

1 Temporal trends in critical care outcomes in United States minority serving hospitals

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44 At a glance: Minorities face a wide range of health disparities that extend into the Intensive Care unit

45 (ICU). Whether hospitals that predominantly care for minority patients have evidenced the same

46 improvements in critical care outcomes as non-minority hospitals has not been previously investigated.

47 Accordingly, we examined the temporal trends of ICU mortality and lengths of stay in minority and non-

48 minority serving hospitals from 2006 to 2016 in over 200 hospitals from across the United States. We

49 find minority serving hospitals have had significantly less temporal improvement in mortality and length

50 of stay than non-minority hospitals. This observation is most apparent for African American patients,

51 who have had no meaningful decrease in mortality or lengths of stay when hospitalized in a minority

52 serving hospital. Our data highlights the continued disparities facing minorities and minority serving

53 hospitals in the United States.

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57 Drafting the manuscript for important intellectual content: JD,KM,OB

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60 **Abstract**

61 **Context:** Whether critical care improvements over the last ten years extend to all hospitals has not been  
62 described.

63 **Objective:** To examine the temporal trends of critical care outcomes in minority and non-minority  
64 serving hospitals.

65 **Design:** Inception cohort of critically ill patients.

66 **Measurements:** Using the Philips Health Care electronic Intensive Care Unit Research Institute Database,  
67 we identified minority-serving hospitals as those with an African American or Hispanic Intensive Care  
68 Unit (ICU) census more than twice its regional mean.

69 **Participants:** Almost 1.1 million critically ill patients amongst 208 ICUs across the United States admitted  
70 between 2006 and 2016.

71 **Main outcome:** Adjusted hospital mortality (primary) and length of hospitalization (secondary).

72 **Results:** Large pluralities of African Americans (25%, n=27,242) and Hispanics (48%, n=26,743) were  
73 cared for in minority serving hospitals, compared to only 5.2% (n=42,941) of whites. Over the last ten  
74 years, while the risk of critical illness mortality steadily decreased by 2% per year (95%CI 0.97-0.98) in  
75 non-minority hospitals, outcomes within minority-serving hospitals did not improve comparably. This  
76 disparity in temporal trends was particularly noticeable amongst African Americans, where each  
77 additional calendar year was associated with a 3%(95%CI 0.96-0.97) lower adjusted critical illness  
78 mortality within a non-minority hospital, but no change within minority-serving hospitals (HR 0.99,  
79 95%CI 0.97-1.01). Similarly while ICU and hospital lengths of stay decreased by 0.08(95%CI -0.08,-0.07)  
80 and 0.16(95%CI-0.16,-0.15)days per additional calendar year, respectively, in non-minority serving  
81 hospitals, there was little temporal change for African Americans in minority serving hospitals.

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83

84 **Conclusion:** Critically ill African Americans are disproportionately cared for in minority-serving hospitals,

85 which have shown significantly less improvement than non-minority hospitals over the last ten years.

## 87 **Introduction**

88 Health disparities continue to plague the United States medical system<sup>1</sup>. Despite higher rates of  
89 comorbidities<sup>2</sup>, minorities have less access to preventative medicine<sup>3-6</sup>, seeking care in lower-  
90 performance hospitals with higher complication<sup>7,8</sup>, readmission<sup>9</sup>, and mortality rates<sup>10-13</sup>. While the  
91 higher acuity and resource utilization of critical illness might seem immune to such disparities, racial  
92 differences in the intensive care unit(ICU) have similarly been described<sup>14-18</sup>.

93 Accordingly, we examined whether improvements in critical care outcomes over the last decade<sup>19-22</sup>  
94 extend to minority serving hospitals. Using a large repository of almost 1.1 million ICU admissions from  
95 hospitals across the United States<sup>23-25</sup>, we describe the temporal trends of critical illness outcomes  
96 according to hospital minority composition and whether these trends differed by ethnicity.

## 97 **Methods**

### 98 *Data Source*

99 Phillips Healthcare, a major vendor of ICU equipment and services, provides a telehealth ICU platform to  
100 over 300 hospitals across the United States. Data from participating hospitals is anonymously curated in  
101 the electronic Intensive Care Unit Research Institute Database (eICU-RI), a collaborative partnership  
102 between Philips Healthcare and the Laboratory of Computational Physiology at Massachusetts Institute  
103 of Technology<sup>23-26</sup>. It contains high-resolution patient data including demographics, vital signs,  
104 laboratory tests, illness severity scores, fluid intake and outputs, and diagnostic coding from patients  
105 admitted between 2003 and 2016. Participating hospitals trained clinicians to use the Philips platform,  
106 using primary data entry and drop-down boxes to adjudicate patient information and diagnoses, with  
107 direct synchronization with laboratory and clinical data.

108 The most up-to-date formulation of the eICU-RI contains 1.7 million unique first critical illness  
109 hospitalizations from 301 hospitals. Missing data included hospital regional location (n= 430,137) and

110 Acute Physiology and Chronic Health Evaluation (APACHE) IV severity of illness scoring (n=104,041). We  
111 excluded those admitted prior to 2006 (n=30,207) due to low participation and unreliability of data  
112 entry, leaving 1,088,109 patients. Of these, 48,514 lacked documentation of length of critical stay,  
113 leaving a cohort of 1,039,595 for primary analysis.

#### 114 *Exposure*

115 We used 2010 United States Census data to determine the African American and Hispanic regional  
116 means and defined minority-serving hospitals as those with a greater than two-fold African American or  
117 Hispanic ICU census than the corresponding regional mean. The cutpoints for African American and  
118 Hispanics were 11.30% and 7.0% in the Midwest, 13% and 12.6% in the Northeast, 20.1% and 15.9% in  
119 the South and 5.7% and 28.6% in the West, respectively.<sup>28</sup> As an alternate definition, we defined  
120 minority-serving hospitals as those with a greater than 25% African American or Hispanic ICU patient  
121 census<sup>11</sup>.

#### 122 *Outcomes*

123 Our primary outcome was death during critical illness hospitalization. The secondary outcomes were  
124 ICU and hospital lengths of stay.

#### 125 *Categorization of trends*

126 We examined year of admission as a categorical (i.e., as individual two-year groups) and continuous  
127 variable.

#### 128 *Variables*

129 Basic demographics included age, gender, and ethnicity. Ethnicity was self-reported as white, African  
130 American, Hispanic, Asian, Native American, other, or unknown. Admission diagnoses were adjudicated  
131 by trained clinicians within the first 24 hours of ICU admission as part of the APACHE IV score system<sup>29</sup>,  
132 and were categorized into the fifteen most common clinical categories, including sepsis, myocardial  
133 infarction/angina, trauma, gastrointestinal bleed, arrhythmia, drug/alcohol complications,

134 cerebrovascular accident, coronary artery bypass grafting, pneumonia, malignancy related, congestive  
135 heart failure, cardiac arrest, angina, diabetes related, intracranial bleed, other and unknown. The  
136 admission APACHE IV score, obtained within 24 hours of ICU admission, was used to quantify severity of  
137 illness. The Charlson comorbidity scoring system was used to describe preexisting illness burden<sup>30</sup>. ICU  
138 unit type (medical, medical surgical, surgical, cardiac, cardiothoracic, and neurological) was included as a  
139 series of indicator variables.

#### 140 *Analysis*

141 Baseline characteristics were presented as percentages for categorical variables and mean and standard  
142 deviation for continuous variables by hospital minority composition. We used Cox proportional hazards  
143 model to estimate hazard ratios (HRs) and 95% confidence intervals (CIs) for the associations between  
144 categorical year of admission and mortality. Time to event was defined as the length of stay between  
145 ICU admission and date of death or censoring. Patients who were discharged were censored at that  
146 time. The models were adjusted for age, sex, ethnicity (white, African American, Hispanic, or other), unit  
147 type (categorical), admission diagnosis (categorical), APACHE IV severity of illness and Charlson  
148 comorbidity scores (continuous), and year of admission (categorical; 2006-2008 as the reference group).  
149 We used multiplicative interactions to determine whether the effect of admission year on mortality  
150 differed according to hospital minority composition, and explored whether these findings were  
151 consistent across ethnicity.

152 In secondary analyses, we defined minority-serving hospitals as those with a >25% African American or  
153 Hispanic ICU census and conducted survival analyses as in our primary analysis. Second, we applied  
154 generalized estimating equations (GEE) with Poisson error distribution, log link function, and  
155 exchangeable covariance structure to examine the associations between categorical admission year and  
156 mortality in those hospitals with greater than 500 admissions. This approach allowed us to account for

157 within-hospital correlation. Third, to account for hospital participation, we examined our primary  
158 analysis in those hospitals that had consistent participation in four consecutive time periods.

159 As secondary endpoints, we describe ICU and critical illness hospitalization lengths of stay according to  
160 minority hospital composition. Using standard least squares regression, including all variables from the  
161 primary analysis and an indicator for hospital mortality, we describe the adjusted differences in lengths  
162 of stay in minority-serving and non-minority hospitals and how these trends have changed over time.

163 To determine whether there were differences in critical illness resource utilization across hospitals, we  
164 examined the delay to ICU transfer in those patients admitted directly from the emergency  
165 department<sup>31</sup>. Using all variables above, and an indicator variable for hospital mortality, we describe  
166 whether the delay differed by hospital composition and how these trends have changed over time.

167 All analyses were performed using JMP Pro 12 and PROC PHREG and PROC GENMOD in SAS 9.4 (both  
168 produced by SAS Institute, Cary, NC).

## 169 **Results**

### 170 *Usage and characteristics of minority serving hospitals*

171 Of almost 1.1 million critically ill patients, 10%(n=109,022) were cared for in one of 14(7% of sampled  
172 hospitals) minority serving hospitals. There was significant ethnic variation in usage of such hospitals,  
173 with 25%(n=27,242) of African American and 48%(n=26,743) of Hispanic patients receiving critical care  
174 in a minority serving hospital, compared to 5.2%(n=42,941) of white patients. Patients in minority  
175 serving hospitals tended to be younger, with a lower comorbidity burden(Table 1), yet a higher level of  
176 illness severity on ICU presentation. Minority serving hospitals had a higher relative percentage of ICU  
177 admissions for trauma, myocardial infarction, and heart failure, and a lower percentage for sepsis and  
178 drug and alcohol complications, than non-minority hospitals. Hospital mortality proportions were



179 higher in minority than non-minority hospitals (10.5 vs 9.5%,  $p < 0.001$ ), consistently across ethnic  
180 groupings.

#### 181 *Temporal trends in critical care mortality*

182 While the incidence of critical illness mortality (Figure 1) and adjusted mortality (Table 2) steadily  
183 decreased from 2006 to 2016, the trends differed between minority and non-minority serving hospitals  
184 (multiplicative interaction between calendar year and minority-serving hospital  $p$  value  $< 0.001$ ). A  
185 steady decline in critical illness mortality (HR 0.98, 95%CI 0.97-0.98 per additional calendar year) was  
186 observed in non-minority hospitals, but not in minority serving hospitals (Table 2, supplemental table 1).

187 This temporal inequality was most apparent amongst African American patients (multiplicative  
188 interaction between calendar year and minority-serving hospital  $p$  values 0.02, 0.07, and 0.04 amongst  
189 African American, Hispanic, and white patients, respectively), where each additional calendar year was  
190 associated with 3% lower adjusted mortality (HR 0.97, 95%CI 0.96-0.97) in non-minority hospitals,  
191 compared to no change in minority-serving hospitals (HR 0.99, 95%CI 0.97-1.01)(Figure 2).

#### 192 *Sensitivity analyses of mortality*

193 Using a threshold of more than a 25% African American or Hispanic ICU census to define a minority  
194 hospital resulted in 26 minority-serving hospitals serving 177,186 patients. Patients within these  
195 hospitals had higher mortality rates and similarly less temporal improvement (multiplicative interaction  
196 between each additional calendar year and minority-serving hospital  $p$  value 0.05) than those in non-  
197 minority hospitals (Table 3). Analyses that accounted for within-hospital correlation and participation  
198 resulted in similar findings.

#### 199 *Temporal trends in ICU and hospital lengths of stay*

200 The lengths of ICU stay and critical illness hospitalization were higher among minority than non-minority  
201 serving hospitals( $3.1 \pm 3.9$  and  $7.3 \pm 6.9$  days compared to  $2.9 \pm 3.6$  and  $6.4 \pm 6.2$  days, respectively), a

202 difference that remained in an adjusted analysis that included hospital mortality [0.03(95%CI 0.02-0.04,  
203  $p<0.001$ ) and 0.21(95%CI 0.20-0.23,  $p<0.001$ ) days longer ICU and hospital stays in minority serving  
204 hospitals, respectively]. ICU and hospital lengths of stay steadily decreased in non-minority serving  
205 hospitals [-0.08(95%CI -0.08,-0.07,  $p<0.001$ ) and -0.16(95%CI-0.16,-0.15, $p<0.001$ ) days per additional  
206 calendar year, respectively], but significantly less so amongst minority serving hospitals (multiplicative  
207 interaction between minority hospital and admission year  $p$  values  $<0.001$  for both ICU and hospital  
208 lengths of stay), remaining essentially constant from 2011 to 2016(Figure 3, Table 3). This temporal  
209 disparity was most apparent in African American patients, for whom length of stay decreased in non-  
210 minority hospitals, but not in minority serving hospitals (Table 4).

#### 211 *Temporal trends in delay to ICU transfer in patients admitted from the emergency department*

212 Amongst 567,325 ICU admissions from the emergency department, the mean $\pm$  SD delay until ICU  
213 admission was 3.9 $\pm$ 16.3 hours among non-minority hospitals and 5.9 $\pm$  19.4 hours among minority-  
214 serving hospitals ( $p<0.001$ ). Over the last ten years, the adjusted delay decreased by 7.6 minutes (95%CI  
215 -8.66 to -6.51,  $p<0.001$ ) per additional calendar year in non-minority hospitals, yet had little change (1.0  
216 minutes; 95%CI-2.62 to 4.67,  $p=0.58$ ) in minority-serving hospitals.

#### 217 **Discussion**

218 In our sampling of approximately 200 hospitals across the United States, almost a third of critically ill  
219 African American and half of critically ill Hispanic patients received critical care in just 7% of surveyed  
220 hospitals. These minority-serving hospitals showed significantly less decline in critical illness mortality  
221 and length of stay over the last decade, compared to non-minority hospitals. While this inequality was  
222 consistent across ethnicities, it was most pronounced amongst African Americans, in whom we observed  
223 no temporal improvement in critical care mortality or reduction in length of stay during this period.

224 Minority serving hospitals tended to care for younger patients, with a lower overall burden of disease  
225 comorbidity, yet with a paradoxically higher severity of illness severity and mortality. Accordingly, it is  
226 difficult to determine whether our findings reflect caring for an increasingly disadvantaged population or  
227 differences in hospital resource utilization. As a proxy for hospital practice patterns, we examined the  
228 delay to ICU admission for those patients admitted through the emergency department, a clinically  
229 important indicator<sup>31-34</sup>. We found that minority-serving hospitals had significantly longer delays with  
230 little temporal improvement, while the adjusted delay to ICU admission decreased by almost eight  
231 minutes per year in non-minority hospitals.

232 Regardless of how much of the increased mortality risk is due to patient or hospital-specific issues, the  
233 high minority usage of these hospitals highlights the obstacles facing African Americans in the United  
234 States. The “neighborhood effect”, whereby location of residence has a profound effect on  
235 outcomes<sup>35-39</sup>, highlights the socioeconomic barriers to achieving equitable health care access,  
236 compounded by differences in practice patterns and resource utilization that extend into the ICU<sup>40-42</sup>.  
237 From the perspective of health care delivery, recognizing the challenges facing minority-serving  
238 hospitals is particularly important in the current “pay for performance” reimbursement paradigm<sup>43</sup> so as  
239 not to unfairly penalize the most vulnerable hospitals<sup>44</sup>. Our data provides clinical context for this  
240 concern, and underscores the need for additional support for minority-serving hospitals to ensure they  
241 have the appropriate resources to meet their strenuous clinical demand.

242 Our analysis has several notable limitations. Confounding due to either admission or discharge bias is  
243 possible, particularly since minority patients tend to receive more intensive therapy and testing towards  
244 end of life. Whether the ethnic distributions in the ICU were similar to those of the hospital were not  
245 known. In addition, how representative hospitals that choose to use the Phillips platform are is not  
246 known, and important patient characteristics, such as income, insurance type, and lifestyle choices, as

247 well as hospital information, were not available. Finally, using more granular population census  
248 definitions, such as county codes, could improve the precision of minority-hospital definitions.  
249 However, we examined two different definitions of minority hospitals, with similar results, and our  
250 primary findings were consistent through a range of sensitivity analyses and statistical approaches.  
251 Despite these limitations, the sheer size and granularity of this dataset are an important strength,  
252 providing a unique snapshot of modern American critical care over the last ten years.

253 **Conclusion**

254 A large proportion of minority patients receive critical illness care in a small number of minority-serving  
255 hospitals, which over the last ten years, have not enjoyed the steady decrease in mortality and length of  
256 stay that non-minority hospitals have. Whether this reflects a more systemic disparity, whereby African  
257 Americans are more medically disadvantaged upon presentation, or differences in hospital care and  
258 resources, is not known, but regardless, this observation highlights the profound obstacles facing  
259 minorities and minority-serving hospitals.

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Table 1. Baseline patient and hospital characteristics. Percentages for categorical variables and mean(standard deviation) for continuous variables provided. Abbreviations; MI-myocardial infarction, CABG-coronary artery bypass grafting, CHF-congestive heart failure, CVA-cerebrovascular accident, APACHE IV – Acute Physiology and Chronic Health Evaluation IV. <sup>1</sup>Categorization of hospital size was missing in 46,579 patients.

Patient and hospital characteristics		
	Minority serving hospitals	Non minority hospitals
Number of patients	109,022	979,087
Number of hospitals	14	194
Age(years)	61.8(18.2)	62.8(17.6)
Female	46.5	45.8
Ethnicity/Race		
White	39.4	80.6
African American	25.0	8.6
Hispanic	24.5	3.0
Other/Unknown	11.1	7.8
ICU type		
Cardiac/cardiothoracic	27.9	22.5
Medical	14.7	15.7
Medical/surgical	48.7	55.4
Surgical	8.7	6.4
Academic	32.3	27.8
Hospital beds <sup>1</sup>		
>500	35.2	43.8
250-500	36.7	20.4
Charlson Comorbidity Index	3.4(2.7)	3.5(2.7)
APACHE IV	55.7(27.0)	53.4(25.5)
Admission diagnosis		
Sepsis	7.7	10.2
MI/Angina	9.3	8.0
CABG	3.8	3.9
CHF	3.7	3.0
Trauma	5.5	5.1
Drug and Alcohol related	2.6	4.4
CVA	3.6	4.0
Pneumonia	3.6	3.6
Intracranial bleed	2.6	1.6
Hospital characteristics		
Academic	28.6	6.7



Hospital beds		
>500	14.2	11.3
250 to <500	36.0	15.4
Hospital mortality	10.5	9.5

Table 2. Hazard ratio(95% CI) of critical illness mortality per admission year category provided, with 2006-08 considered as reference for all analyses. Adjusted for age, gender, ethnicity, unit type, admission diagnosis, Charlson comorbidity score, and illness severity. In addition, alternative definition of hospital minority composition, and analytic approaches to account for within hospital correlation and hospital participation, provided. Multiplicative interaction p value between indicator for minority serving hospitals and admission year (defined continuously) provided.

Adjusted hazard ratios for critical illness mortality according to admission year and hospital minority composition						
	Admission year					Multiplicative interaction term p value
	2006-08	2009-10	2011-12	2013-14	2015-16	
All hospitals	Ref.	0.86 0.84-0.89	0.82 0.80-0.84	0.81 0.79-0.82	0.80 0.78-0.82	-
Minority serving hospitals	Ref.	0.83 0.77-0.89	0.88 0.82-0.95	0.79 0.74-0.85	0.88 0.81-0.94	<0.001
Non-minority hospitals	Ref.	0.87 0.85-0.89	0.80 0.79-0.82	0.81 0.79-0.82	0.79 0.77-0.81	
Minority hospital defined as having greater than 25% African American or Hispanic census						
Minority serving hospitals	Ref.	0.85 0.80-0.90	0.83 0.78-0.87	0.79 0.75-0.83	0.85 0.80-0.90	0.05
Non-minority hospitals	Ref.	0.87 0.84-0.89	0.81 0.79-0.83	0.81 0.79-0.83	0.79 0.77-0.81	
GEE analysis in hospitals with >500 admissions to account for hospital correlation						
Minority serving hospitals	Ref.	0.94 0.92-0.95	0.93 0.91-0.95	0.90 0.88-0.93	0.94 0.91-0.97	0.05
Non-minority hospitals	Ref.	0.94 0.92-0.95	0.90 0.88-0.92	0.89 0.87-0.91	0.88 0.86-0.90	
Cox regression in hospitals with participation in four consecutive time periods						
Minority serving hospitals	Ref.	0.82 0.76-0.88	0.87 0.81-0.94	0.75 0.70-0.81	0.87 0.81-0.94	0.003
Non-minority hospitals	Ref.	0.87 0.85-0.89	0.81 0.79-0.83	0.82 0.80-0.84	0.80 0.77-0.82	

Table 3. Change in length of intensive care unit and critical illness hospital stay(days), relative to 2006-08, adjusted for age, gender, ethnicity, unit type, admission diagnosis, Charlson comorbidity score, illness severity, admission year category, and hospital mortality. Multiplicative interaction between indicator for minority serving hospitals and admission year (defined continuously) provided.

Adjusted change of intensive care unit and critical illness hospitalization lengths of stay from 2006 to 2016						
	Admission year					Multiplicative interaction term p value
	2006-08	2009-10	2011-12	2013-14	2015-16	
Adjusted change in ICU length of stay						
Minority serving hospitals	Ref.	-0.35 -0.43,-0.27	-0.48 -0.56,-0.40	-0.41 -0.49,-0.34	-0.44 -0.52,-0.36	<0.001
Non-minority hospitals	Ref.	-0.42 -0.45,-0.39	-0.56 -0.59,-0.53	-0.64 -0.66,-0.61	-0.67 -0.70,-0.65	
Adjusted change in hospital length of stay						
Minority serving hospitals	Ref.	-0.74 -0.91,-0.59	-1.12 -1.27,-0.96	-1.01 -1.17,-0.87	-0.98 -1.13,-0.81	<0.001
Non-minority hospitals	Ref.	-0.56 -0.63,-0.50	-0.90 -0.95,-0.85	-1.14 -1.18,-1.09	-1.37 -1.41,-1.32	

Table 4. Adjusted change(95%CI) per additional calendar year in the length(days) of ICU and critical illness hospitalization according to ethnicity. Adjusted for age, gender, ethnicity, unit type, admission diagnosis, Charlson comorbidity score, illness severity, admission year (defined continuously), and hospital mortality. Multiplicative interactions between indicator for minority serving hospitals and admission year (defined continuously) were <0.001 within each ethnic strata.

Adjusted change(days) in length of stay per additional calendar year according to ethnicity				
	ICU length of stay		Hospital length of stay	
	Minority serving hospital	Non-minority hospital	Minority serving hospital	Non-minority hospital
African American	-0.01 -0.02,0.01 p=0.46	-0.09 -0.10,-0.08 p<0.001	-0.03 -0.07,0.01 p=0.19	-0.21 -0.23,-0.20 p<0.001
Hispanic	-0.09 -0.10,-0.07 p<0.001	-0.06 -0.07,-0.04 p<0.001	-0.20 -0.23,-0.16 p<0.001	-0.12 -0.15,-0.09 p<0.001
White	-0.04 -0.05,-0.02 p<0.001	-0.08 -0.08,-0.07 p<0.001	-0.08 -0.11,-0.06 p<0.001	-0.16 -0.17,-0.16 p<0.001

Figure 1. Critical illness mortality(95%CI) in minority and non-minority serving hospitals from 2006-2016 in the United States (n=1,088,109). Trend p values for minority serving and non-minority hospitals were 0.002 and <0.001, respectively.

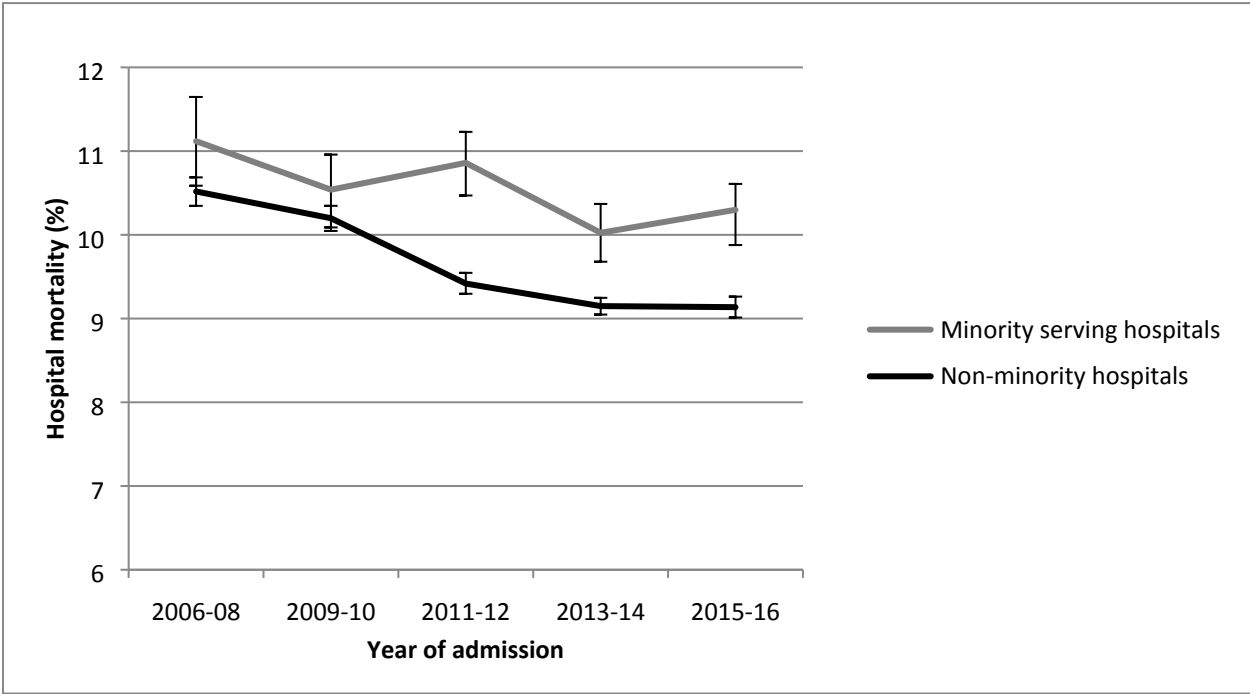


Figure 2. The adjusted hazard ratio (95% CI) of hospital mortality per additional calendar year of admission between 2006 and 2016, stratified by ethnicity. Adjusted for age, gender, unit type, admission diagnosis, Charlson comorbidity score, illness severity, and year of admission (defined continuously). Multiplicative interaction between calendar year and minority serving hospital p values 0.02, 0.07, and 0.04 amongst African American, Hispanic, and white patients, respectively. N=1,039,595 patients in 208 hospitals.

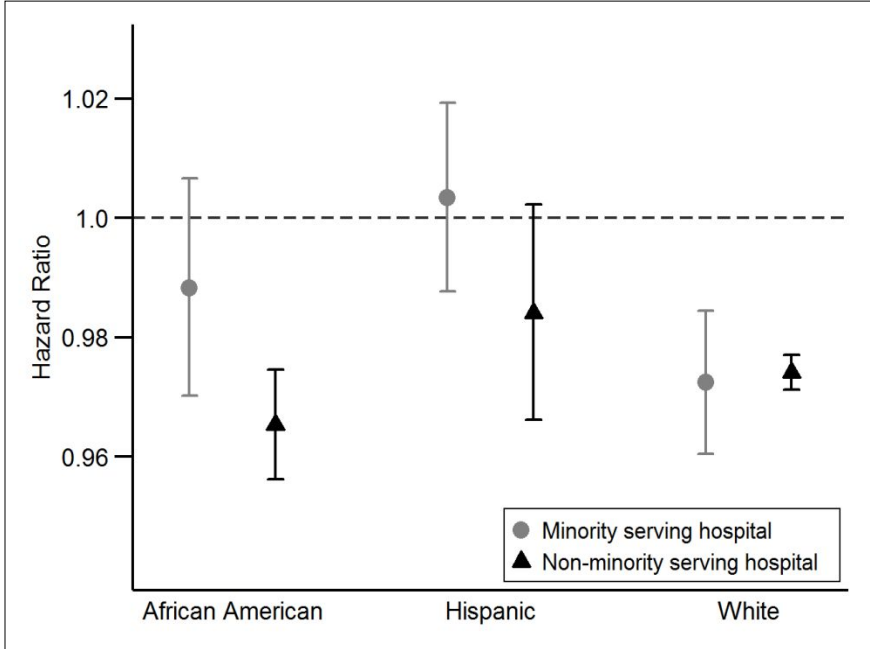
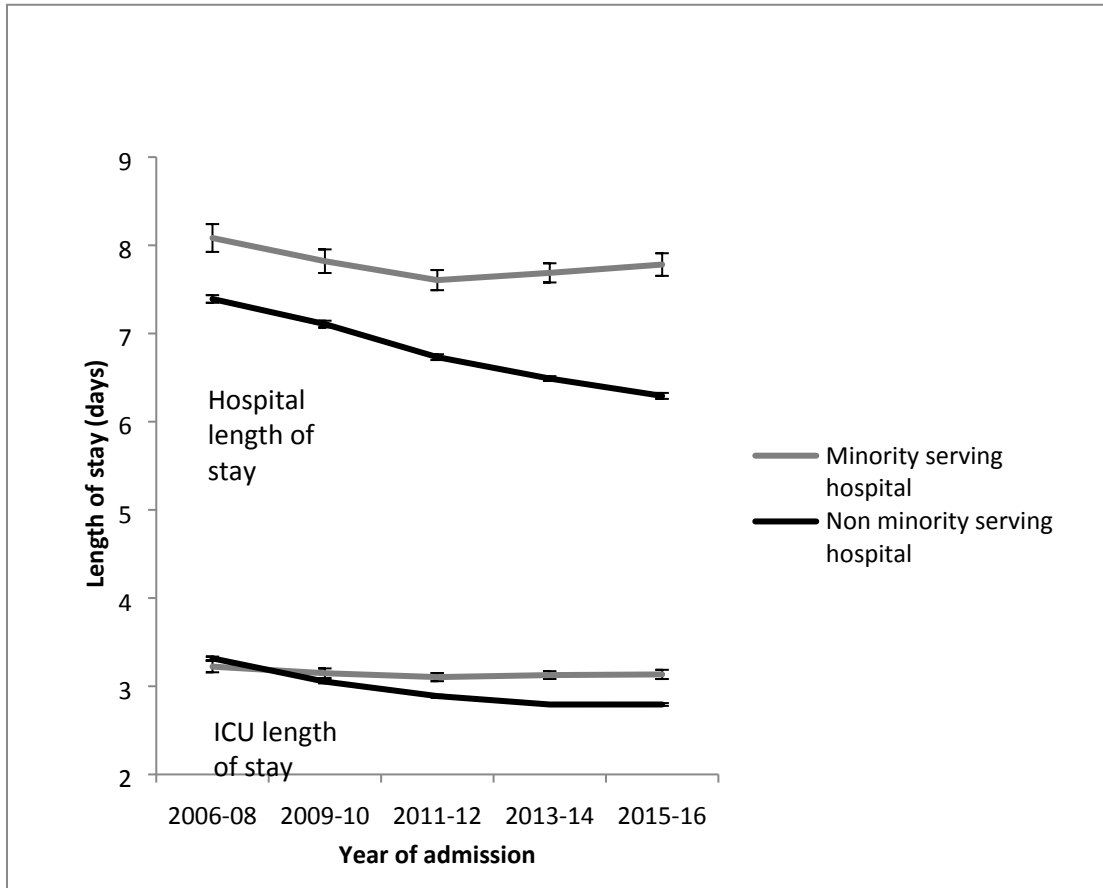


Figure 3. Temporal trends in hospital and ICU length of stay in minority and non-minority serving hospitals. Mean(95%CI) lengths of stay according to year of admission provided. Trend p values all <0.001, except for ICU length of stay in minority serving hospitals (p=0.06).



Temporal trends of critical illness mortality rates according to hospital minority composition					
	2006-08	2009-10	2011-12	2013-14	2015-16
All hospitals	10.6	10.2	9.6	9.2	9.2
Minority Serving hospitals	11.1	10.5	10.9	10.0	10.3
African American	10.3	11.3	10.6	10.7	10.2
Hispanic	10.6	9.7	10.4	9.4	10.9
White	12.4	11.3	11.6	10.4	10.6
Non-minority serving hospitals	10.5	10.2	9.4	9.2	9.1
African American	10.1	10.1	8.8	8.3	8.4
Hispanic	7.3	8.1	7.0	7.6	8.0
White	10.7	10.3	9.5	9.3	9.3

Supplemental table I. Crude critical illness mortality rates (percentages) in minority and non-minority serving hospitals, stratified by ethnicity.