

# Epic data Results

C Ryan King, MD PhD

Lavanya Pedamallu, PharmD MS

June 22, 2022

## 0.1 Methods

Data from 2018-08-31 to 2020-12-30 were queried from the Epic electronic health record. Patients were matched to hospital admission, discharge, billing and mortality data. Records were filtered to include those with preoperative clinic visits with AD8 or SBT measured, surgery within 90 days of that clinic visit, and matching billing and discharge records. A subset of surgical procedures were included into the analytical dataset, procedure codes for which are in the appendix. This restriction was intended to reduce confounding due to surgical complexity. That is, we suspect that patients with impaired cognition may be selectively referred to medical vs surgical management of their conditions, and that patients with impaired cognition will be referred for surgeries with less physiologic stress. These procedures were felt to be ones with little variation in overall surgical complexity which would contribute to this selection bias.

Because our principal outcomes (readmission, discharge to home) and inclusion criterion (procedure codes) are generated at the hospitalization level, we treat that as the unit of analysis. Readmission in 30 days and length of stay was only considered for patients with discharge to home.

Association between preoperative cognitive impairment (defined as a Short Blessed Test  $\geq 2$  or a AD8  $\geq 5$ ) and discharge to other than home was assessed using logistic regression models adjusting for surgical procedure type, sex, age using a 5 degree of freedom cubic spline, indicator variables for history of diabetes, chronic kidney disease, chronic obstructive pulmonary disease, CVA(TIA), cancer status, and congestive heart failure.

Each hospitalization can have procedures qualifying in multiple categories; we created indicator variables for each procedure category and assumed additivity for hospitalizations with more than one type of procedure. Logistic regression models with the same adjustment strategy were considered for readmission, near-term death, and exploratory clinical outcomes. A log-link generalized linear model (quasipoisson) with the same set of adjusting variables was used for length of stay.

Heterogeneity of association between abnormal cognition and outcomes was assessed using an expanded model with an interaction term and a score-test. To compare the predictive value of AD8 or SBT, we used two approaches. First, we used a k-fold cross-validation method ( $K=100$ ) fitting logistic regression models predicting each outcome using AD8 or SBT, then assessing the accuracy by area under the receiver operating characteristic curve in the hold-out sample. Each 100 pairs of accuracy metrics are then compared by a paired t-test. Second, we used the Vuong test for non-nested models <https://doi.org/10.2307/1912557> implemented by the “nonnest2” package version 0.5-5.

All analysis was conducted using R 4.1.2. A repository containing the analysis code is available at [https://github.com/cryanking/cognition\\_discharge](https://github.com/cryanking/cognition_discharge)

## 0.2 Results

The filtered dataset included 8315 distinct patients with 8950 hospitalizations. Characteristics of the cohort and overall outcome rates are given in Table 1. AD8 was abnormal ( $\geq 2$ ) in 3.7 percent of included patients; SBT was abnormal ( $\geq 5$ ) in 17.8 percent of included patients.

Table 1: Descriptive statistics stratified by Cognition status. P-values for quantitative variables by Mann-Whitney U, factor variables by Fisher’s exact test. CAD = Coronary artery disease, CHF = Congestive heart failure, Diabetes = Diabetes mellitus, COPD = Chronic obstructive pulmonary disease, CKD = chronic kidney disease, CVA (TIA ) = history of stroke or transient ischemic attack, dc\_home = discharge to home, readmit = readmission within 30 days, los = postoperative hospital length of stay computed from first qualifying procedure, death = death in hospital or within 30 days of surgery

	normal	impaired cognition	p
n	7128	1822	
Sex = 2 (%)	3530 (49.5)	993 (54.5)	<0.001
RACE (%)			NA
Other	48 ( 0.7)	17 ( 0.9)	
White	6392 (89.7)	1436 (78.8)	
Black	637 ( 8.9)	357 (19.6)	
Asian	45 ( 0.6)	11 ( 0.6)	
other_pacific_islands	6 ( 0.1)	1 ( 0.1)	
CAD (%)	1856 (26.0)	639 (35.1)	<0.001
CHF (%)	830 (11.6)	379 (20.8)	<0.001
Diabetes (%)	2115 (29.7)	684 (37.5)	<0.001
COPD (%)	1189 (16.7)	423 (23.2)	<0.001
CKD (%)	1646 (23.1)	603 (33.1)	<0.001
CVA(TIA) (%)	447 ( 6.3)	276 (15.1)	<0.001
cancerStatus (%)			NA
Skin Cancer	4646 (65.2)	1224 (67.2)	
in remission/radiation/chemo	901 (12.6)	193 (10.6)	
Current Cancer	1388 (19.5)	339 (18.6)	
Metastatic Cancer	193 ( 2.7)	66 ( 3.6)	
age (median [IQR])	72 [68, 76]	74 [69, 79]	<0.001
dc_home (%)	1139 (16.0)	662 (36.3)	<0.001
readmit (%)	318 ( 4.5)	90 ( 4.9)	0.379
death (%)	164 ( 2.3)	109 ( 6.0)	<0.001
ICU (%)	1228 (17.2)	426 (23.4)	<0.001
los (median [IQR])	4 [2, 9]	5 [2, 11]	<0.001

The frequency of each type of surgery is displayed in Table 2. The frequencies do not add up to the number of hospitalizations because of multiple procedures per hospitalization.

We found that impaired cognition was significantly associated with discharge to home (odds ratio 2.48, 95% CI 2.19 to 2.81,  $p = <0.001$ ). For readmission in 30 days, impaired cognition was not a significant predictor (odds ratio 0.90, 95% CI 0.65 to 1.25,  $p = 0.168$ ). For near-term death, impaired cognition was a significant predictor (odds ratio 1.93, 95% CI 1.48 to 2.51,  $p = <0.001$ ). Impaired cognition was not a significant predictor of length of stay (duration ratio 1.04, 95% CI 0.91 to 1.06,  $p = 0.611$ ).

We found no convincing evidence of heterogeneity by type of surgery, although power for this question is limited by small sample sizes in some surgery types. A score test comparing models with and without interaction terms yielded a p-value of 0.370. A forest plot is presented in Figure 1.

Table 2: Number of Procedures by Type

Surgery Type	N
lap hiatal hernia	56
cholecystectomy	81
cystectomy	92
nephrectomy	156
gastric	168
pancreatic	174
prostatectomy	294
lumbar fusion	406
total hip	417
total knee	480
hysterectomy	491
total shoulder	491
intestinal	662

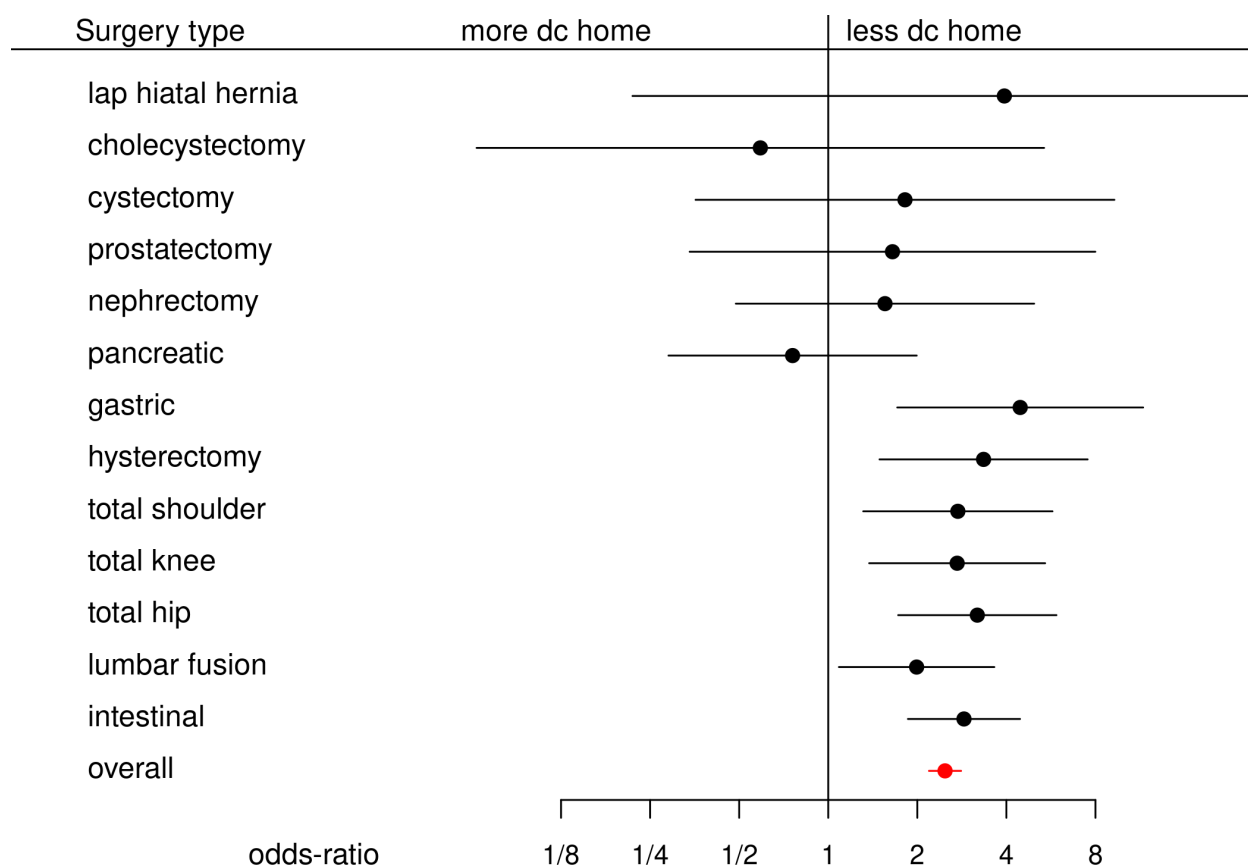


Figure 1: Odd-ratio for discharge to home with impaired cognition by surgery type. Dot = point estimate, lines 95 % confidence intervals

Table 3: GLM results for exploratory outcomes. Odds ratios, 95% confidence intervals, and p-values.

Estimate	exploratory_outcomes	p val	2.5 %	97.5 %
1.12	CVA	2.051	0.61	2.07
1.24	PNA	1.640	0.66	2.33
0.97	AF	2.036	0.82	1.14
1.51	post_aki_status	1.000	1.21	1.89
1.50	post_trop_high	1.006	1.12	1.99
1.56	resp_failure	1.000	1.28	1.91

### 0.3 Exploratory clinical outcomes

Results from logistic regression models predicting pneumonia (PNA), incident Atrial Fibrillation (AF), AKI worse than grade 1, incident stroke or TIA (CVA), elevated postop troponin, and intubation longer than 12 hours are given in Table 3.

We found that the Vuong test of model superiority for predicting discharge location with AD8 vs SBT was not significant with the minimum p value .

```
##
## Model 1
## Class: glm
## Call: glm(formula = myform, family = binomial(), data = .)
##
## Model 2
## Class: glm
## Call: glm(formula = myform, family = binomial(), data = .)
##
## Variance test
## H0: Model 1 and Model 2 are indistinguishable
## H1: Model 1 and Model 2 are distinguishable
## w2 = 0.009, p = 2.82e-09
##
## Non-nested likelihood ratio test
## H0: Model fits are equal for the focal population
## H1A: Model 1 fits better than Model 2
## z = 1.222, p = 0.111
## H1B: Model 2 fits better than Model 1
## z = 1.222, p = 0.8892
```

Using the hold-out-sample area under the receiver operating curve concluded that there was significantly different using SBT and AD8. The mean AUROC estimates were 0.736 and 0.716 respectively with a p value of .

```
##
## Welch Two Sample t-test
##
## data: na.omit(r1) and na.omit(r2)
## t = 2.0239, df = 187.56, p-value = 0.0444
## alternative hypothesis: true difference in means is not equal to 0
## 95 percent confidence interval:
## 0.0005097957 0.0397752099
## sample estimates:
## mean of x mean of y
## 0.7364780 0.7163355
```