1	Cost of Care Associated with BMI in Patients with Sickle Cell Disease							
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21 22 23 24 25 26 27 28 29 30 31 32 33	BMI SCD CoC USD EMR CDC GLM GEE MCAR SD SE LS	Body mass index Sickle cell disease Cost of care United States dollar Electronic medical record Centers for Disease Control and Prevention Generalized linear model Generalized estimated equations Missing completely at random Standard deviation Standard error Least-squares						
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35								

### 37 BACKGROUND:

Children with sickle cell disease (SCD) incur greater medical expenditures than children without
SCD. The prevalence of overweight has risen among children with SCD in recent years, but the
impact of excess weight on both the disease burden and economic burden of SCD has not been
determined.

42 PROCEDURE:

A convenience sample of patients with SCD under 18 years of age were asked to participate
during a routine medical check-up. All participants were from one SCD clinic in North Carolina.
Annual cost of care (CoC) in United States dollars (USD) was measured during four stages of
adolescence (pre, early, middle, and late) for two groups of patients with SCD who were either
above or below an age- and sex-specific 50th percentile for body mass index (BMI).

48 RESULTS:

49 A total of 33 African-American patients (mean age at enrollment  $11.76 \pm 3.13$ , 15 (45.5%)

female) recorded 914 medical encounters spanning 306 patient-years. For patients over the 50th

51 BMI percentile, CoC was estimated to increase by an additional 1,006 (p < 0.001) per year.

52 The estimated difference in annual CoC became most pronounced in late adolescence, wherein

patients in the higher percentile group incurred an additional annual CoC of 11,695 (p =

54 0.019).

55 CONCLUSIONS:

The differences we measured in cost of care for patients with SCD gives weight to the hypothesis that economic burden is exacerbated by excess bodyweight. Differences in the domain of healthcare costs also suggest potential benefits of weight-management interventions. Further studies implementing such interventions may provide insights for strategically managing SCD, reducing economic burden and improving patient outcomes.

61

### 62 1 INTRODUCTION

Sickle cell disease (SCD), a family of inherited autosomal recessive genetic disorders, affects 63 approximately 1 in 500 African Americans and 100,000 individuals in the US.<sup>1</sup> Increasing life 64 expectancy for patients with SCD<sup>2</sup> has facilitated the study of health-related quality of life<sup>3</sup> 65 (HRQOL) and cost of care<sup>4</sup> (CoC). Children with SCD utilize healthcare more frequently<sup>5,6</sup> and 66 incur greater CoC than peers without SCD.<sup>7-9</sup> Recent evidence suggests that overweight and 67 68 obesity are becoming more prevalent among children and adults with SCD in both the developed and developing worlds,<sup>10–13</sup> but there is limited understanding regarding the economic impact of 69 70 these health risk factors.

Obesity is associated with greater CoC amongst children in the US<sup>14,15</sup> and other developed nations.<sup>16–19</sup> Several factors influence the impact of obesity on CoC, including gender<sup>20</sup> and socioeconomic status.<sup>19</sup> With increasing rates of overweight and obesity among persons with SCD, there has been speculation regarding an association between excess weight and increased CoC,<sup>11,13,21</sup> and the current body of literature is in need of longitudinal studies to measure the impact of sustaining excess weight during adolescence for patients with SCD.

77 In this article, we summarize a retrospective cohort study that extracted medical encounter data 78 from electronic medical records (EMR) for consecutive pediatric and adolescent patients with 79 SCD. We statistically estimate and compare (1) the rate of change in annual CoC for patients 80 with high and low standardized body mass index (BMI) values (Z scores) and (2) the expected annual CoC during four stages of adolescence, controlling for sex, insurance type, year, age at 81 82 enrollment, and socioeconomic status. Our results make a case for further study of the 83 association between overweight and increased medical and economic burden for patients with 84 SCD in a more controlled setting involving one or more nutrition and exercise based 85 interventions.

86

#### 87 2 METHODS

88 2.1 Recruitment

89 As part of a larger study on the adolescent transition period for adolescents with chronic medical 90 conditions, a convenience sample of patients with SCD under 18 years of age was recruited from 91 one comprehensive sickle cell clinic. Details of the longitudinal sample and study design and inclusion and exclusion criteria have been previously published.<sup>22</sup> This current study's inclusion 92 93 criteria included a confirmed diagnosis of SCD, ability to speak and understand English, and 94 freedom of cognitive impairment (determined by health care provider) that would inhibit ability 95 to complete study activities. After institutional review board approval, patients with SCD and 96 their parents were invited to participate and informed consents were obtained from study 97 participants and their parents.

98 2.2 Data Collection

99 Data were collected from the EMR at University of North Carolina Pediatric Sickle Cell Clinic.

100 All participants' medical records were reviewed and anthropometric, financial, and demographic

101 data were extracted from WebCIS, a Legacy record, (2004-2014) and EPIC (2014-2016) systems

102 at each outpatient, inpatient, or emergency room visit.

103 2.3 Measures

104 The measurement of time is paramount in longitudinal studies, so we present results based on 105 two perspectives of patient age. More specifically, age was considered as both a continuous and 106 categorical variable. For the latter, we split numeric age values into a total of four stages of 107 adolescence based on guidelines set by the American Academy of Pediatrics<sup>23</sup>: pre-adolescence 108 (age 8 to 11), early adolescence (age 11 to 15), middle adolescence (age 15 to 18), and late 109 adolescence (age 18 to 21). Regarding age as a continuous variable, we used the numeric values 110 of 9.5, 13, 16.5, and 19.5 years in place of the group identifiers. Annual CoC in United States 111 dollars (USD) for each stage was constructed by summing CoC at the encounter level for each 112 patient within each stage and dividing by the spanning number of years. For example, if a 113 patient's total CoC from age 8 to 11 was 99 dollars, their annual CoC would be 99 / (11-8) = 33114 dollars per year.

Some patients' data either began or ended near the borders of a stage (e.g., collection began at age 10.8 or ended at age 18.1). Allowing these borderline encounters to represent CoC for an entire stage leads to underestimation of the true CoC, yet overestimation results from pushing the borderline values into the closest stage (i.e. using the initial encounter at age 10.8 as an observation in the early adolescence stage). For these reasons we elected to exclude borderline encounters, which were defined as encounters that occurred during a patient's final or initial stage but did not cover more than half of the stage's duration. Figure 1 illustrates our inclusion and exclusion process for a fictional set of encounters from one patient as well as the formulation
of three annual CoC values. The fictional patient's initial encounter is a borderline case and is
excluded. Since the spanning time between the onset of the late adolescence stage and the final
encounter is greater than 75% of the stage duration, the final encounter is included.



126

FIGURE 1 Data inclusion and exclusion process. NOTE: The cost values in the figure arefictional.

129



137 non-overweight patients, which would require splitting along the 85th percentile (Z = 1.1). 138 Instead, we use the 50th percentile (1) to preserve statistical power and (2) because patients with SCD have historically maintained lower BMIs relative to their peers without SCD.<sup>26</sup> With 139 140 regards to reason (2), a 'normal BMI' SCD patient according to standard growth charts may in 141 fact be in the upper BMI percentiles of the SCD population. 142 Additional variables included patient's median neighborhood income (based on patient zip code), 143 medical insurance type (private or public), sex (male or female), year at the onset of an age 144 period (e.g., 2009 when patient was 15, 2012 when patient was 18), and age at enrollment. 145 2.4 Statistical Analyses All statistical analyses were produced with R version 3.3.0.<sup>27</sup> Descriptive statistics (e.g. 146 147 groupwise mean values and standard errors) were considered prior to application of the generalized linear model  $(GLM)^{28}$  with generalized estimating equations  $(GEE)^{29,30}$  and a log 148 149 link function.<sup>31</sup> This technique is a generalization of analysis of variance with unequal sample 150 sizes and clustered outcomes that do not maintain a bell shaped distribution.<sup>32</sup> Tests of difference between two means<sup>33</sup> using the GLM with GEE generalizes the paired t-test by using all 151 152 observations from each participant (even if the participant had only one value) and also adjusting 153 for the correlation between observations within subjects. For these comparisons, we fixed each 154 of the continuous control variables (income and age at enrollment) upon their respective sample 155 means.

156 2.5 Missing Data

Missing data at the encounter level included 121 (13%) height values and 67 (7%) weight values.
We imputed these missing values using a weighted mean of previous and future values based

upon temporal proximity. Height values for patients over the age of 18 were carried forward forall subsequent observations.

161 Missing data at the subject level included 6(6%) income values. We assumed these data were 162 missing completely at random (MCAR) and conducted sensitivity analyses by separately 163 constructing a model using the complete cases (excluding subjects with missing values) data and 164 another using the full data (including imputed values). The complete cases model was in full 165 agreement with inferences made by the full data model, indicating that the MCAR assumption 166 was valid. After establishing the MCAR assumption, we applied multiple imputation using the 167 conditional specification implemented by the MICE algorithm<sup>34</sup> to impute the missing income 168 values.

169

170 3 RESULTS

# 171 3.1 Enrollment of Participants

172 A total of 33 patients recorded 914 medical encounters spanning 306 patient-years. After

173 collapsing the encounter level data to form the annual outcomes within age periods, we had a

total of 99 observations. Removing observations based on borderline encounters left a total of 96

175 observations.

176 3.2 Sample Characteristics

- 177 Mean age at entry and final encounter were  $11.76 \pm 3.13$  and  $18.74 \pm 1.88$  years, respectively.
- 178 The sample had a total of 15 (45.5%) female participants and 18 (54.5%) males. Most
- participants (17 (51.5%)) were in the lower Z score group, and the mean Z score was -0.14  $\pm$

180 1.09. All participants were identified by parents or guardians as African American and 32 (97%)

181 were not of Hispanic ethnicity. The mean reported income plus or minus one standard deviation

182 (SD) was  $49,150.55 \pm 13,787.84$ . Last, 22 (66.7%) patients were primarily insured with a type

183 of public insurance (e.g. Medicaid) and 11 (33.3%) patients with a type of private insurance.

184 Table 1 summarizes the sample characteristics for each *Z* score group.

### 185

	Lower BMI	Higher BMI	All
	n = 17 (51.5)	n = 16 (48.5)	n = 33
Number of observations $(p = 0.253)$	$3.1\pm0.8$	$2.8 \pm 0.7$	$2.9\pm0.8$
Age (years) at enrollment ( $p = 0.678$ )	$12.0 \pm 3.0$	$11.5 \pm 3.4$	$11.8 \pm 3.1$
Age (years) at conclusion $(p = 0.047)$	$19.4 \pm 1.2$	$18.1 \pm 2.3$	$18.7\pm1.9$
Income (USD) ( $p = 0.366$ )	$47,008 \pm 12,998$	$51,\!427 \pm 14,\!650$	$49,151 \pm 13,788$
Z Value (p < 0.001)	$-0.9 \pm 1.0$	$0.7 \pm 0.4$	$-0.1 \pm 1.1$
Sex $(p = 0.024)$			
Female	4 (23.5)	11 (68.8)	15 (45.5)
Male	13 (76.5)	5 (31.2)	18 (54.5)
Billing Party ( $p = 0.538$ )			
Public	10 (58.8)	12 (75.0)	22 (66.7)
Private	7 (41.2)	4 (25.0)	11 (33.3)

#### 186 TABLE 1 Sample Characteristics.

For continuous variables, values are mean  $\pm$  standard deviation.

For categorical variables, values are frequency (%).

BMI: body mass index; USD: United States dollar

### 187

188 Figure 2 displays subject-specific annual CoC values (small grey points) for upper and lower

189 BMI Z score groups across the four age periods. Mean annual CoC values are displayed as larger

190 black points with error bars showing the width of one standard deviation above and below the

191 mean. Observation counts and mean values plus or minus one standard deviation are also

tabulated at the bottom of the figure.



194 FIGURE 2 Unadjusted mean annual CoC (USD) ± SD

195

### 196 3.3 Difference in Slopes

197 The rate of change per year in annual CoC was estimated from the GLM with a continuous age

198 predictor. For the low Z score group, the estimated change in annual CoC from age 8 to 21 was

199 \$42 (95% CI: -71 to 155). For the high *Z* score group, the estimated slope was \$1,047 (95% CI:

200 488 to 1,607). To summarize, CoC was estimated to increase by an additional \$1,006 (95% CI:

201 445 to 1,566) per year for high *Z* score patients.

202 3.4 Difference in Means

203 Using the categorical formulation of age, Table 2 presents estimated least-squares (LS) means

and standard errors (SE) of annual CoC as well as estimated differences between annual CoC

205	between Z score groups for each age period. Difference values are computed by subtracting the
206	estimated mean of the lower $Z$ score group from that of the higher $Z$ score group. In the two
207	earliest age periods (pre- and early adolescence), we estimated modest difference in CoC
208	between groups. During middle adolescence we measured a nontrivial difference of \$2,231 (95%
209	CI: -1,768 to 6,230) that did not achieve statistical significance. A substantial and statistically
210	significant ( $p = 0.019$ ) difference of \$11,695 (95% CI: 1,759 to 21,632) was measured during
211	late adolescence.

212

# 213 TABLE 2 Comparison of estimated cost of care means

	Lower LS Mean		Higher LS Mean					
Age Group	(SE)	n	(SE)	n	Difference	p-value		
Pre	1,308 (598)	6	959 (403)	9	-349	0.488		
Early	2,260 (862)	15	2,361 (1146)	12	101	0.926		
Middle	2,877 (895)	16	5,108 (2338)	15	2,231	0.264		
Late	1,659 (510)	13	13,354 (4953)	10	1,1695	0.019		
Means presented in United States dollars								

LS: least-squares; SE: standard error

# 214

### 215 4 DISCUSSION

This retrospective cohort study aimed to estimate the rate of change in annual CoC for patients

217 with high and low standardized BMI values and the expected annual CoC during four stages of

adolescence. For higher *Z* score patients, CoC was estimated to increase by an additional \$1,006

219 (p < 0.001) per year. The estimated difference in annual CoC became most pronounced in late

adolescence, wherein patients with higher *Z* scores incurred an additional annual CoC of \$11,695

221 (p = 0.019).

222 We experienced a number of challenges in the course of this study that may prove relevant for 223 future studies. Data collection through EMR proved to be very accurate for cost data, but less so 224 for data concerning age, weight, height, and other patient information relating to demographic 225 and socioeconomic factors. Improving the accuracy and consistency of information kept in 226 electronic medical records could potentially alleviate many of the limitations we experienced and 227 allow more studies such as this to be conducted. One of the primary limitations of this research 228 (in addition to a small number of patients) is that data were collected within a single hospital 229 system and patients may have visited multiple hospitals over their adolescence. Pooling patient 230 data from multiple institutions in future studies could alleviate this limitation.

231 These data suggest that at some point in adolescence, the CoC of patients with SCD becomes 232 highest in overweight patients and this trend carries forward into adulthood. One of the main 233 virtues of observational data is their capacity to generate relevant hypotheses for future research. Previous research has associated overweight status with increases in the burden of SCD,<sup>11</sup> and 234 235 this has motivated exploration of how these patterns emerge over time. Based on these premises 236 we have summarized several points in this article to present evidence of association between 237 overweight and increased CoC for patients with SCD beginning in the late teen years. Our 238 findings should not be interpreted as causal association but should motivate exploration of data-239 driven hypotheses.

A recent study<sup>4</sup> estimated that the annual CoC for patients with SCD in the United States exceeded one billion dollars. The authors also commented that a small proportion of patients with SCD accounted for a large proportion of healthcare expenditures, which we have also found to be the case in our sample. If excess weight plays a role in the development of severe symptoms that in turn account for a large proportion of the total CoC for SCD, then there may be both clinical and economic benefits to healthcare providers informing patients about the likely
consequences of the disease for different weight groups. Future research could address whether
there is potential to reduce the medical cost of SCD in young adults with weight management
interventions.

249 The relationship between excess weight and increased CoC may be supported by previous 250 literature. Overweight status is associated with comorbidities that may be of particular 251 significance for disease management and CoC in the SCD population. Recently, high BMI was 252 found to be associated with hypertension and increased risk of stroke within an adult population with SS genotype.<sup>35</sup> Excess weight has also been associated with increased pain interference in 253 daily activities among adults with SCD.<sup>11</sup> Children with SCD experience much higher rates of 254 255 snoring and sleep apnea, associated in the general population with overweight status, than the general population<sup>36</sup> and it has been shown that lower nocturnal hemoglobin saturations appear 256 to be associated with increased vaso-occlusive pain crises.<sup>21</sup> There is also strong evidence that 257 258 snoring and sleep apnea are associated with increased cerebral, cognitive, and behavioral 259 morbidity.<sup>36</sup> However, studies conflict on the presence of a direct relationship between weight 260 status and sleep apnea or hypertension in children with SCD.<sup>13,36</sup> It could then be hypothesized 261 that excess weight, through various mechanisms (e.g., metabolic syndrome, hypertension, and 262 hypoxic sleep disturbances), has negative consequences for morbidity and CoC.

Current SCD care guidelines from the National Heart, Lung, and Blood Institute only
superficially address weight management,<sup>37</sup> and we believe amendment of these guidelines to
reflect the main points of this study and others<sup>35</sup> would be an important step towards higher
quality healthcare and lower CoC for patients with SCD. Although we have mainly focused on
the implications of excess weight in patients with SCD, the relationship between growth failure,

delayed puberty, and underweight status in many patients with SCD<sup>26,38–41</sup> should also be
considered in potential amendments.

Another implication of these findings is for the financing of SCD care. Two thirds of this study's
participants utilized public insurance, consistent with literature suggesting the majority of
patients with SCD in the US rely on Medicaid.<sup>42–44</sup> If cost-effective weight management
interventions can be validated for the SCD population, stakeholders such as the Centers for
Medicare and Medicaid Services and other insurance and healthcare providers may be
encouraged to invest further in health promotion efforts for patients with SCD.

276

#### 277 5 CONCLUSION

278 Sickle cell disease affects around 100,000 individuals in the US and amounts to over a billion 279 dollars of healthcare expenditures per year. Recent evidence suggests that the prevalence of 280 overweight and obesity status for these individuals is growing. The relationship between obesity 281 and rising healthcare costs has been studied thoroughly, but the nature of this relationship within 282 the SCD population remains unexplored. In this study, we analyzed longitudinal EMR data to 283 assess the association between standardized BMI values (Z scores) and CoC for patients with 284 SCD. For higher Z score patients, CoC was estimated to increase by an additional 1,006 (p < 285 0.001) per year. The estimated difference in annual CoC became most pronounced in late 286 adolescence, wherein patients with higher Z scores incurred an additional annual CoC of \$11,695 287 (p = 0.019). These observational data have provided evidence that gives weight to the 288 hypothesis that preventative therapy of SCD-related health complications via weight

- 289 management interventions may substantially reduce the economic burden of SCD for pediatric
- 290 patients.
- 291
- 292 CONFLICT OF INTEREST
- 293 The authors declare that there is no conflict of interest.
- 294
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