

Comorbidity-Polypharmacy Score Predicts Readmissions and in-Hospital Mortality: A Six-Hospital Health Network Experience

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ABSTRACT

Introduction: The comorbidity-polypharmacy score (CPS) is a simple sum of pre-admission medications and comorbid conditions. Previous studies show that CPS correlates with morbidity, mortality, readmissions, adverse events, and acuity level determinations in various patient populations. The aim of this study is to determine the behavior of CPS across a large sample of medical-surgical patients, inclusive of all age ranges. We hypothesized that CPS will be associated with readmissions, mortality, and hospital length of stay. **Methods:** We performed an IRB-exempt study of patients admitted to a six-hospital network between Jul 2014-Dec 2014. Variables analyzed included demographics (age, gender); polypharmacy data (number of pre-admission medications); comorbid conditions (all "pre-existing" conditions on admission); hospital length of stay (HLOS); need for ICU; discharge to home versus nursing facility; and mortality. Descriptive and univariate analyses were performed using 3-point CPS increments, with mortality, readmissions, and HLOS as primary end-points. Subsequent multivariate analyses were performed for variables reaching significance level of $p < 0.10$ in univariate analyses. SPSS 18 Statistics (IBM, Armonk, NY) was used, with statistical significance set at $\alpha < 0.01$ due to multiple comparisons. **Results:** A total of 20,644 medical-surgical patients were studied. In univariate analyses, CPS was significantly associated with patient age, gender, length of stay, readmission, discharge destination, ICU requirement, and mortality (all, $p < 0.001$). On multivariate analyses, factors independently associated with mortality included age (OR 1.03 per year); CPS (OR 1.05 per unit); and need for ICU (OR 21.9). Factors independently associated with readmission included age (OR 1.01 per year) and CPS (OR

1.04 per unit). ICU stay was not a predictor of readmission after correcting for index admission mortality. **Conclusions:** We found that CPS is independently associated with readmissions and mortality across all age groups. Further research in this area is warranted, with focus on CPS as a potential frailty indicator, as well as contributions of specific comorbidities and/or medication classes to the overall risk of mortality or readmission. CPS appears to provide a reasonable platform for patient risk stratification based on easily obtainable clinical data inputs.

Key words: Comorbid conditions, polypharmacy, comorbidity-polypharmacy score, clinical outcomes, hospital readmissions, patient outcomes research

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INTRODUCTION

The concepts of comorbidity and polypharmacy are emerging as important factors in the evaluation, risk stratification, and treatment of hospitalized patients.^[1,2] With a vast increase in the proportion of elderly patients requiring care, we have seen the number of comorbid conditions and associated medications escalate significantly. Patients with high comorbidity indices tend to exhibit increased propensity toward poor outcomes, greater frequency of healthcare encounters, adverse events, and increased medical resource utilization.^[3-10] However, existing clinical instruments designed to evaluate the synergistic impact of comorbidities and polypharmacy are limited by their complexity and translatability across various healthcare settings.^[11-14] The comorbidity-polypharmacy score (CPS) is a relatively new clinical tool in the area of quantitative comorbidity assessment.^[6] Easy to calculate, the CPS is derived by adding all pre-existing medical conditions and medications. By combining the number of comorbidities and the "intensity" or sheer number of the accompanying medical therapy (quantified via a simple "pill count"), the CPS has been postulated to function as a proxy for the patient's "physiological age".^[1] Previously published studies demonstrated a correlation between the CPS and hospital readmissions, disposition to extended care facilities, hospitalization duration metrics, adverse events/complications and mortality.^[2,6-10,15]

The aim of the current study was to describe the behavior of CPS relative

to a number of key clinical outcomes-including mortality, lengths of stay, readmissions, and direct costs of care-using a large, administrative dataset that incorporates all patient age groups. We hypothesized that significant correlations exist between CPS and mortality, length of stay, readmissions, and a number of secondary parameters (discharge disposition, direct admission costs) within a large administrative sample of medical-surgical patients.

METHODS

This is an IRB-exempt retrospective study of medical-surgical patients admitted to a multi-hospital health network between July 1, 2014 and December 31, 2014. Study data were abstracted from an existing inpatient admission dataset generated by linking the network's

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administrative and financial information sources. All patients admitted to either an inpatient or observation status in any of the six hospitals within our health network during the six-month study period were included.

Descriptive and univariate analyses were performed using quantized 3-point CPS increments as primary frame of reference, with 30-day mortality, 30-day readmissions, and hospital length of stay (HLOS) as primary end-points. Our secondary outcomes included hospital costs, need for ICU level of care, and post-discharge destination. Collected data included patient demographics, pre-hospital medications and comorbidities (both based on electronic medical record), in-hospital all-cause mortality, length of stay, ICU requirement, 30-day readmission, time between discharge and readmission, discharge disposition, and cost (not charge) of hospitalization.

Considering that prior studies using CPS were limited by small sample size, traditional stratification had been performed using 8-point increments.^[6] With a larger sample size, the current study has allowed us to stratify CPS ranges with a much higher level of granularity (e.g., increments of 3 points). This, in turn, provided a better overall picture of CPS characteristics (e.g., the presence of any inflection points).

Characteristics of the patient sample were presented using descriptive statistics, summary tables and graphs. Normality was assessed for all continuous variables using the Kolmogorov-Smirnov test, with normally distributed data analyzed using analysis-of-variance (ANOVA) and non-normally distributed variables analyzed using the Kruskal-Wallis test. Categorical variables were analyzed using chi-square tests. Variables reaching pre-determined statistical significance ($p < 0.10$) on univariate analyses were subsequently included in a multivariate direct logistic regression model, with statistical significance set at $\alpha = 0.01$. Finally, sensitivity analyses were performed using receiver operating characteristic (ROC) curves in order to determine which variables correlated most strongly with mortality and readmissions. All analyses were performed using SPSS version 18 (IBM Corp., Armonk, New York, USA), with key results reported as frequencies (percentages), mean \pm standard deviation, median (interquartile range, IQR), and adjusted odds ratios (AOR) with 95% confidence intervals (CI). Additional data interpretation and analyses were performed at The Ohio State University, Johns Hopkins University, and The University of Toledo.

RESULTS

We studied 20,644 medical-surgical patients of all ages, with a mean age of 55.4 ± 26.6 years (median 60.0, IQR 36-77, range 0-115).

Females constituted 56.2% (11,612/20,644) of the overall sample, with males accounting for 43.8% (9,032/20,644). Figure 1 shows the frequency distribution of CPS scores across the study sample. Figure 2 demonstrates the percentage of male patients for each 3-point CPS increment.

Mean hospitalization cost was $\$5,099.68 \pm 7,497.65$ (median $\$2,709.61$, IQR $\$1,660.69$ - $\$5,705.08$). Mean hospital length of stay was 4.47 ± 5.72 days (median 3, IQR 2-5, range 0-157). Reported readmission rate was 8.55% (1,765/20,644), with mean time to readmission of 12.4 ± 8.4 days (median 11.0, IQR 5-19, range 1-30). Of the patients studied, 6.14% (1,268) required ICU level of care during their hospitalization. Most patients in the current sample (76.8% or 15,846/20,644) were discharged to home, with the remainder (23.2% or 4,783/20,644) either discharged to a skilled nursing or a long term acute care facility.

The study population had a median CPS of nearly 10. A detailed relationship between comorbid conditions and polypharmacy across the full spectrum of CPS can be seen in Figure 3 (bottom left). The initial increase in CPS is primarily attributable to comorbid conditions (top line), followed by a crescendo pattern in the number of recorded medications (bottom line).

Univariate analyses demonstrated that CPS was significantly associated with patient age and gender, as well as outcome and resource consumption measures including length of stay, readmission, discharge destination, need for ICU transfer or admission, and mortality (all, $p < 0.001$, Figure 3). In addition, direct admission costs escalated with increasing CPS (Tables 1 and 2).

Based on multivariate analyses, CPS was independently associated with mortality (AOR 1.05 per unit) and readmission (AOR 1.04 per unit). Additionally, ICU admission (AOR 21.9) and age (AOR 1.03 per year) were independently associated with mortality. Finally, patient age (AOR 1.01) was independently associated with readmission. The summary of multivariate analysis results is provided in Table 3. Receiver operating characteristic (ROC) curve analyses [Figure 4] show that CPS provides a reasonable predictive power regarding mortality, which appeared to be more robust than age, ICU admission, and all three elements (CPS, age, and ICU admission) combined. In terms of readmission, the utility of CPS was not as robust, but it remained the strongest predictor. Of note, when looking at readmissions, the ROC for combined age and CPS was less predictive than CPS in isolation.

To better demonstrate the utility of CPS as a predictor of mortality [Table 4] and readmission [Table 5] across all age groups (stratified by 10-year increments), we performed bivariate regression analyses for

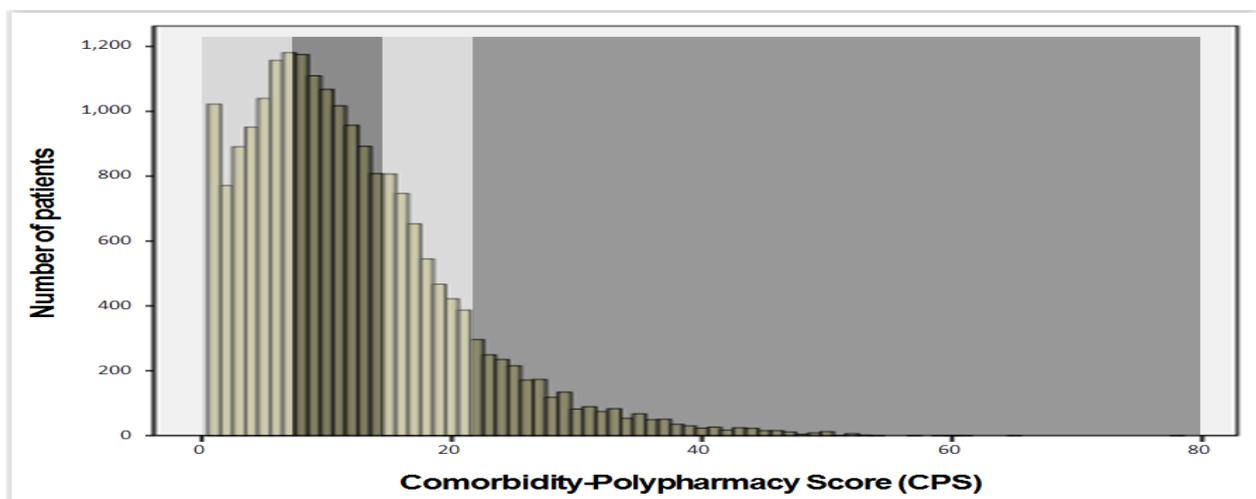


Figure 1: Distribution of CPS scores across the entire 20,644 patient sample. The following CPS thresholds were utilized for this descriptive representation: 0-7, 8-14, 15-21, ≥ 22

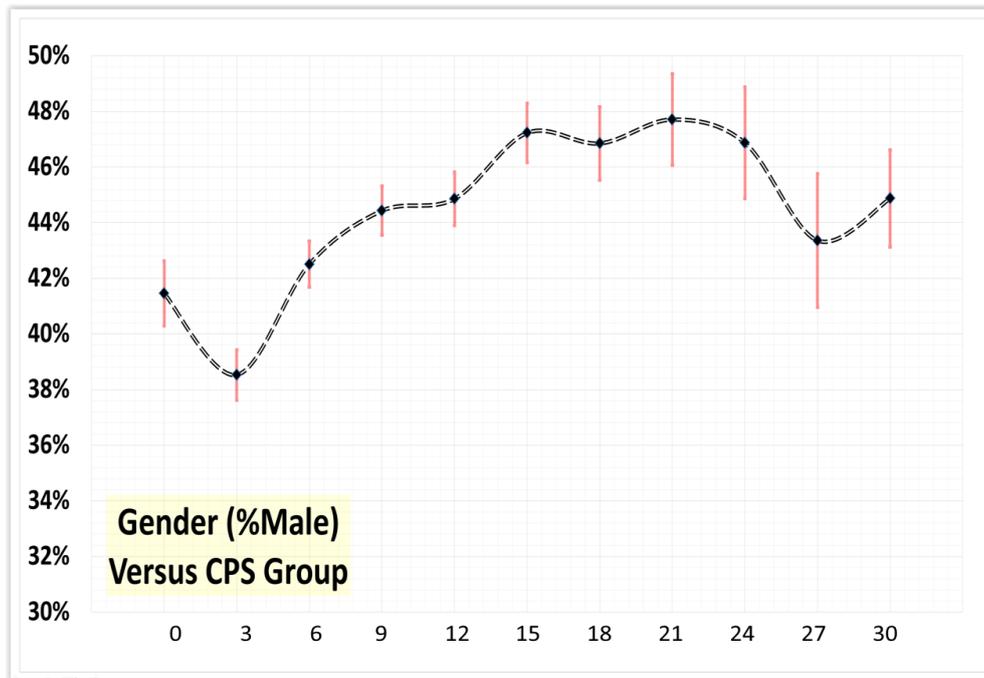


Figure 2: Percentage of male patients (y-axis) versus CPS groups in 3-point increments (X-axis)

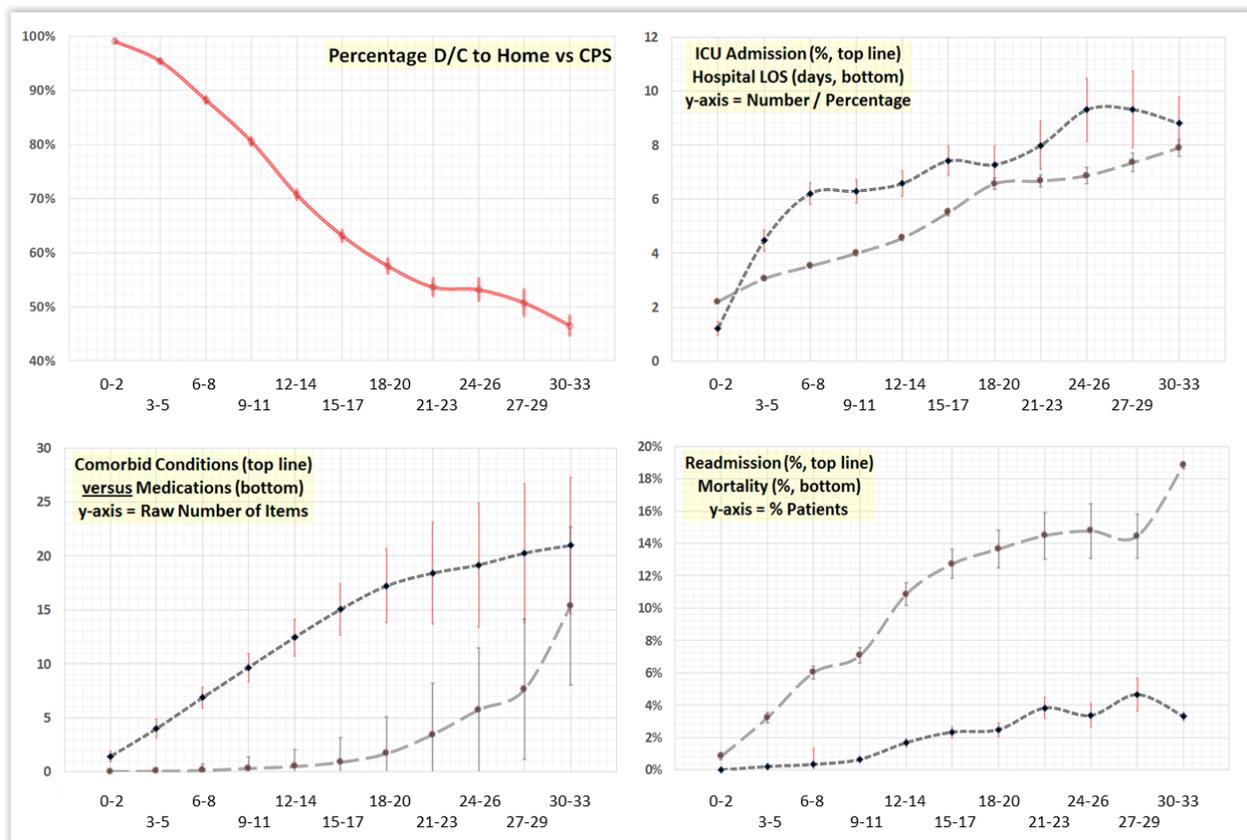


Figure 3: Results of univariate analyses of CPS versus key outcome variables. In each case, the x-axis represents the CPS score in 3-point increments

each respective end-point, using CPS and Age as comparator variables. As seen in these analyses, CPS (a surrogate for “physiological age”) is consistently a better predictor of mortality and readmission for most age-based strata.

DISCUSSION

The closely linked phenomena of polypharmacy and multi-morbidity constitute the hallmark of modern treatment of complex medical patients, regardless of chronological age or specific diagnoses.^[16-18] The overarching aim of this study was to determine the behavior of CPS in a large, broadly inclusive sample of medical-surgical patients, across of all age ranges. In addition, we investigated which factors, among key

Table 1: General characteristics of the patient sample

Characteristic	Value
Age (yrs)	55.4 ± 26.6 [median 60, IQR 36-77, range 0-115]
Gender (n, %)	Female 11,612 (56.2%); Male (9,032 (43.8%))
Hospital cost (\$)	\$5,099.68 ± 7,497.65 [median \$2,709.61, IQR \$1,660.69-\$5,705.08]
Readmission (n, %)	1,765/20,644 (8.55%)
Time to readmission (d)	12.4±8.4 [median 11.0, IQR 5-19, range 1-30]
ICU required (n, %)	1,268/20,644 (6.14%)
Discharge to home (n, %)	15,846/20,644 (76.8%)
CPS (units)	11.94±8.30 [median 10.0, IQR 6-16, range 1-78]

Table 2: Relationship between CPS range and direct admission cost (p<0.001). Both mean and median costs are shown for each CPS range

CPS RCPS range	0-2	3-5	6-8	9-11	12-14	15-17	18-20	21-23	24-26	27-29	30-33
Mean cost	\$1,851	\$3,698	\$4,639	\$5,005	\$5,113	\$5,942	\$7,391	\$6,769	\$7,282	\$8,429	\$7,938
(± Std Error)	± \$69	± \$82	± \$108	± \$113	± \$141	± \$169	± \$306	± \$272	± \$406	± \$683	± \$331
Median cost	\$1,237	\$2,154	\$2,501	\$2,747	\$2,854	\$3,506	\$3,978	\$4,070	\$4,418	\$4,637	\$4,672

Table 3: Results of multivariate analyses. Featured are factors independently associated with mortality and hospital re-admission

Variable	Adjusted Odds Ratio (Mortality)	95% Confidence Interval
Age	1.028 (per year)	1.021-1.036
CPS	1.052 (per unit)	1.039-1.066
ICU admission	21.9 (binary)	17.199-28.481
Variable	Adjusted Odds Ratio (Readmission)	95% Confidence Interval
Age	1.012 (per year)	1.010-1.015
CPS	1.047 (per unit)	1.041-1.053

Table 4: Results of bivariate regression analysis for mortality, performed across 10-year strata of patient age, examining the relative contribution of CPS versus chronological age. While age was not independently associated with mortality in any of the strata, CPS was predictive in all but one stratum (11-20 years). Legend: CPS = Comorbidity-Polypharmacy Score; AOR=Adjusted Odds Ratio; 95% C.I. = 95% Confidence Interval; *=statistically significant result

Age Strata	CPS [AOR, 95% C.I.]	Age [AOR, 95% C.I.]
0-10 years	1.216, 1.048-1.392*	0.312, 0.040-2.442
11-20 years	1.434, 0.930-2.211	0.793, 0.366-1.491
21-30 years	1.150, 1.063-1.244*	1.044, 0.733-1.488
31-40 years	1.142, 1.061-1.230*	0.769, 0.556-1.064
41-50 years	1.083, 1.021-1.148*	1.041, 0.847-1.281
51-60 years	1.085, 1.044-1.127*	1.049, 0.879-1.251
61-70 years	1.064, 1.038-1.090*	1.014, 0.920-1.116
71-80 years	1.053, 1.029-1.079*	0.930, 0.853-1.015
81-90 years	1.041, 1.017-1.065*	0.977, 0.903-1.056
91+ years	1.042, 1.003-1.083*	1.033, 0.912-1.169

Table 5: Results of bivariate regression analysis for readmission, performed across 10-year strata of patient age, examining the relative contribution of CPS versus chronological age. While age was independently associated with readmission in only 3 strata (0-10, 31-40, and 81-90 years), CPS was predictive in all but two strata (0-10 and 91+ years). Legend: CPS = Comorbidity-Polypharmacy Score; AOR=Adjusted Odds Ratio; 95% C.I. = 95% Confidence Interval; *=statistically significant result

Age Strata	CPS [AOR, 95% C.I.]	Age [AOR, 95% C.I.]
0-10 years	1.033, 0.833-1.282	1.286, 1.075-1.539*
11-20 years	1.163, 1.012-1.336*	1.072, 0.788-1.459
21-30 years	1.125, 1.088-1.164*	1.053, 0.971-1.142
31-40 years	1.062, 1.029-1.095*	1.182, 1.084-1.289*
41-50 years	1.074, 1.053-1.097*	1.006, 0.947-1.069
51-60 years	1.052, 1.036-1.068*	1.010, 0.958-1.064
61-70 years	1.033, 1.021-1.045*	1.014, 0.979-1.051
71-80 years	1.033, 1.021-1.045*	1.010, 0.973-1.047
81-90 years	1.042, 1.029-1.056*	1.061, 1.018-1.106*
91+ years	1.011, 0.983-1.039	1.027, 0.950-1.110

outcome variables, were independently associated with 30-day patient mortality and hospital readmissions at our hospital network during the 6-month study period. Our results add significant new knowledge and understanding in all of the above domains, as outlined in the subsequent discussion.

In the acute setting, significant challenges emerge when managing patients with increasing physiological age and loss of the so-called “physiological reserve”, regardless of the chronological age.^[1] Elevated CPS (e.g., ≥ 15) has been associated with poor hospital outcomes in older (≥ 45 years) trauma patients.^[6,7,15] In addition, CPS was shown to predict readmissions in trauma patients,^[2] adverse events in patients with advanced Parkinson’s disease,^[10] as well as inpatient morbidity and discharge to extended care facilities in burn patients ≥ 45 years of age.^[8] Central to this study’s hypothesis, we estimated that there was a significant, step-wise relationship between CPS and key clinical outcome measures across all age groups. Due to low incidence of multi-morbidity and polypharmacy among younger patients, a much larger sample was required to achieve sufficient data granularity to demonstrate the effect of increasing CPS on outcomes in patient’s ≤ 45 years of age.

Although many patients had no medications listed on initial presentation, the vast majority had at least one comorbidity present on admission [Figure 1]. As shown in Figure 3 (bottom left), a structured relationship can be seen between the two components within the CPS—the number of medications and the number of pre-existing comorbidities. At lower values of CPS, the relative contribution of comorbidities is greater than that of medications. This changes as the CPS mid-range is reached (approximately 15-20), at which point there is an increasingly greater relative contribution of medications to the overall score. This trend strongly suggests that the number of pharmaceuticals being co-administered at any given level of comorbidity correlates with the overall “intensity” of the medical management required to control the corresponding comorbid conditions.^[1] Given the close inter-relationship between the above concepts, the combined comorbidity-polypharmacy assessment could provide an indirect measure of the physiological age, and possibly even frailty.^[19] However, further validation is required to prove these as yet hypothetical relationships.

The relationship between CPS and hospital readmissions is important in the era of healthcare cost containment and pay-for-performance

measures.^[20,21] Our analyses show that CPS is independently associated with 30-day readmissions. More specifically, we noted a 9-fold increase in readmissions between the lowest and the highest CPS ranges (Figure 3, bottom right). This, in turn, supports the use of CPS as a stratification tool for determining readmission risk and corroborates previously published data while extending the applicability of CPS to medical-surgical patients of all age groups.^[2]

We found that CPS significantly correlated with both financial and non-financial measures of healthcare resource consumption. This is supported by trends evident in four key parameters—hospital length of stay, hospitalization costs, proportion of patients admitted to ICU, and the proportion of patients discharged to skilled nursing facility (SNF). Correlations between increasing CPS, hospital lengths of stay, proportion of patients admitted to ICU, and the greater need for discharge to SNF have been previously reported for older patient populations.^[1,6-8,15] The unique character of the current study is that it extends these findings to all age groups and enables generalization of the results to all medical-surgical patients. This is also the first study demonstrating that CPS increases correlate with escalating admission-related costs (as opposed to charges, Table 2).

This study has several potential limitations, beginning with the retrospective nature of the data and the reduced number of parameters available for analysis. As with any retrospective analysis, only phenomenological observations can be made, rather than determinations of causation. Our ability to extract clinical information from various administrative and financial data sets was also restricted. For example, lack of physiologic acuity information precludes patient stratification when performing mortality analyses based on ICU admission. Our dataset did not include factors such as race, ethnicity, and/or socio-economic status. Both medical records and claims data may be incomplete and are prone to error, creating a potential source bias. Despite that, our results are generally consistent with our previous research in this area, majority of which was performed at other locations and using different data collection paradigms. It is also important to note that this study might not be broadly generalizable as it was done at a single health network. Although our network encompasses six hospitals, a high degree of standardization between individual locations makes the translatability of our data difficult outside of networks and/or hospitals of similar general characteristics and size. A future multi-center study expanding beyond our network may help alleviate some of

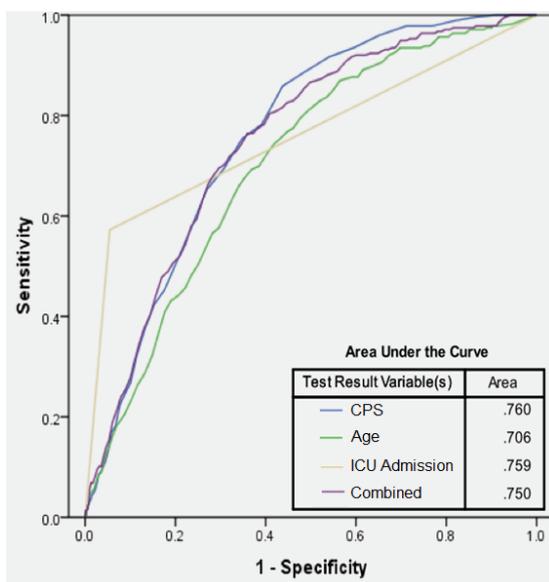


Figure 4A: ROC analysis for mortality ($p < 0.01$)

ROC=Receiver operating characteristic; CPS=Comorbidity-polypharmacy score; ICU=Intensive care unit

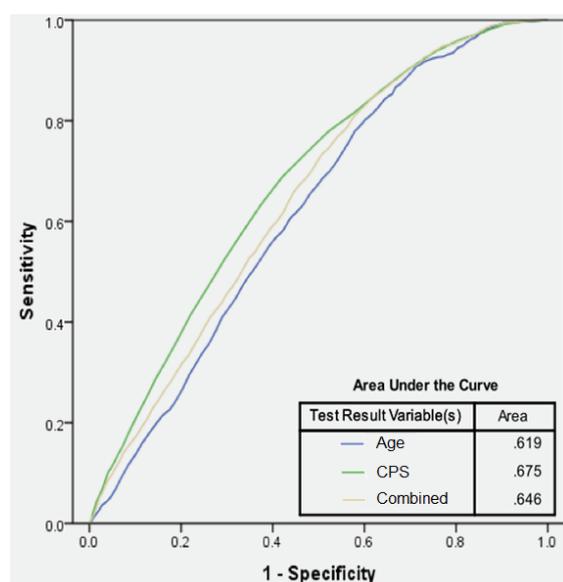


Figure 4B: ROC analysis for readmission ($p < 0.01$)

these concerns. Advantages of the current study include a large sample size as well as high quality of source information included within the limited dataset.

Previous investigations have proposed using CPS to assist in the triage of trauma patients to either medical-surgical or ICU level of care.^[9] We propose further studies in which CPS, along with severity of illness/injury, is evaluated as a tool for triaging patients to an appropriate level of inpatient care. Although yet to be demonstrated empirically, we believe that CPS may be a surrogate measure of frailty, and its correlation with both mortality and readmission can help guide risk stratification and resource allocation considerations. Future studies correlating CPS with frailty should incorporate the concept of the “frailty phenotype”^[22] and the frailty index.^[23] An optimal frailty assessment should be able to measure the patient’s capacity to “absorb and withstand” physiologic stress.^[24] Results of the current study, combined with previous CPS research,^[1,2,6,8,9] suggest that the ability of the CPS to better quantify the “intensity” of medical therapy may represent an important link between the concepts of comorbidity and frailty.^[1,6,25]

CONCLUSIONS

This study demonstrates that CPS is independently associated with risk of readmission and mortality across all age groups. Our results also show that CPS may be considered a predictor of healthcare resource consumption, given its significant correlations with hospital lengths of stay and hospitalization costs. Further research in this area is warranted, focusing on the evaluation of CPS as a potential frailty indicator, the determination of relative contributions of specific comorbidities and/or medication classes to the overall risk of mortality or readmission, and dedicated analyses examining the role of CPS as a predictor of healthcare resource consumption. CPS appears to provide a reasonable platform for patient risk stratification based on readily obtainable clinical and administrative data inputs.

Conflict of interest

The authors declare no conflict(s) of interest related to this scholarly work.

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