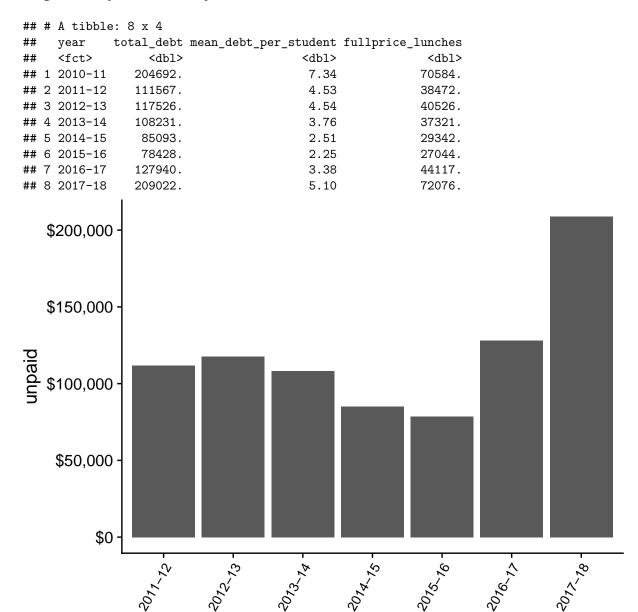
The Community Eligibility Provision: Food Insecurity in Durham Public Schools

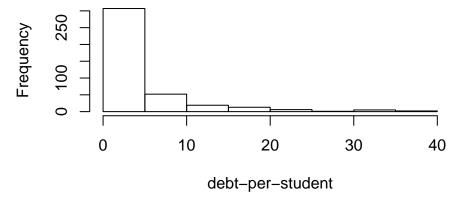
Julia Donheiser
11/2/2018

Exploratory Data Analysis



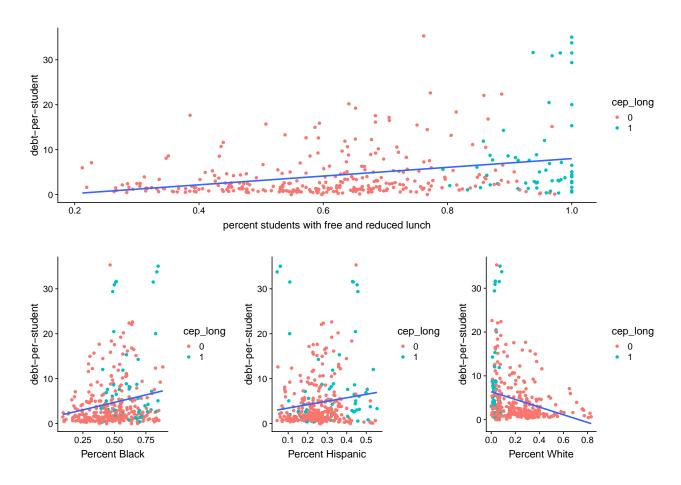
[1] 2.036936

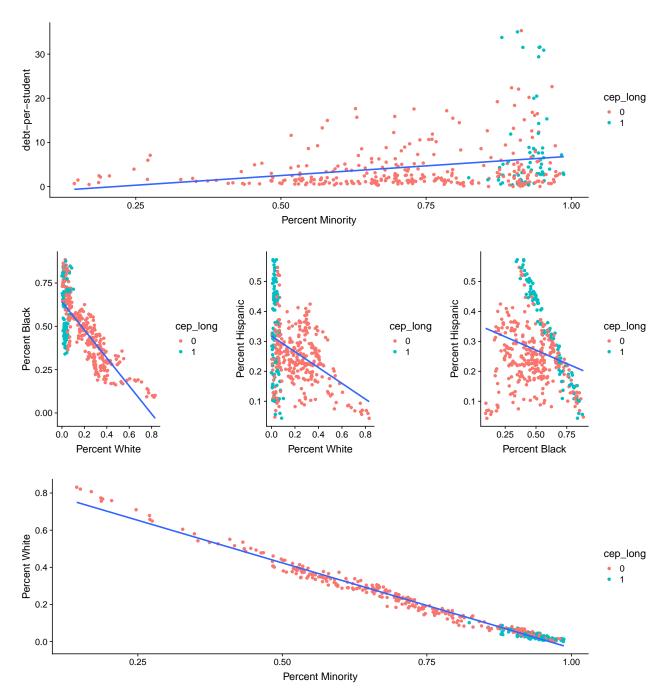
At the end of the 2017-18 academic year, DPS had over \$211,000 in school lunch debt. That's over 72,000 unpaid lunches, with an average of \$5.10 of debt per student. It's also the most debt the school district has seen in the past eight years.



Most schools have less than \$5 of lunch debt per student. In Durham, a full-priced lunch costs \$2.90, and a reduced-price lunch cost \$0.40, according to the Durham Public Schools website. That's about two unpaid full-priced lunches per student, or just over 12 unpaid reduced-price lunches per student. For the rest of my EDA, I'll delve into which schools have more debt and whether we can find systematic issues. I'll also be looking at schools that are part of the Community Eligibility Provision, which means all students receive free lunch.

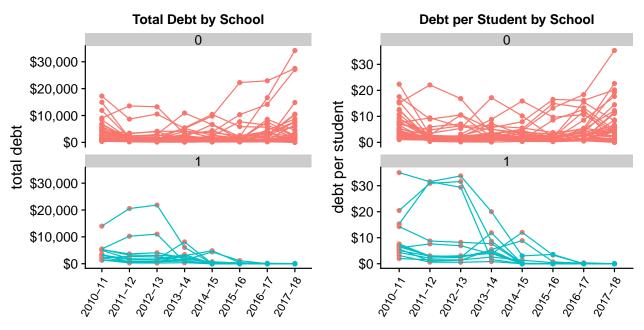
Debt and Demographics





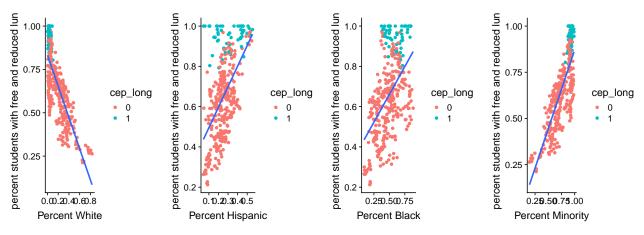
There is a weak positive correlation between the percentage of students who have free and reduced price lunch and the debt-per-student at each school. It looks like schools with CEP status generally have a higher percentage of students on free/reduced lunch. As for demographics, there is also a weak positive correlation between the percentage of black students and debt-per-student. Conversely, there is a weak negative correlation between the percent of white students and debt-per-student. There doesn't appear to be a much of a relationship between the percentage of hispanic students and debt-per-student. That being said, if we look at the total percentage of minority students — the percentage of black and hispanic students — there is a positive correlation with debt-per-student. Schools that CEP status are also starkly segregated, with very few white students and primarily black and hispanic students.

Debt over time



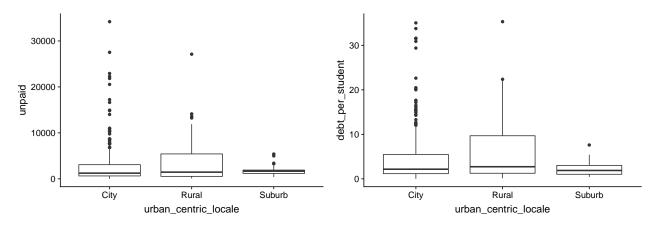
Schools with CEP status generally had a large amount of debt until the 2014-15 school year, when they gained CEP status. That being said, other schools with similar amounts of debt did not gain CEP status.

Demographics and need

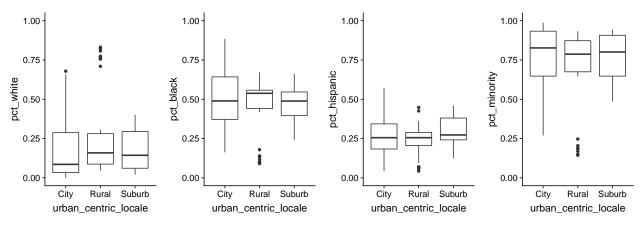


We can also see that race is a proxy for need. The percentage of black and hispanic schools have a strong, positive correlation with the percentage of students on free and reduced price lunch. For white students, this relationship is strong and negative.

Locale and debt, race



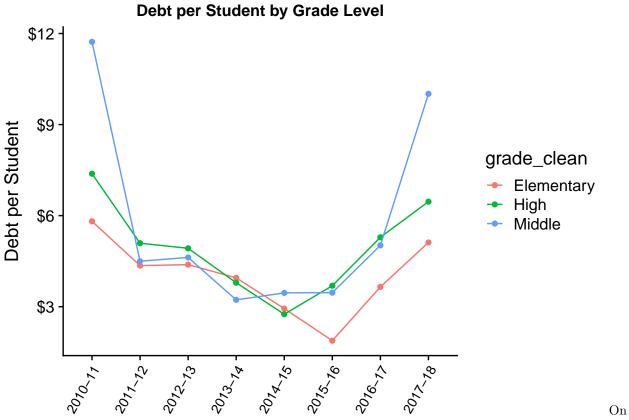
There don't seem to be major differences in debt by location.



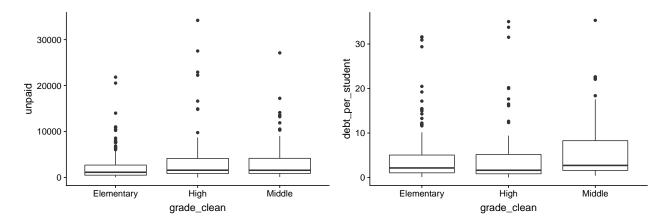
On average, we also don't see any major differences in race by locale. However, there is a subset of rural schools that seem to primarily be white.

Debt and grade

##	#	A tibble: 3	x 3	
##		<pre>grade_clean</pre>	${\tt mean_debt}$	mean_dps
##		<fct></fct>	<dbl></dbl>	<dbl></dbl>
##	1	Elementary	2181.	4.10
##	2	High	4016.	4.94
##	3	Middle	3541.	5.70



average, high schools have the most total debt. However, middle schools, on average, have the most debt per student.



CEP Schools

In this section, I explore the differences between schools that gained CEP status and schools that did not.

Eligibility

eligible participating
1 105 35

Eligible but non-participating CEP schools

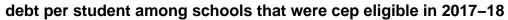
```
## # A tibble: 3 x 7
##
  # Groups:
                eligible [?]
##
     eligible participating
                                     unpaid mean_dps avg_free_reduced
                                  n
##
        <int>
                       <int> <int>
                                                                  <dbl>
                                      <dbl>
                                                <dbl>
## 1
            0
                            0
                                 26 1.29e+5
                                                 5.28
                                                                   0.51
## 2
            1
                            0
                                 12 7.97e+4
                                                10.3
                                                                   0.75
## 3
            1
                            1
                                 13 8.00e-1
                                                 0
                                                                   1
## # ... with 1 more variable: avg_pct_minority <dbl>
## [1] 0.3811623
```

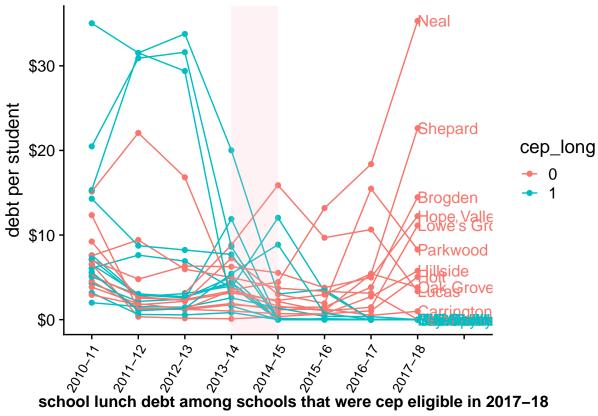
Last year, debt was concentrated in schools that were not eligible to participate in the CEP program. However, eligible but non-participating CEP schools accounted for nearly 40 percent of all debt in Durham county.

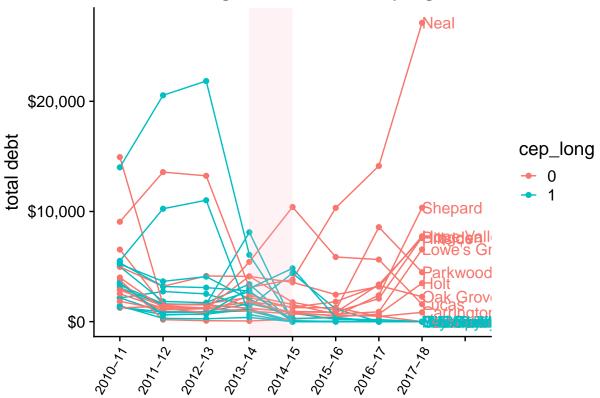
CEP Status and Grade Level

```
## # A tibble: 8 x 6
## # Groups:
                grade_clean, eligible [6]
##
     grade_clean eligible participating
                                                n unpaid mean_dps
##
     <fct>
                     <int>
                                     <int> <int>
                                                    <dbl>
                                                              <dbl>
## 1 Middle
                                                6 54097.
                                                              14.6
                          1
                                         0
## 2 High
                          0
                                         0
                                                7 86544.
                                                               7.48
                                                4 17983.
                                                               7.35
## 3 Elementary
                                         0
                          1
## 4 Elementary
                                         0
                                               14 30607.
                                                               4.48
## 5 Middle
                                                               4.45
                          0
                                         0
                                                5 12199.
## 6 High
                                         0
                                                2
                                                   7591.
                                                               2.9
                          1
## 7 Elementary
                                               12
                                                      0.8
                                                               0
                          1
                                         1
## 8 High
                                                       0
                          1
                                                               0
## # A tibble: 8 x 6
## # Groups:
                grade_clean, eligible [6]
##
     grade_clean eligible participating
                                                   unpaid mean dps
                                                n
##
                      <int>
                                     <int> <int>
                                                    <dbl>
                                                              <dbl>
     <fct>
## 1 High
                          0
                                         0
                                                7 86544.
                                                               7.48
## 2 Middle
                                         0
                                                6 54097.
                                                              14.6
                          1
## 3 Elementary
                                               14 30607.
                          0
                                         0
                                                               4.48
## 4 Elementary
                          1
                                         0
                                                4 17983.
                                                               7.35
## 5 Middle
                                                               4.45
                          0
                                         0
                                                5 12199.
## 6 High
                          1
                                         0
                                                2
                                                   7591.
                                                               2.9
## 7 Elementary
                          1
                                         1
                                               12
                                                      0.8
                                                               0
## 8 High
                                                1
                                                       0
                                                               0
                          1
                                         1
```

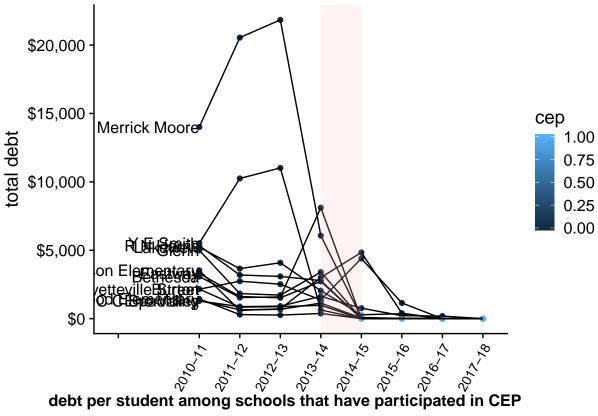
Last year, all but one of the CEP schools were elementary schools. We also see that no middle schools participated in the CEP program, but the six that were eligible & non-participating had the most debt per student—nearly twice that of eligible but non-participating elementary schools. Eligible and non-participating high-schools, however, had relatively low debt per student at just \$2.90 of unpaid meals per student. The overall debt for those schools was also fairly low.

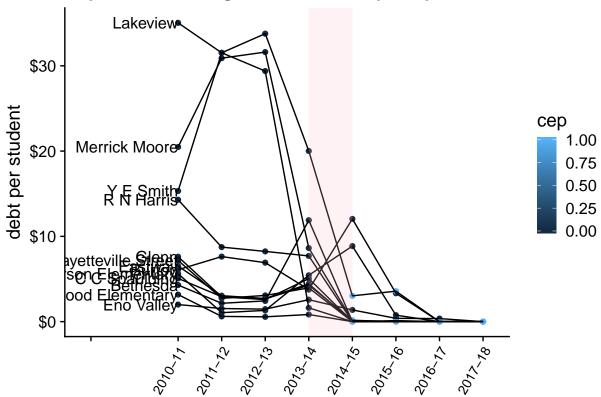












Percent Minority

CEP schools also have a higher concentration of minority students, on average.

Debt before CEP status

```
## # A tibble: 2 x 3
## cep_long mean_dps mean_debt
## <fct> <dbl> <dbl>
## 1 0 3.45 2297.
## 2 1 7.58 3039.
```

CEP schools also had, on average, higher debt and more debt per student than non-CEP schools prior to CEP assignments.

Individual school analysis

Neal Middle

```
##
        year
               unpaid debt_per_student
## 1 2010-11 9068.58
                             15.139533
## 2 2011-12 13574.29
                             22.072016
## 3 2012-13 13236.97
                             16.819530
## 4 2013-14 3114.71
                              3.531417
## 5 2014-15 3817.10
                              4.438488
## 6 2015-16 10325.43
                             13.187011
## 7 2016-17 14135.73
                             18.381964
## 8 2017-18 27121.24
                             35.314115
```

CEP vs. ISP comparison

```
## # A tibble: 19 x 3
## # Groups:
               school_name [19]
      school_name
##
                                  school_no
                                                  diff
##
      <fct>
                                       <int>
                                                  <dbl>
##
  1 Oak Grove
                                        360 14.5
## 2 Holt
                                        328
                                             12.8
## 3 Parkwood
                                        362
                                               1.44
## 4 Shepard
                                         338
                                               0.902
## 5 Carrington
                                        316
                                               0.849
  6 Hillandale
                                        324
                                               0.814
## 7 Hope Valley
                                        327
                                               0.761
## 8 Southern
                                         368
                                               0.0757
## 9 Githens
                                        366 -0.000883
                                        355 -1.35
## 10 Neal
## 11 Eno Valley
                                        315 -2.02
```

##	12	W G Pearson Elementary	388	-2.24
##	13	Burton	308	-2.68
##	14	Lowe's Grove	346	-3.29
##	15	Lucas	343	-4.20
##	16	Performance Learning Center	322	-4.27
##	17	Brogden	306	-6.92
##	18	Hillside	325	-7.93
##	19	Sandy Ridge	369	-15.3