive Pulmonary Disease | No |
| CC 109 | Fibrosis of Lung and Other Chronic Lung Disorders | No |
| CC 110 | Asthma | No |
| CC 111 | Aspiration and Specified Bacterial Pneumonias | Yes |
| CC 112 | Pneumococcal Pneumonia, Emphysema, Lung Abscess | Yes |
| CC 113 | Viral and Unspecified Pneumonia, Pleurisy | No |
| CC 114 | Pleural Effusion/Pneumothorax | Yes |
| CC 115 | Other Lung Disorders | No |
| CC 116 | Legally Blind | No |
| CC 117 | Major Eye Infections/Inflammations | No |
| CC 118 | Retinal Detachment | No |
| CC 119 | Proliferative Diabetic Retinopathy and Vitreous Hemorrhage | No |
| CC 120 | Diabetic and Other Vascular Retinopathies | No |
| CC 121 | Retinal Disorders, Except Detachment and Vascular Retinopathies | No |
| CC 122 | Glaucoma | No |
| CC 123 | Cataract | No |
| CC 124 | Other Eye Disorders | No |
| CC 125 | Significant Ear, Nose, and Throat Disorders | No |
| CC 126 | Hearing Loss | No |
| CC 127 | Other Ear, Nose, Throat, and Mouth Disorders | No |
| CC 128 | Kidney Transplant Status | No |
| CC 129 | End Stage Renal Disease | Yes |
| CC 130 | Dialysis Status | Yes |
| CC 131 | Renal Failure | Yes |
| CC 132 | Nephritis | Yes |

| CC # | Description | Potential Complication in Index Admission |
|--------|--|---|
| CC 133 | Urinary Obstruction and Retention | Yes |
| CC 134 | Incontinence | No |
| CC 135 | Urinary Tract Infection | Yes |
| CC 136 | Other Urinary Tract Disorders | No |
| CC 137 | Female Infertility | No |
| CC 138 | Pelvic Inflammatory Disease and Other Specified Female Genital Disorders | No |
| CC 139 | Other Female Genital Disorders | No |
| CC 140 | Male Genital Disorders | No |
| CC 141 | Ectopic Pregnancy | No |
| CC 142 | Miscarriage/Abortion | No |
| CC 143 | Completed Pregnancy With Major Complications | No |
| CC 144 | Completed Pregnancy With Complications | No |
| CC 145 | Completed Pregnancy Without Complication | No |
| CC 146 | Uncompleted Pregnancy With Complications | No |
| CC 147 | Uncompleted Pregnancy With No or Minor Complications | No |
| CC 148 | Decubitus Ulcer of Skin | Yes |
| CC 149 | Chronic Ulcer of Skin, Except Decubitus | No |
| CC 150 | Extensive Third-Degree Burns | No |
| CC 151 | Other Third-Degree and Extensive Burns | No |
| CC 152 | Cellulitis, Local Skin Infection | Yes |
| CC 153 | Other Dermatological Disorders | No |
| CC 154 | Severe Head Injury | Yes |
| CC 155 | Major Head Injury | Yes |
| CC 156 | Concussion or Unspecified Head Injury | Yes |
| CC 157 | Vertebral Fractures | No |
| CC 158 | Hip Fracture/Dislocation | Yes |
| CC 159 | Major Fracture, Except of Skull, Vertebrae, or Hip | Yes |
| CC 160 | Internal Injuries | No |
| CC 161 | Traumatic Amputation | No |
| CC 162 | Other Injuries | No |
| CC 163 | Poisonings and Allergic Reactions | Yes |
| CC 164 | Major Complications of Medical Care and Trauma | No |
| CC 165 | Other Complications of Medical Care | Yes |
| CC 166 | Major Symptoms, Abnormalities | No |
| CC 167 | Minor Symptoms, Signs, Findings | No |
| CC 168 | Extremely Low Birth weight Neonates | No |
| CC 169 | Very Low Birth weight Neonates | No |
| CC 170 | Serious Perinatal Problem Affecting Newborn | No |
| CC 171 | Other Perinatal Problems Affecting Newborn | No |
| CC 172 | Normal, Single Birth | No |
| CC 173 | Major Organ Transplant | No |
| CC 174 | Major Organ Transplant Status | Yes |
| CC 175 | Other Organ Transplant/Replacement | Yes |
| CC 176 | Artificial Openings for Feeding or Elimination | Yes |
| CC 177 | Amputation Status, Lower Limb/Amputation | Yes |
| CC 178 | Amputation Status, Upper Limb | Yes |

| CC # | Description | Potential Complication in Index Admission |
|---------------|--|--|
| CC 179 | Post-Surgical States/Aftercare/Elective | Yes |
| CC 180 | Radiation Therapy | No |
| CC 181 | Chemotherapy | No |
| CC 182 | Rehabilitation | No |
| CC 183 | Screening/Observation/Special Exams | No |
| CC 184 | History of Disease | No |
| CC 185 | Oxygen | No |
| CC 186 | CPAP/IPPB/Nebulizers | No |
| CC 187 | Patient Lifts, Power Operated Vehicles, Beds | No |
| CC 188 | Wheelchairs, Commodes | No |
| CC 189 | Walkers | No |

Appendix B. ICD-9-CM Codes Included in Final Cohort

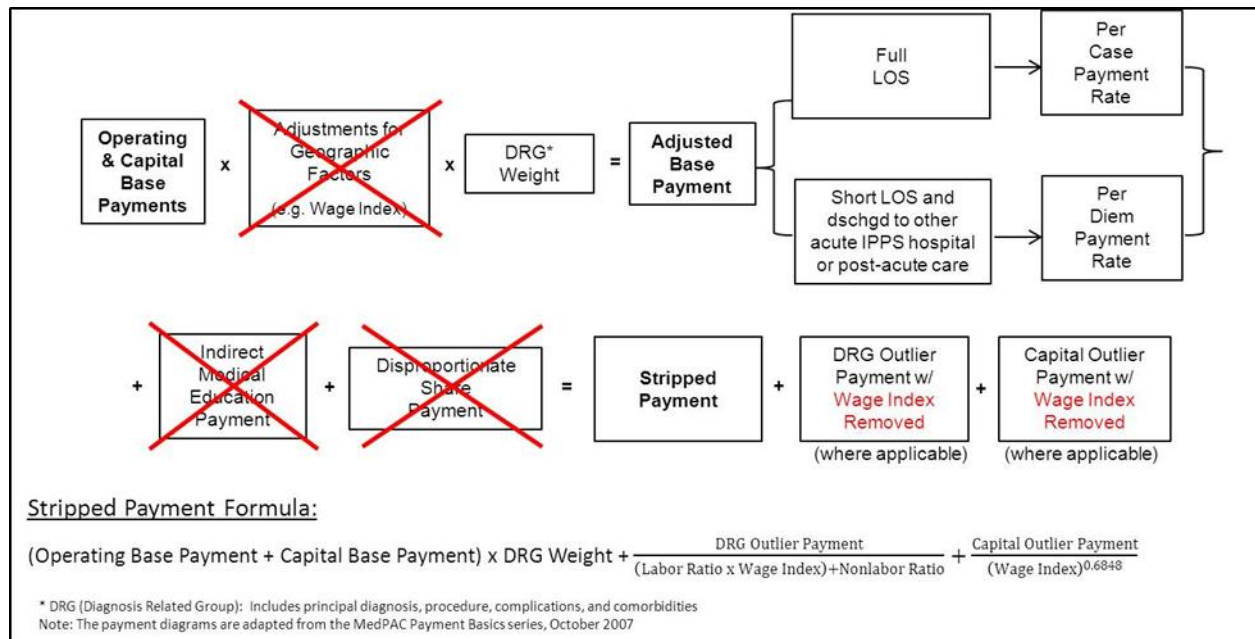
| ICD-9-CM | Description |
|----------|--|
| 480.0 | Pneumonia due to adenovirus |
| 480.1 | Pneumonia due to respiratory syncytial virus |
| 480.2 | Pneumonia due to parainfluenza virus |
| 480.3 | Pneumonia due to SARS-associated coronavirus |
| 480.8 | Viral pneumonia: pneumonia due to other virus not elsewhere classified |
| 480.9 | Viral pneumonia unspecified |
| 481 | Pneumococcal pneumonia [streptococcus pneumoniae pneumonia] |
| 482.0 | Pneumonia due to klebsiella pneumoniae |
| 482.1 | Pneumonia due to pseudomonas |
| 482.2 | Pneumonia due to hemophilus influenzae (h. influenzae) |
| 482.30 | Pneumonia due to streptococcus unspecified |
| 482.31 | Pneumonia due to streptococcus group a |
| 482.32 | Pneumonia due to streptococcus group b |
| 482.39 | Pneumonia due to other streptococcus |
| 482.40 | Pneumonia due to staphylococcus unspecified |
| 482.41 | Pneumonia due to staphylococcus aureus |
| 482.42 | Methicillin resistant pneumonia due to Staphylococcus aureus |
| 482.49 | Other staphylococcus pneumonia |
| 482.81 | Pneumonia due to anaerobes |
| 482.82 | Pneumonia due to escherichia coli [e.coli] |
| 482.83 | Pneumonia due to other gram-negative bacteria |
| 482.84 | Pneumonia due to legionnaires' disease |
| 482.89 | Pneumonia due to other specified bacteria |
| 482.9 | Bacterial pneumonia unspecified |
| 483.0 | Pneumonia due to mycoplasma pneumoniae |
| 483.1 | Pneumonia due to chlamydia |
| 483.8 | Pneumonia due to other specified organism |
| 485 | Bronchopneumonia organism unspecified |
| 486 | Pneumonia organism unspecified |
| 487.0 | Influenza with pneumonia |
| 488.11 | Influenza due to identified novel H1N1 influenza virus with pneumonia |

Appendix C. Example of Included and Excluded Payments When Counting the 30-Day Episode of Care for a Patient with an Index Admission on May 3 and Discharged on May 8

| Claim Type | Provider ID | Claim Date | Admission Type | Primary ICD-9 | Payment | Included in Model? | Payment Included in Model | Comments |
|--------------------------|-------------|-------------|----------------|---------------|--------------------|--------------------|---------------------------|--|
| Carrier | 123456 | 30Apr-30Apr | N/A | 480.8 | \$255.61 | N | \$0.00 | Started prior to the index admission. |
| Inpatient | 234567 | 3May-4May | Admission | 480.8 | \$1,109.49 | Y | \$1,109.49 | This inpatient pneumonia (480.8) admission defines the index admission date (5/3). |
| Inpatient | 345678 | 4 May-8 May | Transfer | 480.8 | \$8,008.15 | Y | \$8,008.15 | This inpatient pneumonia (480.1) discharge defines the discharge date (5/8). |
| Physician | 567891 | 3 May-3 May | N/A | 786.05 | \$367.20 | Y | \$367.20 | Physician payments during the index stay |
| Physician | 678910 | 3 May-3 May | N/A | 488.01 | \$6.59 | Y | \$6.59 | Physician payments during the index stay |
| Physician | 789101 | 3 May-8 May | N/A | 480.8 | \$350.52 | Y | \$350.52 | Physician payments during the index stay |
| Physician | 456789 | 5 May-5 May | N/A | 480.8 | \$225.75 | Y | \$225.75 | Physician payments during the index stay |
| Physician | 345678 | 7 May-7 May | N/A | 296.30 | \$148.39 | Y | \$148.39 | Physician payments during the index stay |
| Inpatient | 910112 | 30May-3Jun | Readmission | 482.81 | \$4,262.13 | Y (pro-rated) | \$3,409.70 | Payment is pro-rated, based only on the days which fall into the 30-day post-admission period. The amount included in the payment model would be: $(\$4262.13/5)*4 = \3409.70 . Note that this second pneumonia (482.81) admission does not count as another index admission - it counts as a readmission. |
| Skilled Nursing Facility | 891011 | 3Jun-21Jun | Transfer | 482.81 | \$1,652.28 | N | \$0.00 | Started after the 30-day post-admission period. |
| | | | | TOTAL | \$16,386.11 | | \$13,625.79 | |

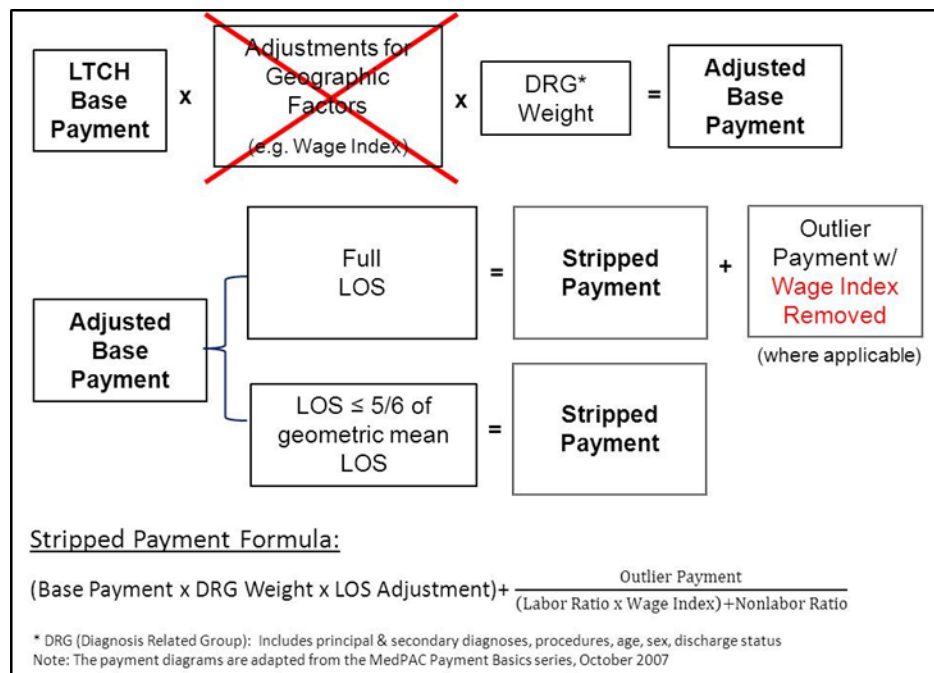
Appendix D. Stripped/Standardized Payment Diagrams

Inpatient Prospective Payment Setting: Stripped Payment

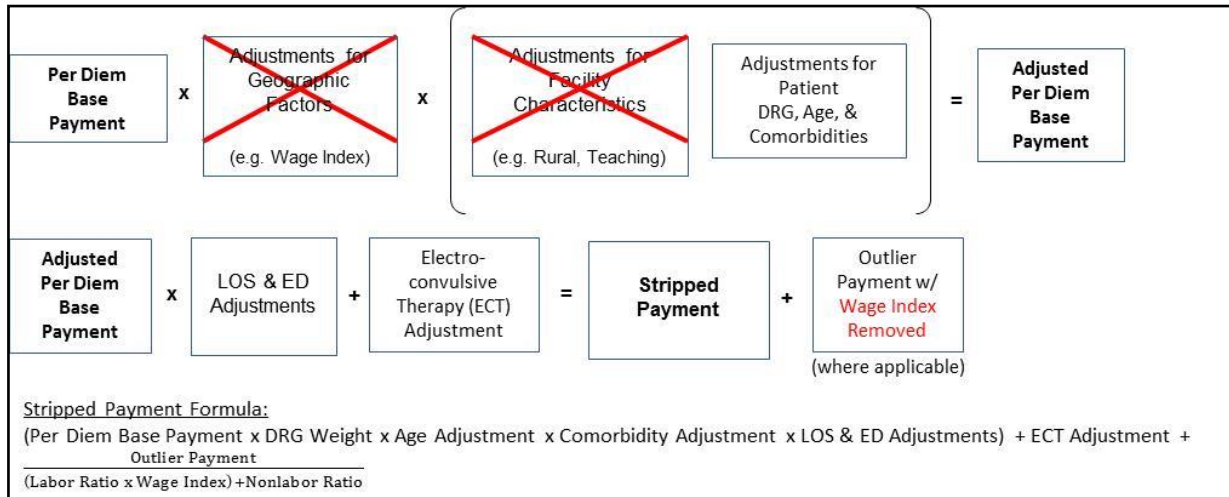


Note: Payments to critical access hospitals (CAHs) were calculated using the IPPS stripped payment formula.

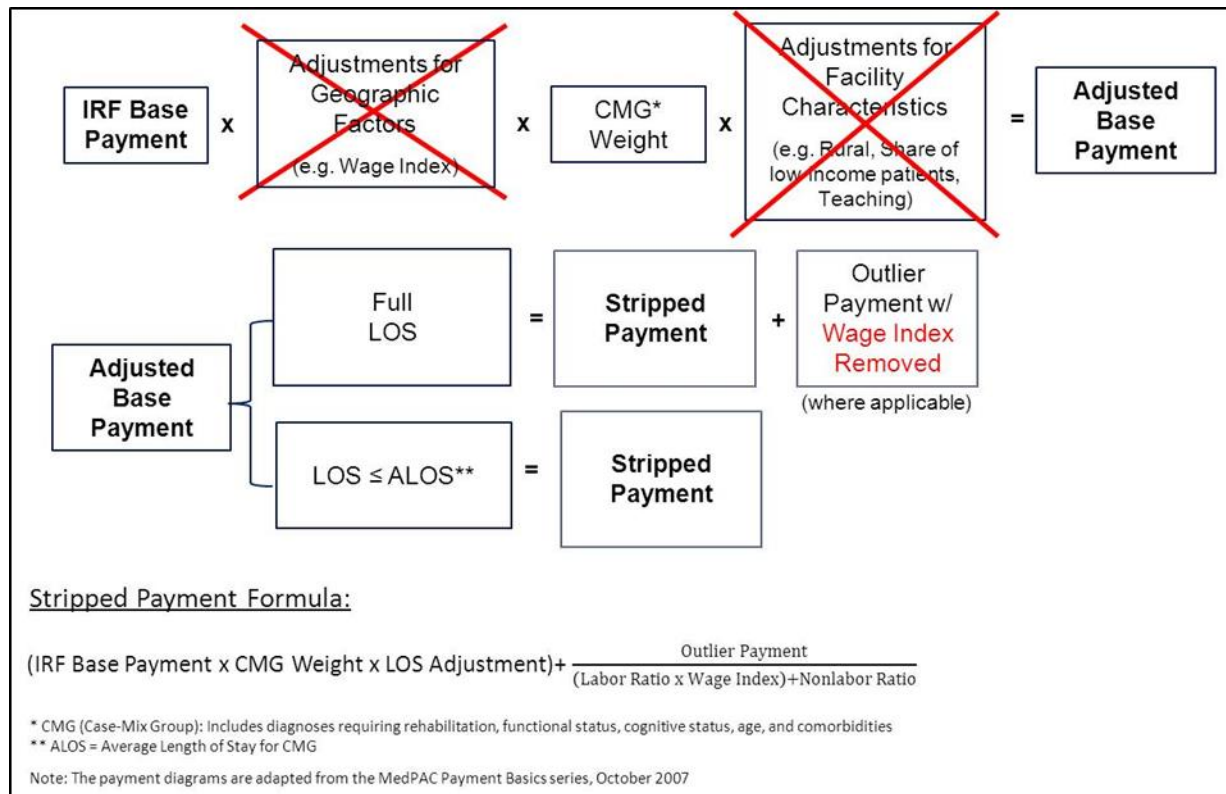
Long Term Care Hospitals: Stripped Payment



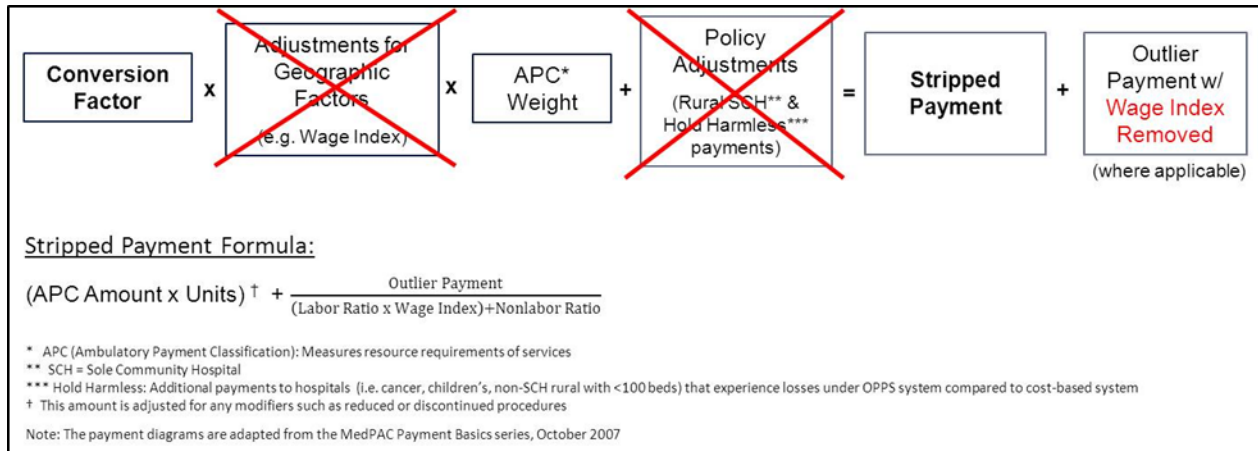
Inpatient Psychiatric Facility: Stripped Payment



Inpatient Rehabilitation Facility: Stripped Payment

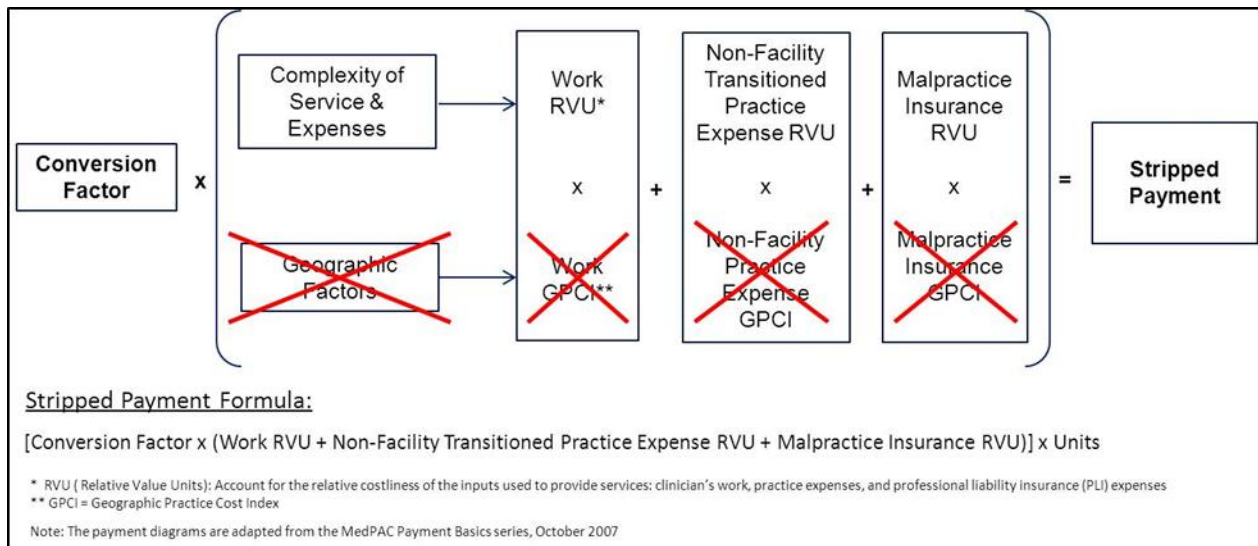


Hospital Outpatient and Community Mental Health Centers (CMHCs): Stripped Payment

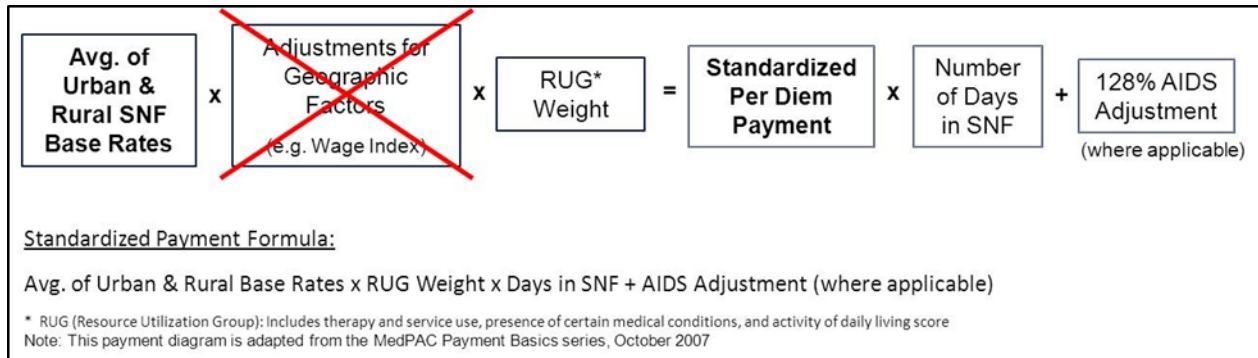


Note: Outpatient hospital claims can include services paid under the clinical lab, ambulance, physician, DME/POS/PEN, and Part B drugs fee schedules as well. Payments for those services are calculated according to the applicable payment formula.

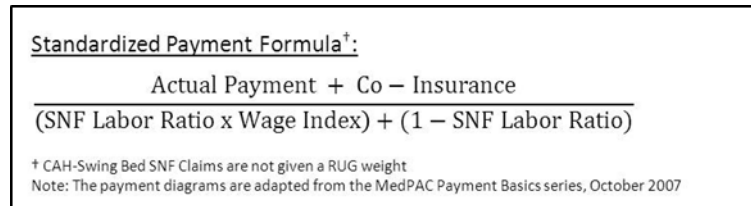
Comprehensive Outpatient Rehabilitation Facilities (CORFs) and Outpatient Rehabilitation Facilities (ORFs): Stripped Payment



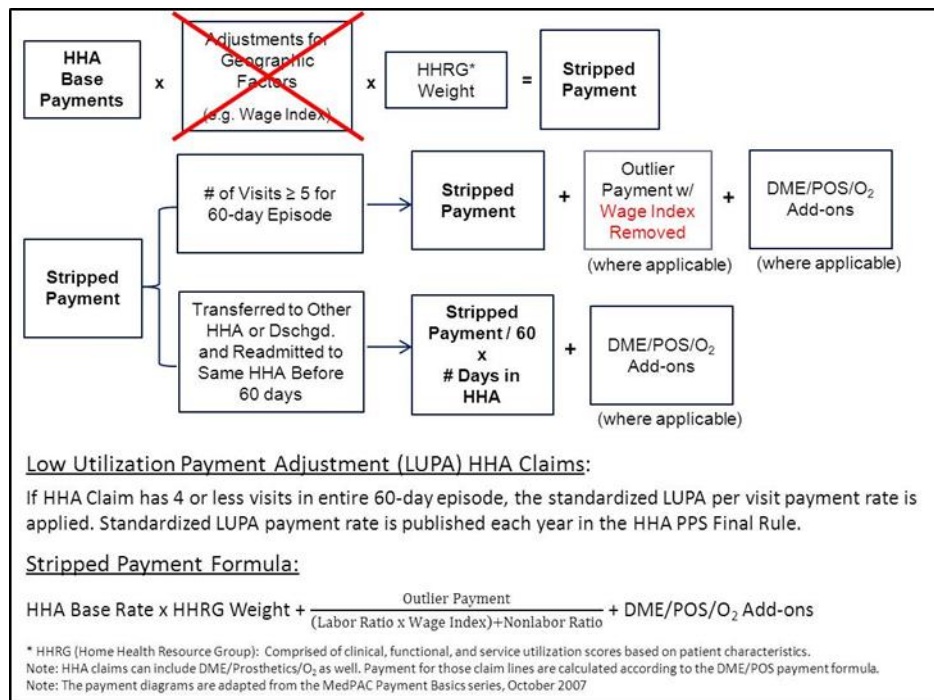
PPS SNF Claims: Standardized Payment



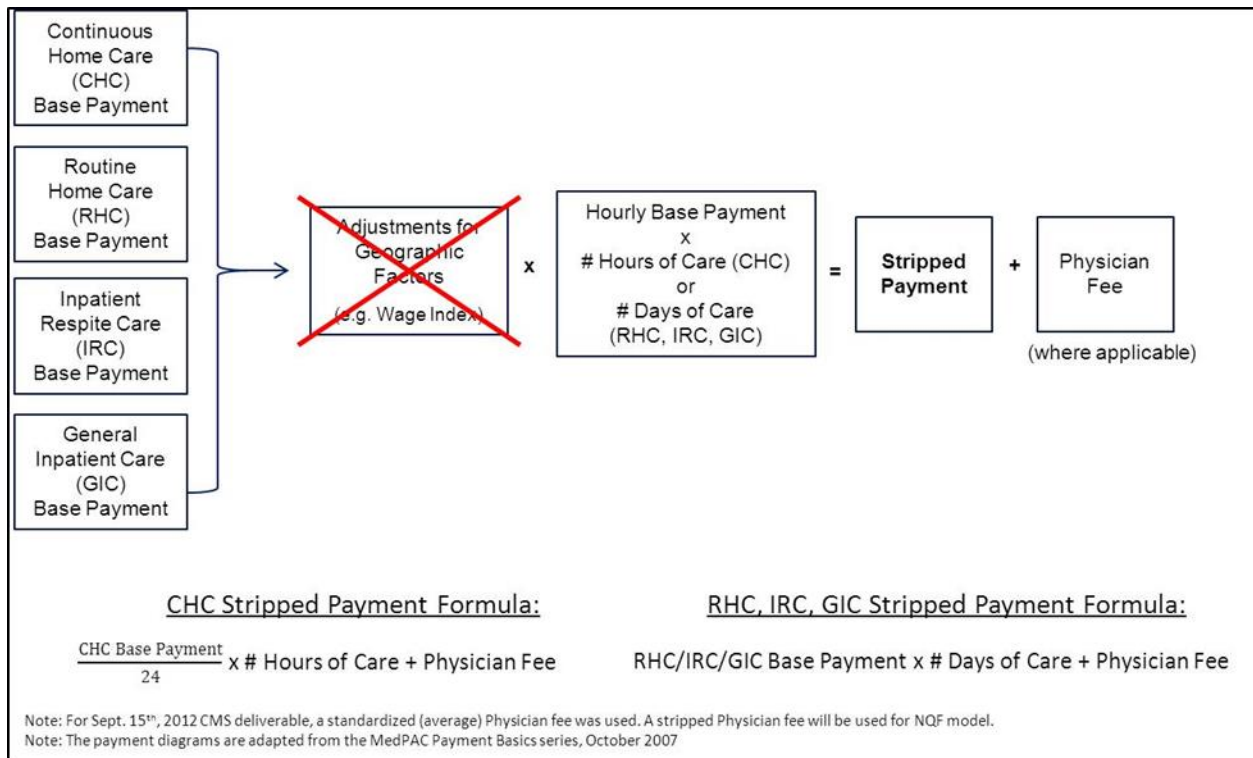
CAH Swing-Bed SNF Claims: Standardized Payment



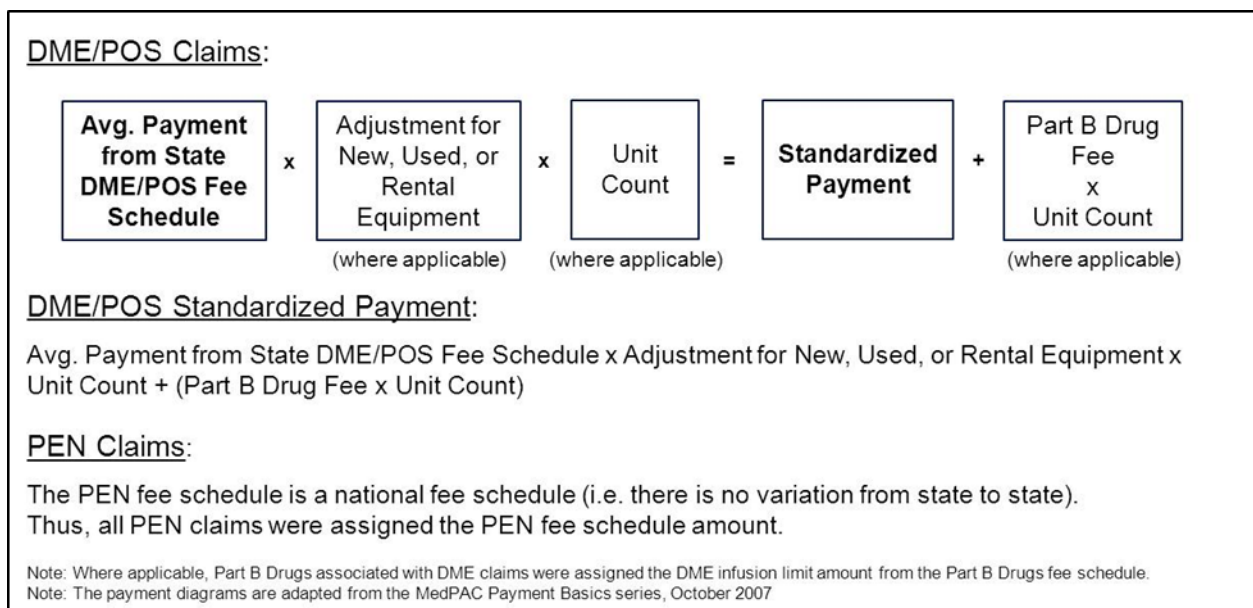
Home Health Agency (HHA): Stripped Payment



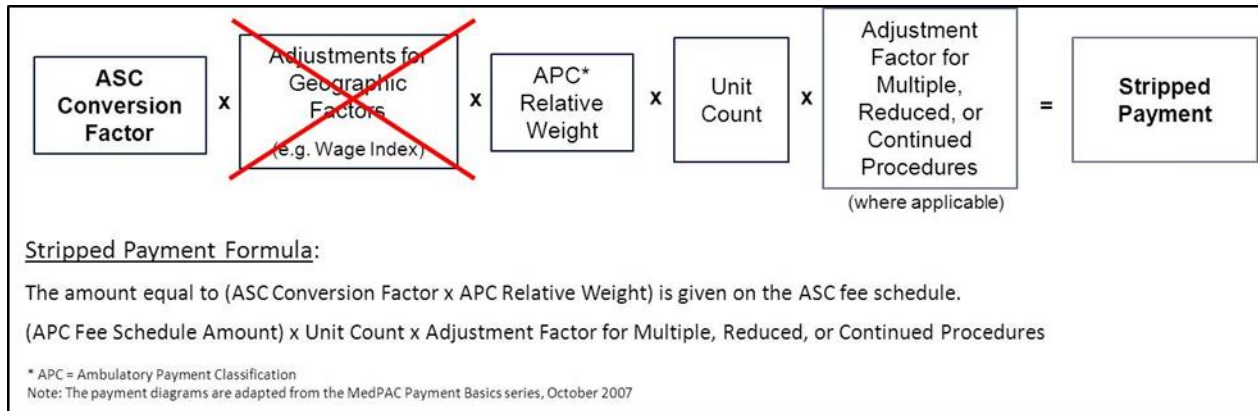
Hospice: Stripped Payment



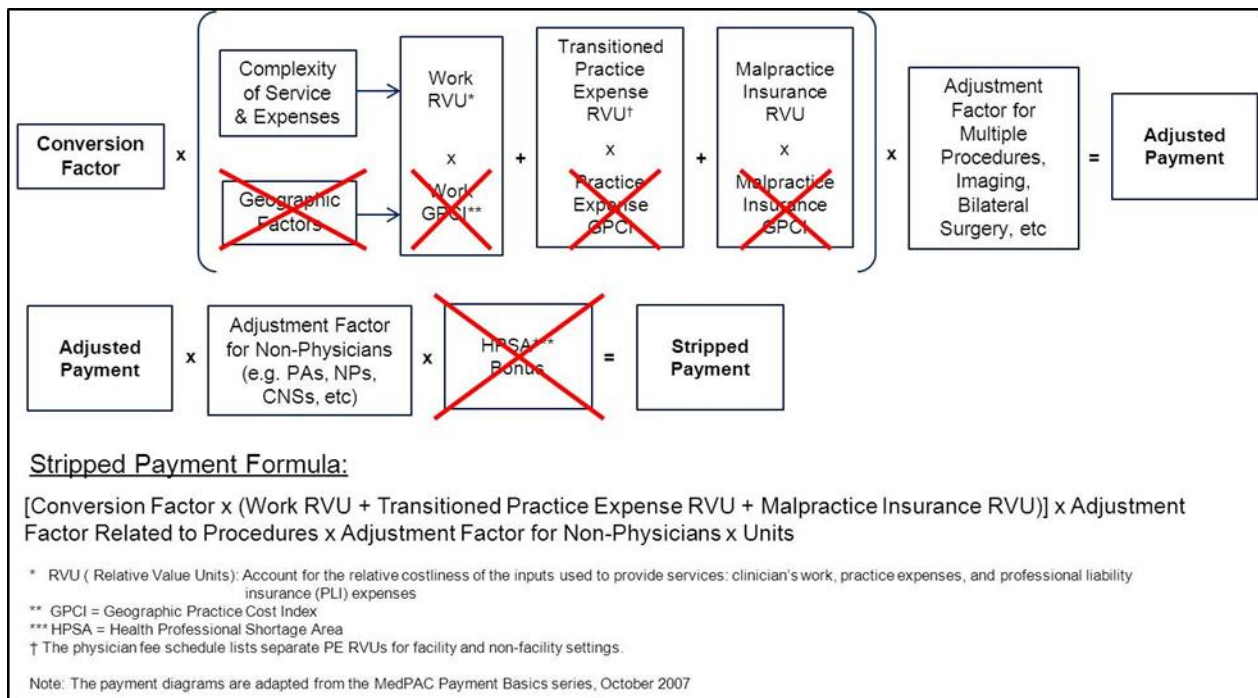
Durable Medical Equipment (DME)/Prosthetics, Orthotics, and Surgical Supplies (POS)/Parenteral and Enteral Nutrition (PEN) Claims: Standardized Payment



Ambulatory Surgical Center (ASC): Stripped Payment



Physician Services: Stripped Payment



Clinical Labs: Standardized Payment

| | | | | |
|--|----------|-----------------------|----------|---------------------------------|
| Avg. Payment from State Clinical Diagnostic Laboratory Fee Schedule | x | Unit Count | = | Standardized Payment |
|--|----------|-----------------------|----------|---------------------------------|

Standardized Payment Formula:
Avg. Payment from State Clinical Diagnostic Laboratory Fee Schedule x Unit Count

Labs Under the Automated Multi-Channel Chemistry Code (AMCC) Payment Algorithm Standardized Payment Formula:
Actual Payment + Co-insurance + Deductible

Part B Drugs: Standardized Payment

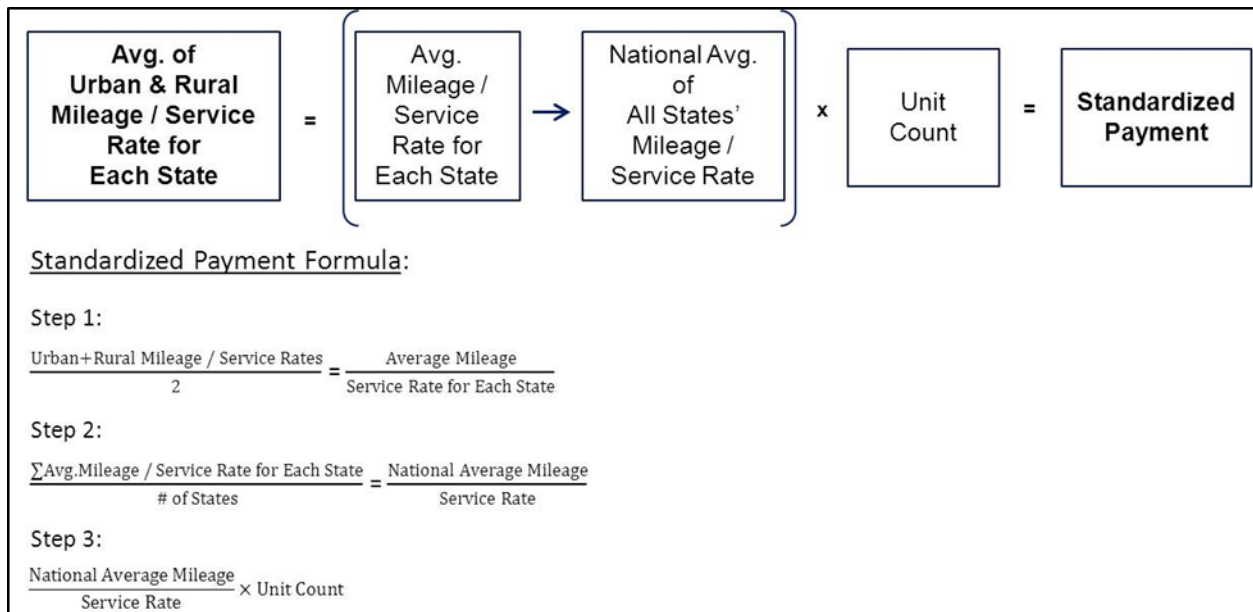
| | | | | |
|--|----------|-----------------------|----------|---------------------------------|
| Part B Drugs National Fee Schedule Amount | x | Unit Count | = | Standardized Payment |
|--|----------|-----------------------|----------|---------------------------------|

The Part B Drug fee schedule is a national fee schedule (i.e. there is no variation from state to state). Thus, all Part B Drug claims were assigned the national fee schedule amount.

Standardized Payment Formula:
Part B Drugs National Fee Schedule Amount x Unit Count

Note: Where applicable, Part B Drugs associated with DME claims were assigned the DME infusion limit amount from the Part B Drugs fee schedule.

Ambulance: Standardized Payment



Rural Health Clinics (RHCs) and Federally Qualified Health Clinics (FQHCs): Standardized Payment

RHCs:

Each year Congress determines a RHC per visit payment limit. We remove the portion of the payment likely attributable to wages using the SNF state rural wage index.

Stripped Payment Formula:

$$\frac{\text{Actual Payment} + \text{Co} - \text{Insurance} + \text{Deductible}}{(\text{Outpatient Labor Ratio} \times \text{Wage Index}) + (1 - \text{Outpatient Labor Ratio})}$$

FQHCs:

FQHC payments are an all-inclusive per visit amount based on reasonable costs. Given the resources necessary to determine whether the FQHC is located in a rural or urban area, we did not adjust for wages in the current data.

Standardized Payment Formula:

Actual Payment + Co-insurance

Note: A FQHC PPS is scheduled to be implemented in 2014.

Renal Dialysis Facilities (RDFs): Stripped Payment

Given that the 2008/2009 Renal Dialysis payment rates are adjusted by patient-specific body measurements which we do not have in our data, as well as capped at an amount equal to 3 dialysis sessions per week, we chose to remove the portion of the payment likely attributable to wages using the RDF wage index.

Stripped Payment Formula:

$$\frac{\text{Actual Payment} + \text{Co} - \text{Insurance} + \text{Deductible}}{(\text{Outpatient Labor Ratio} \times \text{Wage Index}) + (1 - \text{Outpatient Labor Ratio})}$$

Note: A Renal Dialysis PPS was implemented in 2011.

Appendix E. Technical Expert Panel Member Roster

| Name | Title | Organization | Area of Expertise |
|--------------------------------|---|--|---|
| Amanda Kowalski, PhD | Assistant Professor of Economics | Yale University | Topic Knowledge |
| Anne-Marie Audet, MD, MSc, SM | Vice President, Health System Quality and Efficiency | Commonwealth Fund | Quality Improvement and Performance Measurement |
| David S. P. Hopkins, PhD | Senior Advisor | Pacific Business Group on Health | Consumer, Quality Improvement, Performance Measurement |
| Donald Casey, MD, MPH, MBA | Vice President and Medical Director | NYU Langone Medical Center | Quality Improvement and Performance Measurement |
| Kavita Patel, MD, MS | Brookings Institution, Managing Director for Clinical Transformation and Delivery | Engelberg Center for Health Care Reform | Topic Knowledge |
| Lesley Curtis, PhD, MS | Associate Professor in Medicine | Duke University | Topic Knowledge and Performance Measurement |
| Peter Bach, MD, MAPP | Director, Center for Health Policy and Outcomes | Memorial Sloan-Kettering Cancer Center | Quality Improvement, Topic Knowledge, Health Care Disparities |
| Peter Lindenauer, MD, MSc | Associate Professor of Medicine; Medical Director, Clinical and Quality Informatics; Director | Tufts University; Baystate Medical Center; Center for Quality of Care Research | Topic Knowledge, Performance Measurement, Quality Improvement |
| Scott Flanders, MD | Professor of Internal Medicine; Director of the Hospitalist Program | University of Michigan | Topic Knowledge and Quality Improvement |
| Stephen Schmaltz, PhD, MS, MPH | Associate Director, Center for Database Management and Analysis | Joint Commission | Quality Improvement and Performance Measurement |
| Terry Golash, MD | Senior Medical Director | Aetna | Purchaser perspective |
| Vivian Ho, PhD | James A. Baker III Institute Chair in Health Economics and Professor of Economics | Rice University | Topic Knowledge |