CENTER FOR HEALTH INFORMATION AND ANALYSIS

Hospital-Wide Adult All-Payer Readmissions in Massachusetts

SFY 2011-2020

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Technical Appendix



Hospital-Wide Adult All-Payer Readmissions in Massachusetts SFY 2011-2020

TECHNICAL APPENDIX

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Introduction

This technical appendix provides details on the methodology used for the seventh annual readmission report, Hospital-Wide Adult All-Payer Readmissions in Massachusetts SFY 2011-2020, released by the Center for Health Information and Analysis (CHIA) in March 2022. This Appendix comprises three sections: a detailed description of the readmissions methodology, a table listing the characteristics of Massachusetts acute care hospitals, and a section with details on several of the categorizations used in the report.

Readmissions Methodology

History of the HWR Measure

Since 2009, the Centers for Medicare and Medicaid Services (CMS) has publicly reported a set of 30-day disease-specific readmission measures for hospitals, specific to Medicare fee-for-service beneficiaries. Subsequently in 2011, CMS contracted with the Yale New Haven Health Services Corporation/Center for Outcomes Research and Evaluation (YNHHSC/CORE) to develop a hospital-wide all-cause unplanned readmissions measure (the HWR measure) for the Medicare fee-for-service population aged 65 and older.¹ The hospital-wide measure was endorsed by the National Quality Forum (#1789) and CMS started reporting the measure publicly in 2013. Each year, the Yale team updates the measure slightly, with regular updates to the planned readmissions algorithm. Other notable changes include modifying the data processing and analysis programs in 2017 to accommodate the transition from ICD-9-CM codes to ICD-10-CM codes that was implemented in October 2015 ², and modifying how discharges transferred to rehabilitation units were identified in 2018. This year, CHIA's readmission report uses the 2021 CMS readmission measure (version 10.0), which includes updates to the ICD-10 code specifications and the planned readmissions algorithm.³

Overview of the Readmission Measure

The logic of the HWR measure requires the specification of a denominator, the number of eligible hospital discharges during a given time period that might possibly have resulted in a readmission (termed "index" discharge), and a numerator, the number of actual readmissions that occurred during the time period. The first two steps in the calculations are to identify these two sets of records. Dividing the number of readmissions by the number of index discharges and multiplying by 100 gives the readmission rate as a percentage. This rate is called an "observed" readmission rate because it is derived directly from what was observed during the study period. In the fourth step, observed rates calculated for each hospital are standardized to control for background factors that might influence readmission rates but may not be indicators of health care quality. The risk-standardized readmission rate (RSRR) typically controls for differences among hospitals in patient age, patient comorbidities, and hospital service mix. New for this year's report, the RSRR additionally adjusts for patient- and community-level social risk factors. CHIA's enhanced RSRR calculation is described in more detail below.

This report includes observed and risk-standardized readmission rates calculated separately by Massachusetts fiscal year. Each fiscal year runs from July 1 to June 30, and this report includes fiscal years 2011 – 2020 (i.e., July 1, 2010 to June 30, 2020). Observed rates are presented for the historical data and risk-standardized rates are presented for the latest year of data available, SFY 2020.⁴ As previously mentioned, this report uses the 2021 CMS readmission measure (version 10.0), which updates-the ICD-10 code specifications, including updates to the planned readmission algorithm.⁵

This report is the second report using an enhanced methodology to identify and link patient records, utilizing a probabilistic patient identifier instead of Social Security Number. This enhanced methodology allows for more discharges and readmissions to be kept in the final analytic dataset and is described in more detail below. The historical figures presented in this year's statewide annual report were recalculated using the enhanced patient identifier and version 10.0 of the CMS readmission measure and thus will not match those from earlier reports.

Data Source

For this year's data processing and analysis, CHIA used two sets of SAS program packages available from CMS: 1) the Measure Calculation Package (MCP) which is used to create the input data files for the hospital-wide readmission analyses⁶; and 2) the 2021 hospital-wide all-cause risk-standardized readmission measure SAS package which is used to create the analysis datasets.⁷

The HWR measure uses CMS Medicare claims data as the input for data processing. The MCP package has processing algorithms to produce three types of input data that are required by the HWR measure:

- A main "index" file that contains a record for each index discharge (used primarily to calculate the measure's denominator).
- A "follow-up" file that includes discharges that occurred within 30 days of an index discharge and could be classified as readmissions if they're not found to be planned (forms the measure numerator).
- A "history/diagnosis" file that includes information on patients' diagnoses within the year prior to an index discharge, which is used to form measures of comorbidities for the risk-standardization procedure.

Instead of claims data, CHIA used stay-level data from CHIA's Hospital Inpatient Discharge Database to calculate the HWR measure. The inpatient discharge dataset includes data on patient socio-demographics, diagnostic information, treatment and service information, and hospital charges. The data is submitted quarterly by all Massachusetts acute care hospitals and undergoes a cleaning and verification process at CHIA that includes the feedback of verification reports to hospitals for confirmation of their information. Once quarterly data has been processed and verified, CHIA produces and makes available annual files based on federal fiscal years (FFY, running from 10/1 to 9/30).8 All discharges, if included by a hospital in data submitted to CHIA may be included in the analysis. Starting in FFY 2019, admissions to a swing bed or general inpatient practice for inpatient hospice services were excluded if they were appropriately flagged using specified patient disposition and admission source codes provided by CHIA.

Beginning with the FFY 2015 data collection and moving forward, CHIA has allowed hospitals to report unlimited numbers of procedures and diagnoses per discharge, whereas for previous years, the data submissions were capped at 15 procedures and 15 diagnoses per discharge. After finding that the impact of these changes on readmissions calculations was minimal, we have now implemented the same standard as CMS by including up to 25 diagnosis codes and up to 25 procedure codes on each discharge record.

To accommodate CHIA's hospital inpatient discharge data, CHIA modified the MCP processing logic by removing logic to build stay-level data and removing insurance coverage enrollment requirements. The primary modification to the stay-level code was eliminating the section that merges patient demographic information with visit information. CHIA's hospital inpatient discharge data already has patient demographic information at the visit level. Furthermore, CMS Medicare claims data includes information on Medicare eliqibility. The MCP processing logic limits eliqible index

discharges to patients with at least 12 months of enrollment in Medicare Part A before an index discharge in order to have adequate diagnosis data for case-mix adjustment. The logic also limits discharges to patients with at least 30 days of enrollment in Medicare after the index discharge, in order for there to have been the possibility of experiencing a readmission that would appear in the data. Since the CHIA inpatient discharge data is for all patients seeking inpatient care at any acute care hospital in Massachusetts, data processing does not need to account for enrollment in insurance coverage. All patients in the inpatient discharge data are included in the calculation of CHIA's measure.

Patient Identification

To link patient records, CHIA utilizes an enhanced patient identifier (EPI) for its readmissions analyses. In reports published before 2019, patients were identified and linked using Social Security Number (SSN), and patients with missing or invalid SSN were dropped from the analysis. However, the quality and completeness of SSN on patient records has deteriorated over time. In SFY 2020, 18.5% of adult discharges had missing or invalid SSN, up from 9.5% in SFY 2018. The EPI is created by CHIA using Master Data Management (MDM) techniques by employing an industry-leading MDM software solution, IBM Initiate Master Data Service. It utilizes probabilistic matching on all available and valid patient demographic information to identify records belonging to the same patient. Patient demographic information was sourced from CHIA's Acute Hospital Case Mix Databases which include hospital inpatient discharge data, outpatient observation data, and emergency department data, and has records dating back to 2006.

Calculation Steps for the Readmission Measure

Calculating the CMS/Yale Hospital-Wide All-Cause Unplanned 30-day Readmission measure involves four steps:

- 1. Identifying the set of index discharges during the designated time period,
- 2. Identifying readmissions,
- 3. Calculating observed readmission rates, and
- **4.** Calculating risk-standardized readmission rates.

The section of the report titled About the Readmissions Methodology describes these four steps briefly. These steps are described in greater detail below.

Step 1: Definition of Index Discharge

Figure 3 illustrates the construction of the readmissions analytic cohort for the July 2019 to June 2020 study period. Processing for the other study years is parallel. The data preparation involves two conceptual steps: 1) preparation of a base "index discharge" cohort, and 2) application of a series of exclusions to create a final analytic file used for calculations.

The base index discharge cohort, produced at the end of the first processing step, comprises:

- Discharges from non-federal acute care hospitals in Massachusetts,
- for adults (age 18+),
- within the study period, July 1, 2019 to June 30, 2020,

- that had an enhanced patient identifier assigned to the record,
- were not from pediatric, cancer, or COVID-19 field hospitals,
- were not transfers to other acute hospitals, and
- in which the patient did not die while in the hospital.

This set of records constitutes the conceptual base on which the measure is calculated and excludes records which are incompatible with the logic of the measure (e.g., if a patient dies in the hospital they are not at risk of having a subsequent readmission). There were 664,816 discharge records in CHIA's Hospital Inpatient Discharge Database for adults (age 18+) from July 1, 2019 to June 30, 2020. The exclusions because of in-hospital death (n=18,385, 2.8%) and transfers to another acute care hospital (n=15,131, 2.3%) applied to a sizable number of records. Exclusions due to missing the enhanced patient identifier were negligible (n=1, 0.0%). The final base cohort included 625,949 discharges, or 94.2%, of the original adult discharges in SFY 2020.

CHIA Case Mix Discharge Records: MA Non-Federal Acute-Care Hospital Discharges for Adults, 7/1/19-6/30/20 N=664.816 Missing patient identifier N=1 %=0.00 Record Cleaning/Collapsing * N=3,366 %=0.5 Pediatric Hospitals N=1,667 %=0.3 Cancer Hospitals N=345 %=0.1 Transfers ** N=15,131 %=2.3 Deaths in Hospital ** N=18,385 %=2.8 **COVID-19 Field Hospitals** N=518 %=0.1 **Index Discharges** (Before Exclusions) N=625,949 (94.2%) Obstetric Admissions N=72,637 %=11.6 Psychiatric Admissions N=29,794 %=4.8 **Cancer Treatment** N=13,829 %=2.2 Against Medical Advice N=14,298 %=2.3 Rehabilitation Admissions N=1,225 %=0.2 Analytic Cohort N=494,712 (79.0%)

Figure 3: Construction of the SFY 2020 Analytic Cohort

Note: Exclusions are not mutually exclusive.

^{*} Cleaning/collapsing includes: Removing duplicate records, collapsing overlapping stays, removing stays > 1 year, and combining adjacent admissions.

^{**} The exclusions for transfer and death were implemented after making the exclusions above them in the figure.

In the second stage of processing, records meeting any of five specific criteria were excluded from the final analytic dataset. The five exclusion criteria applied were:

- Admissions for obstetric care: The Yale team recommended removing obstetric admissions when working with an all-payer population because the rate of readmission for obstetric cases is substantially lower than that for other admissions, and therefore distorts overall readmission rates. This was the largest exclusion, accounting for 72,637 records (11.6%).
- Admissions for psychiatric conditions: Since patients admitted primarily for psychiatric conditions (n=29,794, 4.8%) are typically treated in different types of facilities from acute care hospitals, they are excluded from the measure.
- Treatment for cancer: Because cancer patients showed different readmission and mortality profiles from other patients during the preliminary measure development research, the Yale team determined that they should not be included in the final measure. This exclusion resulted in 13,829 (2.2%) records being dropped.
- Against medical advice: Patients discharged against medical advice (AMA) are excluded because they did
 not necessarily receive the full care the hospital intended to provide. This criterion resulted in the exclusion
 of 14,298 (2.3%) records.
- Admissions for rehabilitation care: Patients admitted for rehabilitation (n=1,225, 0.2%) are typically not served in acute care hospitals and are excluded.

Once these exclusions were applied to the SFY 2020 data, the final resulting analytic cohort included 494,712 eligible index discharges. The process for constructing the analytic cohorts for other years is identical.

This definition of the analytic cohort differs from the original Yale specification in the following ways:

- The Yale/CMS measure includes admissions for those enrolled in Medicare fee-for-service coverage; the CHIA Massachusetts measure includes discharges covered by all payers.
- The Yale measure includes patients aged 65 and older; this measure includes patients aged 18 and over.
- The CHIA measure explicitly excludes obstetric cases.
- The Yale measure limits based on Medicare eligibility; the CHIA measure does not.

Table 1 shows the overall counts and percentages for the dataset creation process for the SFY 2020 data.

Table 1: Counts for the Dataset Creation Process for SFY 2020

| PROCESSING STEP | N | % OF ADULT DISCHARGES | % OF INDEX DISCHARGES BEFORE EXCLUSIONS |
|---------------------------------------------------------------------------|---------|-----------------------|-----------------------------------------|
| All discharges for adults in CHIA's Hospital Inpatient Discharge Database | 664,816 | 100.0% | - |
| Index discharges, before exclusions | 625,949 | 94.2% | 100.0% |
| Analytic cohort | 494,712 | 74.4% | 79.0% |

Step 2: Definition of Readmissions

The second step of the HWR calculations is to count the number of readmissions. Once the index discharges have been identified, it is relatively simple to quantify the number of readmissions. Under the HWR algorithm, readmissions are defined as any admissions that occur within 30 days of an index discharge, excluding those that are deemed to be planned (see below). Note that under this definition a particular hospital stay may count both as an index discharge and as a readmission in relation to an earlier index discharge. Patients may have multiple readmissions if they cycle in and out of the hospital with a frequency less than or equal to 30 days.

The CMS/Yale methodology includes an algorithm for excluding from the calculations those readmissions that are likely to have been planned. Yale researchers determined the types of inpatient care that are always planned (i.e., transplant surgery, maintenance chemotherapy/immunotherapy, rehabilitation) and a list of inpatient procedures that are usually planned (e.g., non-acute admissions for a scheduled procedure such as knee arthroplasty or hip replacement), and revised the list following a public comment period and a subsequent chart review validation study. A readmission is classified as planned, and therefore excluded from the readmission rate calculations, if it is one of the care types that are always planned or if it includes one of the procedures that are usually planned and the discharge condition for the readmission is a non-acute condition. For a detailed list of the procedure codes considered planned in the 2021 CMS readmission measure, see https://www.qualitynet.org/inpatient/measures/readmission/methodology.

Step 3: Calculation of Observed Readmission Rates

The observed readmission rate for a hospital, or for some other defined group of patients or visits, is simply the number of readmissions that occurred during the designated time period (plus 30 days thereafter), divided by the base number of index discharges within the period, and multiplied by 100 to produce a percentage. The report features readmission rates calculated for hospitals as well as by other patient-level and visit-level characteristics such as patient age, payer type, and discharge status. In this report, the average length of stay is calculated as the difference between the discharge date and the admission date on the index inpatient record.

Step 4: Calculation of Risk-Standardized Readmission Rates (RSRRs)

The Yale team designed the risk-standardization procedure to adjust hospitals' observed readmission rates by potentially confounding background factors that might influence readmissions. The risk-standardized readmission rate (RSRR) accounts for differences in background factors among the patients served by different hospitals so that more meaningful comparisons can be made between hospitals.⁹ New in this year's report, CHIA enhanced the risk-

standardization process based on guidance from an expert work group on social risk factors, comprised of representatives from state agencies, hospitals and health systems, provider and payer organizations and method and content experts 10. The enhanced model additionally adjusts for patient- and community-level social risk factors to provide a more fair comparison of hospital performance in Massachusetts.

Cohort Assignment

The risk-standardization procedure is carried out separately on five clinically-defined cohorts of patients. By standardizing separately for different groups of patients, the procedure allows the adjustments made to be different for different types of patients, rather than assuming that one adjustment works well for all patients. Also, patients who have the same broad category of illness are likely to be treated by the same broad provider team, and care for patients within these groups is likely to be more homogeneous than care provided to patients across groups. The measure assigns patients to one of five clinically-defined cohorts:

- Surgery/gynecology
- Cardiorespiratory
- Cardiovascular
- Neurology
- Medicine

Assignment to these five cohorts is based on the AHRQ Clinical Classifications Software (CCS) grouper that assigns ICD-9-CM and ICD-10-CM procedure and diagnosis codes to a smaller number of clinically coherent categories (approximately 230 procedures and 280 diagnoses). For discharges prior to October 1, 2015, the CCS grouper assignment is based on ICD-9-CM codes, while those on or after October 1, 2015 are based on ICD-10-CM codes. This year's report applies 2019.1 (beta version) of the AHRQ CCS grouper for ICD-10CM/PCS. Cohort assignment proceeds first by procedure code, and then by diagnosis code. First, patients with a procedure code indicative of having had a major surgery while in the hospital are assigned to the surgery/gynecology cohort. Then, remaining patients are assigned to one of the four remaining cohorts based on their principal discharge condition. Patients are assigned to the Medicine cohort when their condition does not correspond to any of the three more narrowly defined cohorts (cardiorespiratory, cardiovascular, neurology). The 2019.1 (beta version) of the AHRQ CCS grouper for ICD-10CM/PCS includes classifications for ICD-10CM/PCS codes through September 30, 2019. Since data used in this year's report covers discharges through June 30, 2020, CHIA collaborated with a clinician to review and classify ICD-10 codes introduced starting October 1, 2019 into one of the five clinically-defined cohorts.

Statistical Models

Once patients are assigned to cohorts, a separate risk-adjustment model is fit for each cohort. The HWR methodology uses hierarchical logistic regression models, with discharges nested within hospitals, to estimate hospitals' impact on readmissions. CHIA's enhanced model controls for patient case mix, hospital service mix, and patient- and community-level social risk factors.

The hierarchical logistic regression models predict readmission at the discharge level (coded 0/1) from discharge-level and hospital-level factors. At the discharge level, three factors are controlled for based on the original HWR model:

- Patient age: Age is measured in years, and then grouped into eight categories.
- Patient case mix: Patient case mix is operationalized as an index of 31 indicators for comorbid conditions based on diagnosis information from the index discharge and diagnosis information from 12 months preceding the index discharge. The individual comorbidity indicators are based on the CMS Condition Categories grouper. The Yale team selected conditions by starting from those used in previous hospital-specific readmissions measures, and then conducting a clinical review and a statistical modeling process to identify conditions that were both predictive of readmission as well as clinically meaningful. The comorbidity indicators include conditions such as metastatic cancer/acute leukemia, diabetes mellitus, end-stage liver disease, drug and alcohol disorders, and congestive heart failure.
- Hospital service mix: Hospital service mix is operationalized as a set of variables indicating the patient's specific discharge condition within each of the five clinical cohorts. These measures are based on the AHRQ Clinical Classifications Software (CCS) grouper, the same classification system used to define overall cohort membership. The Yale team reasoned that discharge conditions should be controlled for because different conditions will have different base probabilities of readmission and hospitals are likely to differ in the mix of conditions that they tend to treat.

In addition to the factors adjusted for in the original HWR model, CHIA additionally adjusts for patient- and community-level social risk factors at the discharge level. The patient-level social risk factors are:

- **Sex:** Patient sex is sourced from CHIA's hospital inpatient discharge database, and operationalized as whether or not the patient is male.
- Race and ethnicity: Patient race and ethnicity is sourced from CHIA's hospital inpatient discharge database. Data is cleaned and aggregated to classify patients into one of six categories: non-Hispanic white, non-Hispanic Black, non-Hispanic Asian, Hispanic, other, and unknown.
- Homeless status: Homeless status is sourced from CHIA's hospital inpatient discharge database and determined by the presence of a homelessness indicator on the discharge record or the presence of the ICD-9 or ICD-10 homelessness codes on any of the primary or secondary diagnoses (V600 for ICD-9, Z590 for ICD-10).
- Payer type inclusive of dual-eligibility status: Payer type is sourced from both CHIA's hospital inpatient discharge database and CHIA's All-Payer Claims Database (APCD). Payer type for patients who are dually eligible for Medicare and Medicaid is sourced from CHIA's APCD. All other payer type information is sourced from CHIA's hospital inpatient discharge database. Data is cleaned and aggregated to classify patients into one of six categories: Dual Eligible, Medicare-Only, Medicaid-Only, Self-Pay/Other, Commercial, and Unknown.

Community-level variables are sourced from the Census (2010) and American Community Survey (2015-2019) and appended to discharge records based on Census block group or zip code. Variables cover five domains of social risk:

- **Poverty:** Median family income and percent of single parent households with dependents under age 18 are used as indicators for community-level poverty.
- Food Insecurity: Percent of population on SNAP is used for community-level food insecurity.
- **Housing:** Median home value and the percent of population who have lived in the same house in the past 12 months are used as indicators for community-level housing stability.
- **Education:** Percent of population 25+ with at least a high school education is used for community-level education.
- **Employment:** Percent of employed persons 16+ in white collar occupations and the percent of population 16+ who are unemployed are used as indicators for community-level employment.

Community-level data from the Census and American Community Survey were linked to the hospital inpatient discharge data using Census block group or zip code, if block group information was not available. To assign block groups to discharge records, CHIA contracted with a team at UMass Medical School to geocode the hospital inpatient discharge data. Geocoding was performed for discharges for patients residing in New England (ME, VT, NH, MA, CT and RI) and New York, covering 99% of eligible discharges. All risk-adjustment analyses are limited to discharges for New England and New York residents.

At the hospital level, a random intercept term for hospital is included in each model. This term allows the predicted probability of readmission for all the patients in a hospital to be increased or decreased by a fixed amount. Inclusion of this term has two important effects. First, it properly accounts for the grouping of patients within hospitals. Without this term, the model would violate one of the statistical assumptions of regression analysis, that cases are independent of one another. Second, since this term represents an increase or decrease in the probability of readmission for the patients in each hospital, controlling for the above patient factors, it directly indexes the impact of hospital on readmissions. Therefore, it plays a central role in the calculations. Each model produces two numbers for each hospital:

- The *predicted* number of readmissions: This estimate comes from the full model, including both the discharge-level variables and the hospital term. It represents the model-based prediction of the number of readmissions, including both the background characteristics of the patients, and which hospital they attend.
- The expected number of readmissions: This estimate is predicted from the model excluding the hospital term. It represents the number of readmissions that would be expected given only the patient background factors, and ignoring the effect of hospital.

The ratio of these two numbers, the predicted number divided by the expected number, gives the *standardized* readmission ratio (SRR) for each cohort and hospital. This number represents the extent to which a hospital has more (numbers > 1) or fewer (numbers < 1) readmissions for the cohort than one would expect based on the characteristics of the patients they treat.

The final *risk-standardized readmission rate* (RSRR) for a hospital is calculated by combining the standardized readmission ratios from the five cohort-specific models. Specifically, the volume-weighted logarithmic mean of the

five SRRs is calculated to produce a hospital-wide standardized readmission ratio. This weighting procedure allows larger cohorts within a hospital to have a larger impact on the final rate. In a final step, the hospital-wide SRR for each hospital is multiplied by the statewide observed readmission rate to produce the final set of RSRRs.

Weighting of RSRR's for Analyses of Hospital Characteristics

In order to aggregate the risk-standardized readmission rates across hospitals to larger entities such as geographic regions and hospital systems, we averaged the hospital-specific RSRR's for each group and weighted each hospital's RSRR by their discharge volume. This weighting scheme allows hospitals with higher volumes to contribute more to the aggregated rates than those with lower volumes.

Hospital Characteristics

Each acute care hospital is assigned to a group of similar hospitals: Academic Medical Centers (AMCs), teaching hospitals, community hospitals, community-High Public Payer (HPP) hospitals, and specialty hospitals. Academic Medical Centers (AMCs) are a subset of teaching hospitals. Hospital characteristics are assessed at the end of the reporting period, state fiscal year 2020.

- AMCs are characterized by extensive research and teaching programs, comprehensive resources for tertiary and quaternary care, being principal teaching hospitals for their respective medical schools, and being full service hospitals with case mix intensity greater than 5% above the statewide average.
- Teaching hospitals are hospitals that report at least 25 full-time equivalent medical school residents per one hundred inpatient beds in accordance with the Medicare Payment Advisory Commission (MedPAC) and are not classified as AMCs.
- Community hospitals are hospitals that do not meet the MedPAC definition to be classified as teaching hospitals and have a public payer mix of less than 63%.
- Community-High Public Payer (HPP) hospitals are community hospitals that have 63% or greater of Gross Patient Service Revenue (GPSR) attributable to Medicare, MassHealth, and other government payers, including the Health Safety Net.

Specialty hospitals are hospitals that serve unique patient populations or provide unique sets of services. These hospitals are not included in the hospital type comparison analysis but are included in statewide analyses.

Table 2: Hospital Characteristics

| HOSPITAL | TYPE | AFFILIATION | REGION |
|-------------------------------------|--------------------------------|--------------------------|-------------------------|
| Anna Jaques Hospital | Community Hospital | Beth Israel Lahey Health | Upper North Shore |
| Athol Hospital | Community-High Public Payer | Heywood Healthcare | Central Massachusetts |
| Baystate Franklin Medical Center | Community-High Public Payer | Baystate Health | Pioneer Valley/Franklin |

| HOSPITAL | TYPE | AFFILIATION | REGION |
|--------------------------------------------|--------------------------------|-------------------------------|------------------------------|
| Baystate Medical Center | Community-High Public Payer | Baystate Health | Pioneer Valley/Franklin |
| Baystate Noble Hospital | Community-High Public Payer | Baystate Health | Pioneer Valley/Franklin |
| Baystate Wing Hospital | Community-High Public Payer | Baystate Health | Pioneer Valley/Franklin |
| Berkshire Medical Center | Community-High Public Payer | Berkshire Health Systems | Berkshires |
| Beth Israel Deaconess Hospital - Milton | Community Hospital | Beth Israel Lahey Health | Metro Boston |
| Beth Israel Deaconess Hospital - Needham | Community Hospital | Beth Israel Lahey Health | Metro Boston |
| Beth Israel Deaconess Hospital - Plymouth | Community-High Public Payer | Beth Israel Lahey Health | South Shore |
| Beth Israel Deaconess Medical Center | Academic Medical Center | Beth Israel Lahey Health | Metro Boston |
| Boston Medical Center | Academic Medical Center | Not Applicable | Metro Boston |
| Brigham and Women's Faulkner Hospital | Community Hospital | Mass General Brigham | Metro Boston |
| Brigham and Women's Hospital | Academic Medical Center | Mass General Brigham | Metro Boston |
| Cambridge Health Alliance | Teaching Hospital | Not Applicable | Metro Boston |
| Cape Cod Hospital | Community-High Public Payer | Cape Cod Healthcare | Cape and Islands |
| Cooley Dickinson Hospital | Community Hospital | Mass General Brigham | Pioneer Valley/Franklin |
| Emerson Hospital | Community Hospital | Not Applicable | West Merrimack/ Middlesex |
| Fairview Hospital | Community-High Public Payer | Berkshire Health Systems | Berkshires |
| Falmouth Hospital | Community-High Public Payer | Cape Cod Healthcare | Cape and Islands |
| Harrington Memorial Hospital | Community-High Public Payer | Not Applicable | Central Massachusetts |
| HealthAlliance Hospital | Community-High Public Payer | UMass Memorial Health Care | Central Massachusetts |

| HOSPITAL | TYPE | AFFILIATION | REGION |
|-------------------------------------|--------------------------------|-------------------------------|------------------------------|
| Heywood Hospital | Community-High Public Payer | Heywood Healthcare | Central Massachusetts |
| Holyoke Medical Center | Community-High Public Payer | Not Applicable | Pioneer Valley/Franklin |
| Lahey Hospital & Medical Center | Teaching Hospital | Beth Israel Lahey Health | West Merrimack/ Middlesex |
| Lawrence General Hospital | Community-High Public Payer | Not Applicable | East Merrimack |
| Lowell General Hospital | Community-High Public Payer | Wellforce | West Merrimack/ Middlesex |
| Marlborough Hospital | Community-High Public Payer | UMass Memorial Health Care | Metro West |
| Martha's Vineyard Hospital | Community Hospital | Mass General Brigham | Cape and Islands |
| Massachusetts Eye and Ear Infirmary | Specialty Hospital | Mass General Brigham | Metro Boston |
| Massachusetts General Hospital | Academic Medical Center | Mass General Brigham | Metro Boston |
| MelroseWakefield Health | Community-High Public Payer | Wellforce | Metro Boston |
| Mercy Medical Center | Community-High Public Payer | Not Applicable | Pioneer Valley/Franklin |
| MetroWest Medical Center | Community-High Public Payer | Tenet Healthcare | Metro West |
| Milford Regional Medical Center | Community Hospital | Not Applicable | Metro West |
| Morton Hospital | Community-High Public Payer | Steward Health Care | Metro South |
| Mount Auburn Hospital | Teaching Hospital | Beth Israel Lahey Health | Metro Boston |
| Nantucket Cottage Hospital | Community Hospital | Mass General Brigham | Cape and Islands |
| Nashoba Valley Medical Center | Community-High Public Payer | Steward Health Care | West Merrimack/ Middlesex |
| New England Baptist Hospital | Specialty Hospital | Beth Israel Lahey Health | Metro Boston |
| Newton-Wellesley Hospital | Community Hospital | Mass General Brigham | Metro Boston |

| HOSPITAL | TYPE | AFFILIATION | REGION |
|-------------------------------------------|--------------------------------|-------------------------------|------------------------------|
| North Shore Medical Center | Community-High Public Payer | Mass General Brigham | Lower North Shore |
| Northeast Hospital | Community-High Public Payer | Beth Israel Lahey Health | Lower North Shore |
| Saint Vincent Hospital | Teaching Hospital | Tenet Healthcare | Central Massachusetts |
| Signature Healthcare Brockton Hospital | Community-High Public Payer | Not Applicable | Metro South |
| South Shore Hospital | Community Hospital | Not Applicable | South Shore |
| Southcoast Hospitals Group | Community-High Public Payer | Not Applicable | New Bedford |
| Steward Carney Hospital | Teaching Hospital | Steward Health Care | Metro Boston |
| Steward Good Samaritan Medical Center | Community-High Public Payer | Steward Health Care | Metro South |
| Steward Holy Family Hospital | Community-High Public Payer | Steward Health Care | East Merrimack |
| Steward Norwood Hospital | Community-High Public Payer | Steward Health Care | Norwood/ Attleboro |
| Steward Saint Anne's Hospital | Community-High Public Payer | Steward Health Care | Fall River |
| Steward St. Elizabeth's Medical Center | Teaching Hospital | Steward Health Care | Metro Boston |
| Sturdy Memorial Hospital | Community-High Public Payer | Not Applicable | Norwood/ Attleboro |
| Tufts Medical Center | Academic Medical Center | Wellforce | Metro Boston |
| UMass Memorial Medical Center | Academic Medical Center | UMass Memorial Health Care | Central Massachusetts |
| Winchester Hospital | Community Hospital | Beth Israel Lahey Health | West Merrimack/ Middlesex |

Data Categorization and Grouping

All Payer Refined – Diagnosis Related Groups (APR-DRGs)

The All Patient Refined – Diagnosis Related Groups (APR-DRGs, 3M) are a severity and risk-adjusted classification system that provides a more effective means of adjusting for patient differences. The 3M APR-DRGs expand the basic DRG structure by adding four subclasses to each illness and risk of mortality. CHIA utilized version 30.0 of the APR-DRG, which was used to group inpatient discharges over the study period of SFY 2011-2020. The 3M APR-DRG grouper was used to analyze readmissions by top discharge diagnoses for this report.

Payer Type

For the reporting of readmission rates by payer type and by payer type and patient age, payer type categories were created by grouping payer source codes from CHIA's hospital inpatient discharge data. Payer type categories were grouped as follows:

- Medicare: Expected primary payer source is fee-for-service Medicare or managed care Medicare
- Medicaid: Expected primary payer source is MassHealth, including Medicaid managed care, or Commonwealth Care
- Commercial: Blue Cross and Blue Cross Managed Care, Commercial Insurance and Commercial Managed
 Care, HMO, PPO/Other managed care plans not elsewhere classified, point-of-service plans, exclusive
 provider organizations, and other non-managed care plans

Payer sources not included in the current reporting: Self-pay, Free Care, and Health Safety Net, Worker's Compensation, Other Government Payment, Auto Insurance, Dental Plans, and None (for Secondary Payer).

Discharge Setting

For the reporting of readmission rates by discharge setting, discharge settings were grouped into broader categories. They were grouped as follows:

- Home: home or self-care, rest home, and shelter
- Skilled Nursing Facility: skilled nursing facilities
- Home with Home Health Agency Care: home under care of organized home health service organization and home under care of a home IV drug therapy provider
- Hospice: home hospice care and hospice medical facility
- **Rehabilitation:** intermediate care facility, inpatient rehab facility, rehabilitation hospital and Medicare-certified long-term care hospital
- Other: critical access hospital, psychiatric hospital, federal healthcare facility, another short-term general
 hospital for inpatient care, another type of institution not defined elsewhere, and other discharge settings

COVID-19

A discharge was classified as being associated with COVID-19 if it had a primary or secondary ICD-10-CM diagnosis indicating confirmed (U07.1) or suspected COVID-19 (U07.2) for discharges from April – June 2020.

Notes

¹ The Mathematica Policy Research programs and documentation are available by request from the CMS Readmission Measures Mailbox at cmsreadmissionmeasures@yale.edu.

² For the original measure technical report see: Horwitz et. al. (2012). Hospital-wide all-cause unplanned readmission measure. Final technical report. Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation. For the updated 2021 v. 10.0 specification see: Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation (YNHHSC/CORE). (2021). 2021 Hospital-Wide Readmission Measure Updates and Specifications Report – Version 10.0. YNHHSC/CORE. Both available from: http://www.cms.gov/Medicare/Quality-Initiatives-Patient-Assessment-Instruments/HospitalQualityInits/Measure-Methodology.html. To download the NCQA measure specification document see http://www.qualityforum.org/WorkArea/linkit.aspx?LinkIdentifier=id&ItemID=69324.

³ For this report, CHIA used 2021, version 10.0 of the readmission measure specification. Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation (YNHHSC/CORE). "2021 Hospital-Wide Readmission Measure Updates and Specifications – Version 10.0" (April 2021). Accessed 8/6/2021.https://qualitynet.cms.gov/inpatient/measures/readmission/methodology.

⁴ Information on the Massachusetts Hospital Inpatient Discharge Database is available at http://www.chiamass.gov/case-mix-data/. CHIA's readmission measure is based on inpatient data. Observation stay data, which is reported by acute care hospitals to CHIA in a separate data file, was not included in the readmission measure.

⁵ See note 3.

⁶ Yale New Haven Health Services Corporation/Center for Outcomes Research & Evaluation (YNHHSC/CORE). "CMS Hospital-Wide All-Cause Unplanned Readmission Measure: 2021 SAS Pack Software Documentation" (July 2021). The Mathematica Policy Research programs and documentation are available by request from the CMS Readmission Measures Mailbox at cmsreadmissionmeasures@yale.edu.

⁷ See note 3.

⁸ The FY2020 Hospital Inpatient Discharge Dataset processed by CHIA on June 4, 2021 was used for all analyses published in this year's annual statewide report.

⁹ Though the model was developed for the Medicare FFS, 65+ population, the Yale team tested the model performance on an all-payer population and found it performed better in the all-payer population than in the Medicare FFS, 65+ data, hence concluding that the HWR measure can be applied to an adult all-payer population. For the model testing, see: National Quality Forum. "NQF #1789 Hospital-Wide All-Cause Unplanned Readmission Measure (HWR), pp 1287-1290. Accessed 4/11/2018. http://www.gualityforum.org/WorkArea/linkit.aspx?LinkIdentifier=id&ItemID=69324.

10 Accounting for Social Risk Factors in Public Reporting on Unplanned Hospital Readmissions in Massachusetts: A Workgroup Report https://www.chiamass.gov/assets/docs/r/pubs/2020/Social-Risk-Factors-and-Readmissions-report-February-2020.pdf