

# The Quality of Quality Measures: HEDIS<sup>®</sup> Quality Measures for Medication Management in the Elderly and Outcomes Associated with New Exposure

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## Abstract

**Background** Clinical validation studies of the Healthcare Effectiveness Data and Information Set (HEDIS<sup>®</sup>) measures of inappropriate prescribing in the elderly are limited. **Objectives** The objective of this study was to examine associations of new exposure to high-risk medication in the elderly (HRME) and drug–disease interaction (Rx-DIS) with mortality, hospital admission, and emergency care.

**Methods** A retrospective database study was conducted examining new use of HRME and Rx-DIS in fiscal year 2006 (Oct 2005–Sep 2006; FY06), with index date being the date of first HRME/Rx-DIS exposure, or first day of FY07 if no HRME/Rx-DIS exposure. Outcomes were assessed 1 year after the index date. The participants were veterans who were  $\geq 65$  years old in FY06 and received Veterans Health Administration (VA) care in FY05–06. A history of falls/hip fracture, chronic renal failure, and/or dementia per diagnosis codes defined the Rx-DIS subsample. The variables included a number of new unique HRME drug exposures and new unique Rx-DIS drug exposure (0, 1, >1) in FY06, and outcomes (i.e., 1-year

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mortality, hospital admission, and emergency care) up to 1 year after exposure. Descriptive statistics summarized variables for the overall HRME cohort and the Rx-DIS subset. Multivariable statistical analyses using generalized estimating equations (GEE) models with a logit link accounted for nesting of patients within facilities. For these latter analyses, we controlled for demographic characteristics, chronic disease states, and indicators of disease burden the previous year (e.g., number of prescriptions, emergency/hospital care).

**Results** Among the 1,807,404 veterans who met inclusion criteria, 5.2 % had new HRME exposure. Of the 256,388 in the Rx-DIS cohort, 3.6 % had new Rx-DIS exposure. Multivariable analyses found that HRME was significantly associated with mortality [1: adjusted odds ratio (AOR) = 1.62, 95 % CI 1.56–1.68; >1: AOR = 1.80, 95 % CI 1.45–2.23], hospital admission (1: AOR = 2.31, 95 % CI 2.22–2.40; >1: AOR = 3.44, 95 % CI 3.06–3.87), and emergency care (1: AOR = 2.59, 95 % CI 2.49–2.70; >1: AOR = 4.18, 95 % CI 3.71–4.71). Rx-DIS exposure was significantly associated with mortality (1: AOR = 1.60, 95 % CI 1.51–1.71; >1: AOR = 2.00, 95 % CI 1.38–2.91), hospital admission for one exposure (1: AOR = 1.12, 95 % CI 1.03–1.27; >1: AOR = 1.18, 95 % CI 0.71–1.95), and emergency care for two or more exposures (1: AOR = 1.06, 95 % CI 0.97–1.15; >1: AOR = 2.0, 95 % CI 1.35–3.10).

**Conclusions** Analyses support the link between HRME/Rx-DIS exposure and clinically significant outcomes in older veterans. Now is the time to begin incorporating input from both patients who receive these medications and providers who prescribe to develop approaches to reduce exposure to these agents.

## 1 Introduction

The goals of pharmacotherapy in older adults are to extend and improve quality of life, and to treat and cure illness. However, exposure to inappropriate medications can lead to considerable morbidity and mortality [1]. Indeed, the Institute of Medicine has identified the recognition and prevention of drug-related problems in the elderly as a key priority for this decade [2, 3].

Potentially inappropriate medications can be measured using either implicit or explicit measures. Implicit measures that require clinician judgment of appropriateness for each case are time consuming and unrealistic to use in population-based studies [4]. The most commonly used set of explicit criteria was first developed in 1991 by Dr. Mark Beers and updated twice [5–7]. In 2006, using a subset of the 2003 Beers criteria, the National Committee on Quality Assurance (NCQA) created two measures to examine the quality of prescribing for older patients [8]: a list of drugs

to avoid [high-risk medications in the elderly (HRME)], and clinically relevant drug–disease interactions (Rx-DIS). These consensus-based quality measures were included in the Healthcare Effectiveness Data and Information Set<sup>®</sup> (HEDIS<sup>®</sup>), but little information is available linking exposure based on these measures to important health outcomes or health services used [9].

Prior studies examining prevalent use of the drugs included in the Beers criteria (foundation of these HEDIS<sup>®</sup> measures), led to inconsistent results [9–13]. We hypothesize that, because the majority of exposure represents chronic use [14, 15], the source of these inconsistent findings may be due to survivor bias, where individuals who have adverse events discontinue the drug and those who tolerate the drug represent the vast majority of prevalent users [16]. Thus, we sought to evaluate the clinical importance of HRME and Rx-DIS measures by assessing the association between new HRME and Rx-DIS exposure and the subsequent outcomes of emergency care, hospital admission, and mortality through use of a cohort of community-dwelling elders receiving care in the Veterans Health Administration (VA).

## 2 Methods

### 2.1 Study Design, Setting, and Sample

This retrospective new-exposure design was conducted using VA national data. The cohort consisted of veterans aged  $\geq 65$  years by October 1, 2005 [beginning fiscal year 2006 (FY06)] who received VA inpatient or outpatient care at least once each year in FY05 and FY06 (October 1, 2004 through September 30, 2006) and who were not in VA long-term care. Those with HRME or Rx-DIS exposure prior to FY06 ( $N = 142,988$ ) or who had subsequent new HRME or Rx-DIS exposure in FY07 ( $N = 73,077$ ) were excluded. This study was approved by Institutional Review Boards at the University of Texas Health Science Center at San Antonio and the Bedford, VA, USA.

### 2.2 Data Sources

We created an analytic dataset by combining national VA outpatient medication dispensing information from Pharmacy Benefits Management (PBM) Services, Medical SAS<sup>®</sup> Dataset files, and the VA Vital Status Mini file. The VA PBM prescription data included the start date, generic drug name, and day supply for each drug dispensed [17]. Medical SAS<sup>®</sup> Datasets contained International Classification of Diseases-9 (ICD-9) Clinical Modification codes for inpatient and outpatient diagnoses [18, 19]. The VA Vital Status Mini file included date of death (98 %

sensitivity when validated against the National Death Index) [20, 21].

### 2.3 Outcome Measures

We created three dichotomous dependent variables during the study period: mortality (Vital Status files), emergency care (VA stop code pair 102–101 in outpatient data), and VA hospital admission (date of admission using inpatient data). Outcomes were examined from initial exposure to 1 year after the index date, which was defined as exposure for HRME and Rx-DIS, respectively; for those without HRME or Rx-DIS, these outcomes were assessed in FY07.

### 2.4 Primary Independent Variables

#### 2.4.1 Exposure to High-Risk Medications in the Elderly

We identified new use of any HRME drug using the generic drug name in the VA PBM data. Specific medications included in this measure are included in Electronic Supplementary Material 1: HEDIS HRME measures. Those with no HRME exposure in FY05, and HRME exposure in FY06 were classified as having new HRME exposure, with the index date as the day of prescription. Those without HRME prescription were classified as no exposure, with 1 October 2005 as the index date.

#### 2.4.2 Exposure to Drug–Disease Interactions

To create the Rx-DIS variable, we first identified a subset of the cohort with falls/hip fracture, dementia, or chronic renal failure (CRF; includes only a portion of those with chronic kidney disease) using the ICD-9 codes algorithm developed and tested by NCQA [22].

Next we identified the specific drugs/classes that could exacerbate these disease/conditions based on the NCQA algorithms: (a) falls/fractures: tricyclic antidepressants, conventional or atypical antipsychotics, and specific sleep agents (e.g., zolpidem); (b) dementia: highly anticholinergic agents (i.e., gastrointestinal antispasmodics, skeletal muscle relaxants) and tricyclic antidepressants; (c) CRF: nonsteroidal anti-inflammatory drugs (NSAID) [23]. Those with no Rx-DIS exposure in FY05 but with Rx-DIS exposure in FY06 were classified as new Rx-DIS exposure, with the date of first prescription as the index date. For those without Rx-DIS exposure, the index date was October 1, 2005. For both independent variables, we further identified new exposure as none, one, or two or more (distinct drug) exposures to examine the possibility of a “dose–response” relationship.

### 2.5 Covariates

We controlled for a number of demographic and clinical characteristics that could potentially confound an association between HRME or Rx-DIS [24] and our three outcomes [11, 25, 26]. These variables were selected for inclusion in this analysis because they were identified as being associated with HRME and Rx-DIS in our prior research [14, 15].

#### 2.5.1 Demographic Characteristics

We identified patient demographic characteristics (age, sex, race/ethnicity) using data fields from FY04–FY06. With the exception of race/ethnicity, these demographic characteristics are well documented and complete in the medical record. Missing data on race/ethnicity is common in VA outpatient data; however, multiple years of data help to mitigate this problem. Categories of race/ethnicity were white, black, other (Native American or Asian), Hispanic (of any race), and missing. Finally, our prior studies have found that income under the VA poverty limit is associated with exposure to HRME and Rx-DIS, so we included an indicator for poverty based on the VA means test [18, 19].

#### 2.5.2 Clinical Characteristics

Clinical characteristics included a number of measures that directly indicate disease burden and several variables that are associated with high disease burden. Previous studies indicate that individuals with higher disease burden as defined by more medications, more physical comorbidities, and psychiatric conditions are at risk of adverse outcomes [2, 27–29]. We first counted the number of unique medications each individual received during FY05, which included medications prescribed for “as needed” use. We also used ICD-9-CM codes found in VA inpatient and outpatient data (FY04–05) to identify individuals with physical and psychiatric conditions using the Selim comorbidity indices [30, 31], which were developed as a measure of disease burden in research studies involving veterans. For physical conditions (Selim Physical), we counted the number of chronic disease states from 30 possible conditions (chronic kidney disease is included in this count, but not dementia or falls/fractures). The Selim Psychiatric Index included a count of six mental health conditions: schizophrenia, bipolar, depressive, substance use, anxiety, and posttraumatic stress disorders. To facilitate interpretation of findings, we created categorical variables. Based on the empirical distribution and our prior research, we classified medications as 0–5, 6–8, 9–11, and 12 or more. For physical conditions, we identified individuals with zero to one, two to three, four to five, and six

or more chronic conditions; we identified individuals with zero, one, and two or more psychiatric conditions.

We also included prior healthcare utilization that may indicate disease burden. Our prior research indicates that older veterans who receive geriatric care have been found to have higher disease burden and increased risk of HRME and Rx-DIS; therefore, we identified individuals who received geriatric care (outpatient or inpatient) in FY05 [8]. We also identified individuals who had at least one incidence of emergency care or hospital admission in FY05 as indicators of disease burden.

Finally, while primary care may reduce the need for emergency care and hospital admission for ambulatory care-sensitive conditions, it may also be an indicator of disease burden [32]; thus, we counted the number of primary care visits in FY05. Based on the empirical distribution, we classified patients as having zero to one, two to four, and five or more primary care visits to ease interpretation of findings.

## 2.6 Statistical Analysis

Descriptive statistics were used to summarize variables for the overall HRME cohort and the Rx-DIS subset. With the exception of race, missing data was extremely rare. Because our prior work indicated that those without race/ethnicity identified in the VA data tend to be healthier, seen less frequently in the VA, and white, we included those individuals as unclassified, to avoid skewing our findings toward the population with high disease burden. We then calculated the unadjusted odds ratios using logistic regression analyses followed by multivariable statistical analyses using Generalized Estimating Equations (GEE) models with a logit link to account for nesting of patients within facilities. These models examined the association of new HRME exposure with all-cause mortality, emergency care, and hospital admission [33, 34]. A similar approach was used for separate analyses for Rx-DIS and these outcomes. Theoretically meaningful interactions (e.g., geriatric care and HRME/Rx-DIS exposure) were included; only significant interactions were included in the final model. Effects were reported as adjusted odds ratios (AOR) with 95 % confidence intervals (95 % CI).

We also conducted secondary analyses using propensity score methods to assess the extent to which the relationship between HRME/Rx-DIS exposure predicted adverse outcomes, above and beyond characteristics associated with individual propensity to have HRME/Rx-DIS exposure. Propensity for HRME and Rx-DIS exposure (separate scores) was calculated using logistic regression analysis (covariates described above predicting each exposure), and included as a predictor in logistic regression models to predict each outcome with the propensity score and the

exposure variable [35]. Comparison of the AOR allows an assessment of the contribution of individual and exposure variables for each outcome. Statistical analyses were performed using SAS<sup>®</sup> software (version 9.2; Cary, NC, USA) and IBM SPSS<sup>®</sup> statistics for Windows (version 20; Armonk, NY, USA).

## 3 Results

Overall, 1,807,404 older veterans met inclusion criteria. Our study sample (see Table 1) was predominantly male, white, and the majority had two or more comorbidities (70 and 90 % for the total sample and the Rx-DIS subsample, respectively) and reported income under the poverty limit (60 and 70 %). The mean day supply for HEDIS<sup>®</sup> medications (HRME and Rx-DIS) was 89.2 days [standard deviation (SD) = 106.0 days; range 1–365]. During the 1-year study period, 81,003 (4.6 %) died, 87,118 (4.9 %) had one or more hospital admissions, and 244,106 (13.5 %) received emergency care.

### 3.1 HRME Exposure

In FY06, 94,684 (5.2 %) had new HRME exposure; 94 % ( $n = 89,052$ ) of those had exposure to one HRME drug. The most common HRME groups prescribed were antihistamines (1.7 %), skeletal muscle relaxants (1.5 %), opioids (0.8 %), and gastrointestinal antispasmodics (0.4 %). Unadjusted odds ratios for HRME exposure are provided in Fig. 1 for mortality, Fig. 2 for hospital admission, and Fig. 3 for emergency care.

Figure 1 shows results from the GEE models for all-cause 1-year mortality and unadjusted odds ratios for HRME exposure; the results for the full model are available as Electronic Supplementary Material 2: full models HRME. New exposure to one or more than one HRMEs was significantly associated with 1-year mortality, adjusting for covariates (1: AOR = 1.62, 95 % CI 1.56–1.68; >1: AOR = 1.80, 95 % CI 1.45–2.23). Figures 2 and 3 illustrate that after controlling for demographics, health status, and access to healthcare, new exposure to one or more than one HRMEs was also significantly associated with all-cause hospital admission (1: AOR = 2.31, 95 % CI 2.22–2.40; >1: AOR = 3.44, 95 % CI 3.06–3.87) and emergency care (1: AOR = 2.59, 95 % CI 2.49–2.70; >1: AOR = 4.18, 95 % CI 3.71–4.71), respectively. The significantly larger AORs for higher levels of HRME for emergency care and hospital admission support a dose-dependent relationship for these outcomes. Full model results are available as Electronic Supplementary Material 2: full models HRME. The geriatric care by HRME exposure variable indicated a consistent relationship for

**Table 1** Descriptive statistics for those with and without HRME/Rx-DIS exposure

Variable	HRME exposure FY06 (n = 94,648), %	No HRME exposure FY06 (n = 1,712,756), %	Rx-DIS exposure FY06 (n = 9,101), %	No Rx-DIS exposure FY06 (n = 247,487), %
Demographics				
Age				
65–74 years	51.4	45.0	30.6	29.2
75–84 years	41.4	46.1	54.4	55.2
≥85 years	7.3	8.9	15.0	15.6
Women	2.7	1.6	2.1	1.8
Race/ethnicity				
White	71.2	65.7	69.1	68.3
African American	9.4	6.1	12.2	10.5
Hispanic	5.3	3.0	7.1	4.1
Other	1.4	1.3	1.5	1.4
Unknown	12.6	24.0	10.1	15.8
Under poverty limit	75.6	57.7	79.5	70.3
Clinical characteristics FY05				
Count of medications				
0–5	26.5	49.9	17.8	26.7
6–8	24.2	25.9	23.5	26.1
9–11	20.4	13.8	21.8	20.8
≥12	28.9	10.5	36.9	26.4
Physical comorbidities FY05				
0–1	17.6	29.0	7.4	9.5
2–3	42.7	42.2	28.2	33.4
4–5	26.9	18.2	31.1	30.9
≥6	13.3	5.1	33.3	26.2
Psychiatric comorbidities FY05				
0	78.4	87.8	62.3	74.8
1	15.9	9.9	25.6	18.7
≥2	5.7	2.4	12.2	6.6
One or more emergency visits FY05	31.1	13.0	39.3	26.4
One or more hospital admissions FY05	12.9	5.1	20.5	14.4
One or more geriatric care visits FY05	2.5	2.4	7.9	6.3
Primary care visits FY05				
0–1	14.1	27.4	11.7	16.9
2–4	51.7	55.9	45.2	51.2
≥5	34.2	16.7	43.0	31.9
Outcomes up to 1 year after index date				
Hospital admission	16.0	4.2	4.6	3.1
Emergency care	38.6	12.1	6.2	3.5
Death	9.1	4.2	15.6	10.0

All comparisons between exposed and unexposed statistically significant,  $p < 0.001$

HRME high-risk medication in the elderly, Rx-DIS drug–disease interaction, FY fiscal year

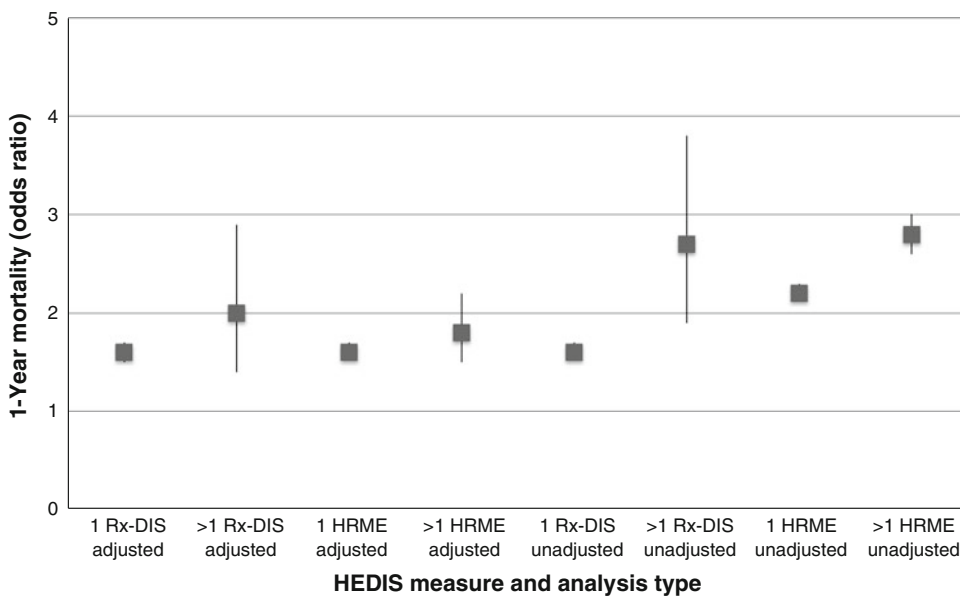
individuals with HRME exposure regardless of geriatric care, and was thus removed from the final model.

Results of propensity score-adjusted analyses indicated that the impact of HRME exposure was similar to regression models, and, while statistically significant, was small

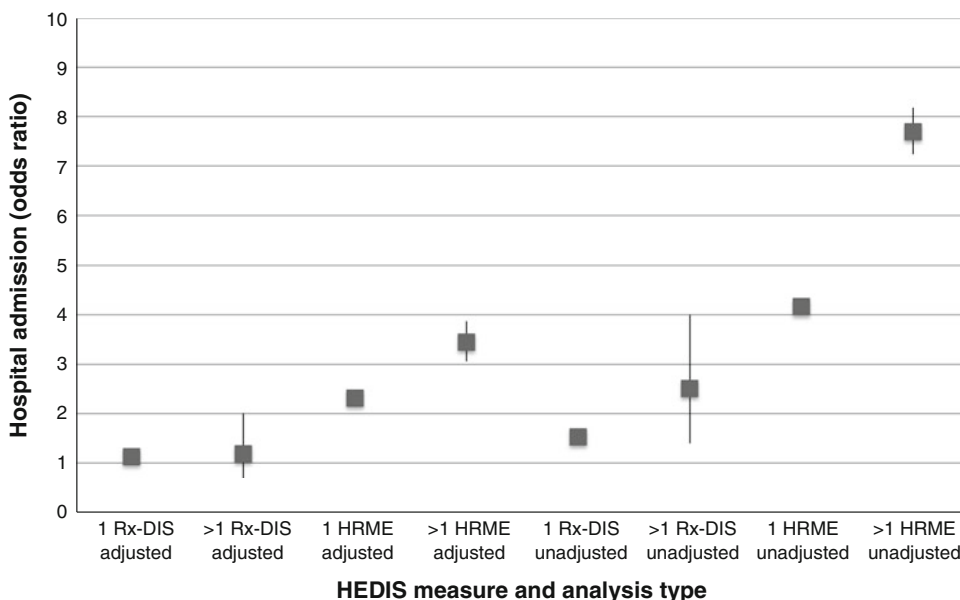
compared to patient characteristics associated with HRME exposure [e.g., AOR for HRME exposure and mortality: (1: AOR = 1.71, 95 % CI 1.67–1.76; >1: AOR = 1.81, 95 % CI 1.66–1.98)]; AOR for HRME propensity (AOR = 88.24, 95 % CI 78.84–98.77).



**Fig. 1** HEDIS® measures: adjusted and unadjusted odds ratios for 1-year mortality. Cohort for high-risk medications in the elderly (HRME) analysis  $n = 1,807,404$ . Cohort for drug–disease interaction analysis (Rx-DIS)  $n = 256,388$ . Vertical bars represent 95 % confidence intervals. HEDIS Healthcare Effectiveness Data and Information Set, HRME high-risk medication in elderly, Rx-DIS drug–disease interaction



**Fig. 2** HEDIS® measures: adjusted and unadjusted odds ratios for hospital admission. Cohort for high-risk medications in the elderly (HRME) analysis  $n = 1,807,404$ . Cohort for drug–disease interaction analysis (Rx-DIS)  $n = 256,388$ . Vertical bars represent 95 % confidence intervals. HEDIS healthcare effectiveness data and information set, HRME high risk medication in elderly, Rx-DIS drug–disease interaction



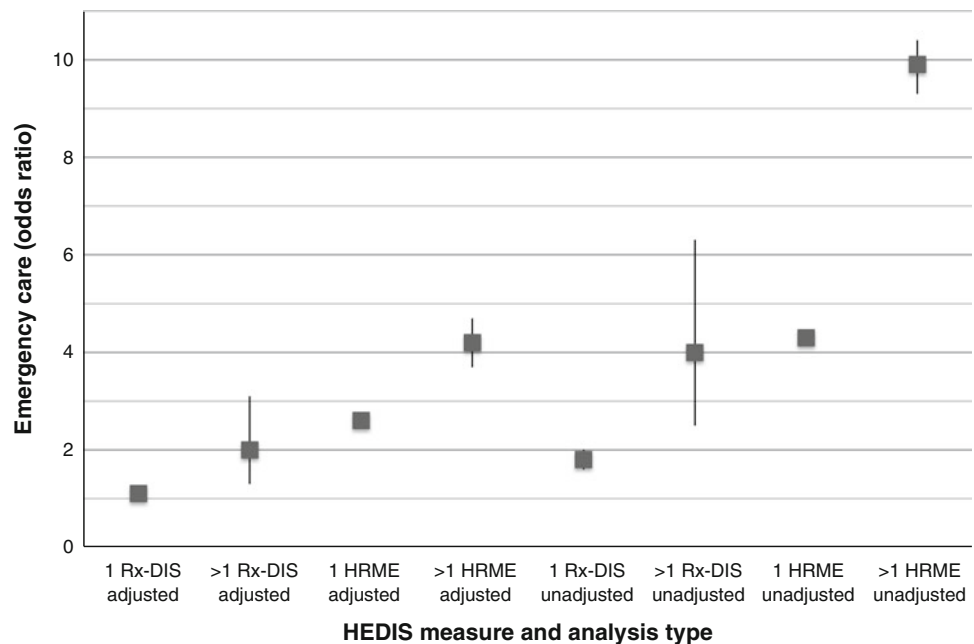
3.2 Rx-DIS Exposure

Table 1 also shows the characteristics of those 256,388 older veterans who had dementia ( $n = 102,332$ ; 39.6 %), falls/fracture ( $n = 42,738$ ; 16.8 %), and/or CRF ( $n = 135,828$ ; 53.0 %) in FY06. Among these individuals, 3.7 % ( $n = 9,101$ ) had new Rx-DIS exposure; 98 % of those had a single type of Rx-DIS exposure ( $n = 8,935$ ). The most common type of Rx-DIS exposure was anticholinergic medications. One year after the index date, 26,202 (10.2 %) had died, 12,895 (5.0 %) had received hospital admission, and 9,219 (3.6 %) had received emergency care. Unadjusted odds ratios for one and more than one Rx-DIS are provided for 1-year mortality

(Fig. 1), hospital admission (Fig. 2), and emergency care (Fig. 3).

After controlling for potential confounders, we found exposure to one or more than one Rx-DIS was associated with 1-year mortality (1: AOR = 1.60, 95 % CI 1.51–1.71; >1: AOR = 2.00; 95 % CI 1.38–2.91; see Fig. 1). Figure 2 shows that, after controlling for confounders, one but not two or more new Rx-DIS exposures were associated with hospital admission (1: AOR = 1.12, 95 % CI 1.03–1.27; >1: AOR = 1.18, 95 % CI 0.71–1.95). Adjusting for the same set of covariates, GEE models for all-cause emergency care found that Rx-DIS exposures were associated with emergency care (1: AOR = 1.06, 95 % CI 0.97–1.15; >1: AOR = 2.0, 95 % CI 1.35–3.10;

**Fig. 3** HEDIS<sup>®</sup> measures: adjusted and unadjusted odds ratios for emergency care. Cohort for high-risk medications in the elderly (HRME) analysis  $n = 1,807,404$ . Cohort for drug–disease interaction analysis (Rx-DIS)  $n = 256,388$ . Vertical bars represent 95 % confidence intervals, HEDIS healthcare effectiveness data and information set, HRME high risk medication in elderly, Rx-DIS drug-disease interaction



see Fig. 3). Full model results are available as Electronic Supplementary Material 3: full models Rx-DIS. The geriatric care by Rx-DIS exposure variable indicated a consistent relationship for individuals with Rx-DIS exposure regardless of geriatric care, and was thus removed from the final model.

Results of propensity score-adjusted analyses indicated that results were similar, despite the significant effect of the propensity for Rx-DIS exposure [e.g., AOR for Rx-DIS exposure and mortality: (1: AOR = 1.38, 95 % CI 1.19–1.60; >1: AOR = 2.89, 95 % CI 1.79–4.66); AOR for Rx-DIS propensity (AOR = 3.49, 95 % CI 2.40–5.08)].

#### 4 Discussion

Our study demonstrated that new use of drugs included in the NCQA's HRME measure was associated with a greater than twofold increased risk for emergency care and/or hospital admission. Moreover, there was a suggestion that there was a dose–response relationship with higher numbers of HRMEs being related to greater risk of acute care. Exposure to HRME and Rx-DIS was also consistently associated with increased mortality risk. Thus, our findings provide support for the validity of these HEDIS<sup>®</sup> quality measures in an older Veteran population.

Our study findings for the association with hospital admission are consistent with findings from Albert et al. [9], who found that prevalent HRME use over a 3-year period came with a nearly twofold increased risk of hospital admission in a retiree cohort receiving employer-based drug benefits. The difference in the magnitude of our

point estimate versus that seen by Albert et al. [9] may be explained by their inclusion of prevalent exposure because those who took HRME drugs in the past and discontinued them due to adverse effects would bias the association with health services use toward the null. Our new-user design (one third the number of individuals with exposure compared to prevalent use) minimizes this potential misclassification bias and strengthens our results.

While adverse drug events (ADEs) are one possible mechanism for these findings, two recently published studies that examined individual cases of drug-related hospital admissions in older adults found few admissions that could be attributed to drugs (1–4 %) that are part of the HRME list [36, 37]. It is possible, however, that taking a medication from the HRME list serves as a proxy for other types of prescribing problems as measured by implicit measures such as the Medication Appropriateness Index (MAI) [38]. This is an important consideration since potentially inappropriate prescribing defined by the MAI has been shown to be related to a host of poor clinical outcomes including poor blood pressure control and quality of life, and hospital admission [28, 39–42]. Future research should examine the possibility that inappropriate prescribing based on HEDIS<sup>®</sup> criteria may also be associated with other measures of quality related to chronic conditions.

It was also interesting to note that exposure to either new HRME drugs or Rx-DIS increased the risk of 1-year mortality by approximately 60 %. This finding is consistent with some but not all previous studies using the overall Beers drugs-to-avoid list [24, 26, 43]. While some observed mortality effects may be due to confounding by

disease severity, we believe this is unlikely given that we controlled for medical and psychiatric comorbidities, polypharmacy and prior emergency care, or hospital admission, which are among the most important risk factors for mortality in older adults [44]. Moreover, we also used a propensity score approach that led to the same results. Thus, it is possible that the HEDIS<sup>®</sup> HRME is more sensitive to issues related to mortality than the broader list of drugs to avoid.

While our findings for emergency care were consistent with prior work for both single and multiple HRME exposures (all AOR >2), it was somewhat surprising that the risk of hospital admission was only shown to be increased by 12 % in those with a single Rx-DIS exposure, and not at all (roughly 18 % but not statistically significant) in those with two or more exposures. This modest risk is inconsistent with three studies that showed, even when controlling for drugs to avoid in the elderly, measures for drug–disease interactions were independently associated with increased risk of adverse drug events [25, 41, 45, 46], and functional status problems [11, 25]. What might account for this discrepancy? Possibly Rx-DIS could be resolved in the emergency department and not result in hospital admission. Alternatively, those with the most severe complications may have died, accounting for the strong relationship between Rx-DIS and mortality. In addition, the HEDIS<sup>®</sup> Rx-DIS measure examined drugs that interact with only 3 conditions as opposed to the 12 conditions in the recently updated Beers criteria recently developed by an expert panel convened by the American Geriatric Society [47]. Moreover, that updated list of drugs to avoid is significantly expanded beyond the earlier Beers list used to develop the current HEDIS<sup>®</sup> measure.

It is also possible that we underestimated conditions included in the Rx-DIS measure, particularly falls. The rates we found for falls/fractures are likely to be an underestimate as well given that injurious falls that would lead to emergency care/hospitalization represent only a small number (5–15 %) of falls that occur in community-dwelling adults yearly [48].

Our study also may have underestimated the true rate of NSAID use because VA PBM data does not account for NSAIDs purchased over the counter. On the other hand, for impoverished and high-disability VA patients, copayments are waived making over-the-counter NSAIDs more expensive.

While our study has a number of strengths including the use of a large national sample, a longitudinal new user design, and careful consideration of medication use and health outcomes in an integrated healthcare system, several additional limitations exist. First, our data do not include variables that are not available in the national VA datasets. We did not have access to care received from Medicare,

which leads to incomplete ascertainment of emergency care or hospital admission, unlike VA mortality data, which has been found to be very accurate [21]. Individuals with HRME or Rx-DIS tend to have more chronic disease [14, 15] and therefore may be more likely to receive hospital admission or emergency care in a Medicare setting than individuals without such exposure. Because that would bias toward the null hypothesis, we believe our results are conservative. Moreover, for certain conditions such as falls and fractures, we could not control for functional status or other unmeasured variables as potential confounders as this data is not consistently collected in the electronic medical record. We did, however, control for a number of important physical and psychiatric comorbidities that are important risk factors for serious falls/fractures and prior emergency care. We found that adjusted odds ratios were generally lower than unadjusted odds ratios, indicating that controlling for those variables associated with HRME and Rx-DIS exposure attenuated the relationship between exposure and outcome. Moreover, analyses controlling for propensity to have HRME/Rx-DIS exposure were similar to those using regression analysis [48], but it was interesting that the impact of propensity to have HRME exposure had much stronger adjusted odds ratios than propensity to have Rx-DIS exposure, suggesting that the inclusion criteria for Rx-DIS led to a more homogeneous sample.

Second, inclusion of individuals who received one or more inpatient or outpatient visits in the VA during FY05 and FY06 may have the effect of including individuals who are relatively healthy (and thus less similar to those with HRME or Rx-DIS exposure), or who receive non-VA care. However, analysis restricted to those with two or more visits each year revealed the same results as those from the overall cohort analyses.

Moreover, the analyses did not account for time on medication. Many HRME/Rx-DIS are used “as needed,” making day supply an uncertain marker of exposure, with the likelihood of gaps in use, regardless of the number of days received. Similarly, adverse drug events may occur on day 1 or day 360. This may, however, be an option for future research. Finally, given that the sample was mostly older men and VA patients, it is not clear how well this information generalizes to older women and non-VA men [49].

## 5 Conclusions

Our data indicate that HRME/Rx-DIS exposure is associated with clinically important adverse outcomes in the elderly. While a newer Beers list is being evaluated for additions to the current HEDIS<sup>®</sup> measures, it is time to



begin incorporating input from both patients who receive these medications and providers who prescribe to develop approaches to reduce exposure to these agents.

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