

Relationship Between School Staffing and Student Suspensions, Referrals, and Arrests

Manuel V. Cano^{†,1}, Errol Kaylor^{†,1}, Havisha Khurana^{†,1}, Merly Klass^{†,1}, & Cassie N.
Malcom^{†,1}

¹ University of Oregon

Author Note

Department of Educational Policy, Methodology, and Leadership. College of Education

[†] All authors contributed equally to this work.

Abstract

School staffing choices impact student outcomes. Prior research has explored the association between novice teachers and law enforcement officers on students' disciplinary actions. This study uses publicly available data on schools from the 2017-18 Civil Rights Data Collection ($n = 97,632$). We had two research questions that aimed to answer how school staffing affects school climate. To study the relationship between novice teachers and student rates of suspensions, we used a 3-level hierarchical linear model (HLM) with schools nested within districts and districts nested within states. We also used a multiple regression with one continuous and two categorical predictors to find the association between law enforcement officials and student arrests and referrals. In both cases, the relationship was statistically significant even after controlling for characteristics. We also noted that males and Black students receive more disciplinary actions. Our results indicate that new teachers may benefit from additional classroom management training. In addition, alternative methods of encouraging proper student behavior should be considered.

Keywords: novice teachers, suspension, law enforcement officers, arrests and referrals, school staffing

Word count:

Relationship Between School Staffing and Student Suspensions, Referrals, and Arrests

[Sentence that gives an overview of the study] This research project will be conducted using High school, Middle school, and Elementary school level data from the [Civil Rights Data Collection (CRDC)] (<https://ocrdata.ed.gov/>), 2017-2018 data set.

0.1 Prior Literature

Previous research has shown that school staffing choices can have an impact on student outcomes. In particular, novice teachers and law enforcement officials located on school campuses may impact negatively the number of disciplinary actions taken with students of various subgroups. Often, poor classroom management by novice teachers leads to them sending more students to the school office for a form of disciplinary action (e.g., referrals, suspensions, and even arrests) (Williams, Johnson, Dangerfield-Persky, & Mayakis, 2020). Less research has been done on how law enforcement officials impact student disciplinary outcomes, but there have been some studies that suggest there are both benefits (i.e., deterring student to student assaults) and costs (i.e., more students reported for “non-serious violent crimes”) (James & McCallion, 2013).

The relationship between student disciplinary outcomes and number of new teachers has several potential mechanisms. In addition to poor classroom management, schools with a higher level of new teachers may lack in senior leadership, giving new teachers fewer opportunities to improve their teaching. Our study also looks for a similar relationship between law enforcement presence and student discipline, where higher LEO presence affects how students act and teachers respond.

0.2 Research Questions [update using presentaiton RQs]

Our team developed two research questions in order to determine if school staffing choices are related to student disciplinary outcomes.

RQ1. What is the relationship between school level rates of novice teachers and school level rates of student suspensions?

a. Descriptively, how do rates of exclusionary discipline differ by gender and race/ethnicity?

RQ2. What is the relationship between the number of full time equivalent (FTE) law enforcement officials (both law enforcement officers and security guards) and the total combined number of student referrals and arrests?

The rest of this document summarizes the methods, results, and ends with a discussion of each research question.

1 Methods

1.1 Sample and Exclusion Criteria

This analysis was conducted using publicly available data from the 2017-18 civil rights data collection. Each biennium, schools across the United States are required to respond and report key information about their school across a range of topics. This study uses the data in the following areas:

1. School Support (count of enrolled novice teachers, sworn law enforcement officers (LEOs), and security guards)

2. Referrals & Arrests (count of referrals and arrests of students by subgroup, which includes gender and disability status)
3. Suspensions and Expulsions (count of suspensions and expulsions of students by subgroup)
4. Enrollment (count of enrolled students by subgroup)
5. School characteristics (type: magnet, alternate, charter, and special education)
6. Data sets are organized by state, school district (LEA), and school level

The sample in this study included all K-12 schools across the United States. Overall, the 2017-18 civil rights data collection contains 97632 schools who serve 50511682 students in grades kindergarten (K) through 12th during the 2017-18 school year. For research question 1, schools that had missing enrollment information, such as missing counts of total enrollment or enrollment by race/ethnicity, were excluded from the analysis. Moreover, schools that did not report number of suspensions, referrals, arrests, number of novice teachers, were excluded from the analysis. For research question 1, the final sample included 95754 K-12 schools. For research question 2, school districts that had missing values for referrals and arrests had those values coded as NA and were excluded, leaving a final sample of 127,292 districts. Table 1 summarizes information on the study sample for both research questions.

Table 1. Descriptive information about the study sample

1.2 Outcome Measures and Predictors of Interest

The main predictor variable for research question one was the percent of teachers that are novice teachers at a school. A teacher was considered novice if they were in their first or second year of teaching. This variable was calculated by dividing the total FTE of novice teachers at a school by the total FTE of full time teachers. Across schools in our sample, the mean rate of novice teachers was 12.02, and the numbers ranged from 0 to 100. There was

Table 1

Table 1. Summary Statistics

Characteristic	**N = 96,853**
White Students Enrollment (%)	51 (33)
Hispanic Students Enrollment (%)	24 (28)
Black Students Enrollment (%)	15 (23)
Asian Students Enrollment (%)	3.8 (8.3)
Native American/Alaskan Students Enrollment (%)	1.72 (8.50)
Hawaiian and Pacific Islander Students Enrollment (%)	0.35 (2.27)
Two or more races Student Enrollment (%)	3.8 (4.2)
Students with Disability Status Enrollment (%)	15 (14)
Novice Teacher Enrolled (%)	12 (14)
Law Enforcement Officials	34 (26)
Suspension Rate	53 (101)
Expulsion Rate	1 (6)
Number of Arrest	1 (6)
Number of Referral	2 (11)

90 wide variation in the rate of novice teachers within and across states. In our sample, Florida
 91 had the highest rate of novice teachers while North Carolina had the lowest rate (see Figure
 92 1 in the appendix).

93 The main predictor of interest for research question two was the number of law
 94 enforcement officials (sworn law enforcement officers and security guards). This variable was
 95 calculated by summing the total FTE of sworn law enforcement officers and security guards
 96 to get a count.

97 The analysis had two outcomes of interest that broadly examined school climate â€”

one for each research question. For research question 1, the main outcome of interest was the rate of students who received a suspension. More specifically, this variable was defined as the number of suspended students per 1,000 students at a school. Across schools in our sample, the mean rate of suspensions was 98.55, and the numbers ranged from 0 to 10500. There was wide variation in the rate of suspensions across and within states. Utah had the lowest rate of suspensions while South Carolina had the highest rate of suspensions (see Figure 2 in the appendix).

For research question 2, the outcome measure of interest was the total number of disciplinary actions. The total number of disciplinary actions was determined by adding the number of student referrals and arrests for each district.

1.3 Analytic Approach

Descriptive statistics and regression analyses were used to answer the two research questions. To answer the first research question, we used a 3-level hierarchical linear model (HLM) with schools nested within districts and districts nested within states. The final model is represented by the following sets of equations.

$$Y_{jks} = \pi_{0ks} + X_j + \pi_{1ks} * \text{noviceteachers} + \varepsilon_{jks}$$

$$\pi_{ks} = \beta_{00s} + r_{0jk}$$

$$\pi_{1ks} = \beta_{01s} + r_{1jk}$$

$$\beta_{00s} = \gamma_{000} + \mu_{00k}$$

$$\beta_{01s} = \gamma_{100}$$

Where the outcome (Y) of school (j) in district (k) in state (s) is predicted by a set of school level enrollment covariates (X_j) and a school level rate of novice teachers. This model allows the intercept to vary by district and school and also includes a random slope for the rate of novice teachers across districts. The $\hat{\beta}_{100}$ coefficient represents the relationship between school level rate of novice teachers and study outcomes and addresses the first research question. This model was selected through a model comparison test that compared this 3 level HLM to other model specifications and was found to be the best performing model (based on the AIC score).

To answer the second research question, we used a multiple regression with one continuous and two categorical predictors. The continuous predictor was total number of law enforcement officials and the categorical variables included gender and disability status. Gender was coded so that **female** was 0 and disability status was coded so that students **with** a disability were 0.

2 Results

2.1 Research Question 1 - Rates of Novice Teachers and Suspensions

Rates of novice teachers was positively and statistically significantly associated with higher rates of suspensions. Across schools in the United States, the model estimated average rate of suspension was 104 students per 1000 students at typical schools (e.g. not an alternative, charter, or magnet school) with average rates of total enrollment and average rates of enrollment by race/ethnicity, EL students, and special education enrollment. A one percentage point increase in the rate of novice teachers increased the number of students suspended per 1000 students by 1 (see table 1 in the appendix). Similar estimates were found across model specifications including a simpler HLM model with no added covariates and a 3 level random intercept and slopes model with interactions between rates of novice

teachers and rate of black and special education students.

Table 2

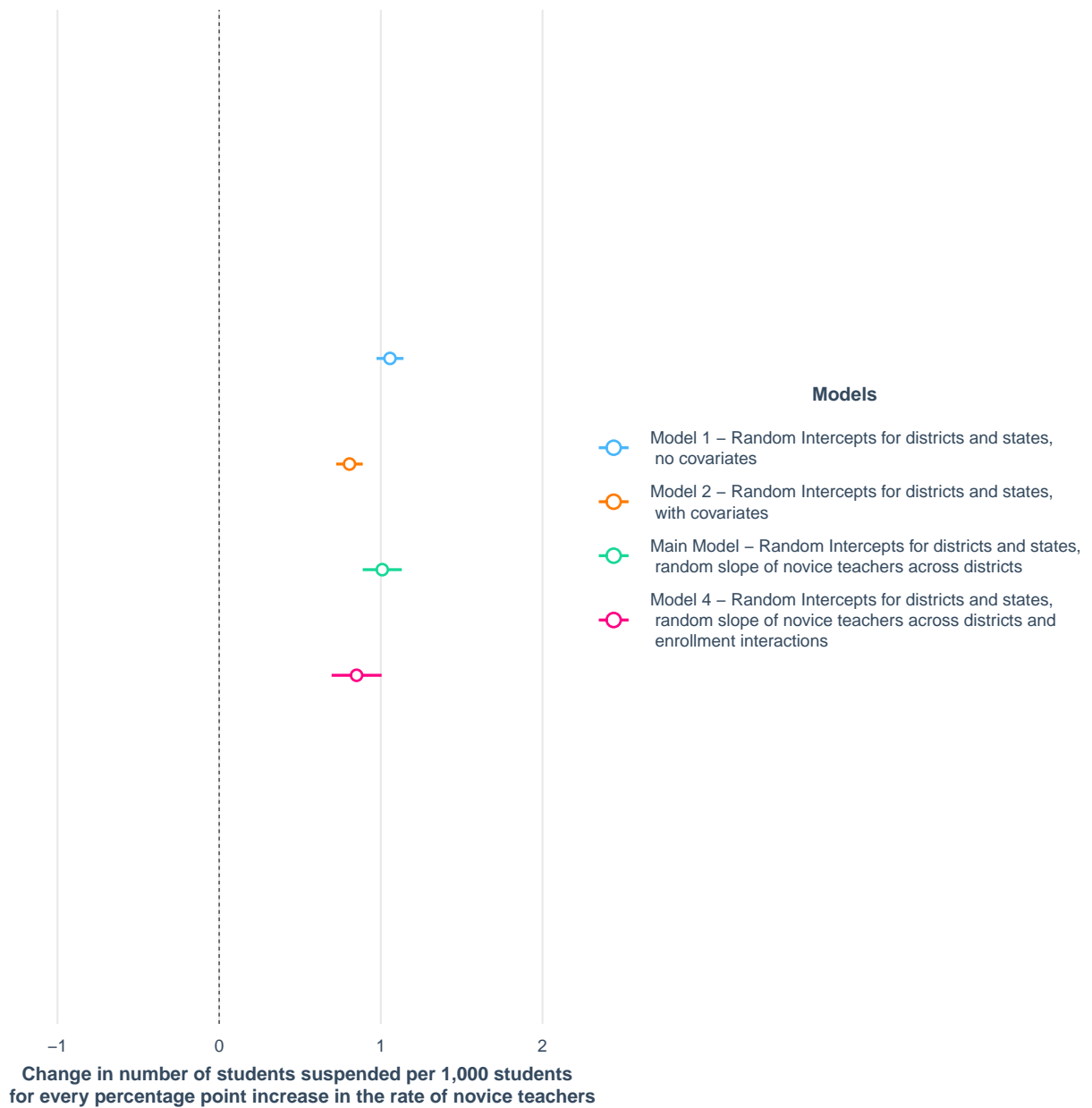
Comparison of Model Performance Indices

		R2	R2			AIC	BIC	Performance-
Name	Model	(cond.)	(marg.)	ICC	RMSE Sigma	weights	weights	Score
rq1_m2	merMod	0.55	0.10	0.50	144.52	148.56	0.999	1.000
rq1_m3	merMod	0.54	0.10	0.49	144.54	148.58	0.001	< 0.001
rq1_m1	merMod	0.24	0.16	0.10	148.88	151.77	< 0.001	< 0.001
rq1_m0	merMod	0.14	7.12e-	0.14	157.65	160.99	< 0.001	< 0.001
			03					

Figure 1. Estimated relationship between rate of novice teachers and student suspension rates across model specification

```
results <- plot_coefs(rq1_m0,rq1_m1,rq1_m2,rq1_m3, coefs = c(" " = "pct_new_teachers_c")
  model.names = c("Model 1 - Random Intercepts for districts and states,\n\ no
    "Main Model - Random Intercepts for districts and states, \n\ rand
    "Model 4 - Random Intercepts for districts and states, \n\ random
  legend.title = "Models",
  ci.level = .5,
  robust = FALSE,
  point.shape = FALSE)

results + labs(x = "Change in number of students suspended per 1,000 students \n\ for ev
```

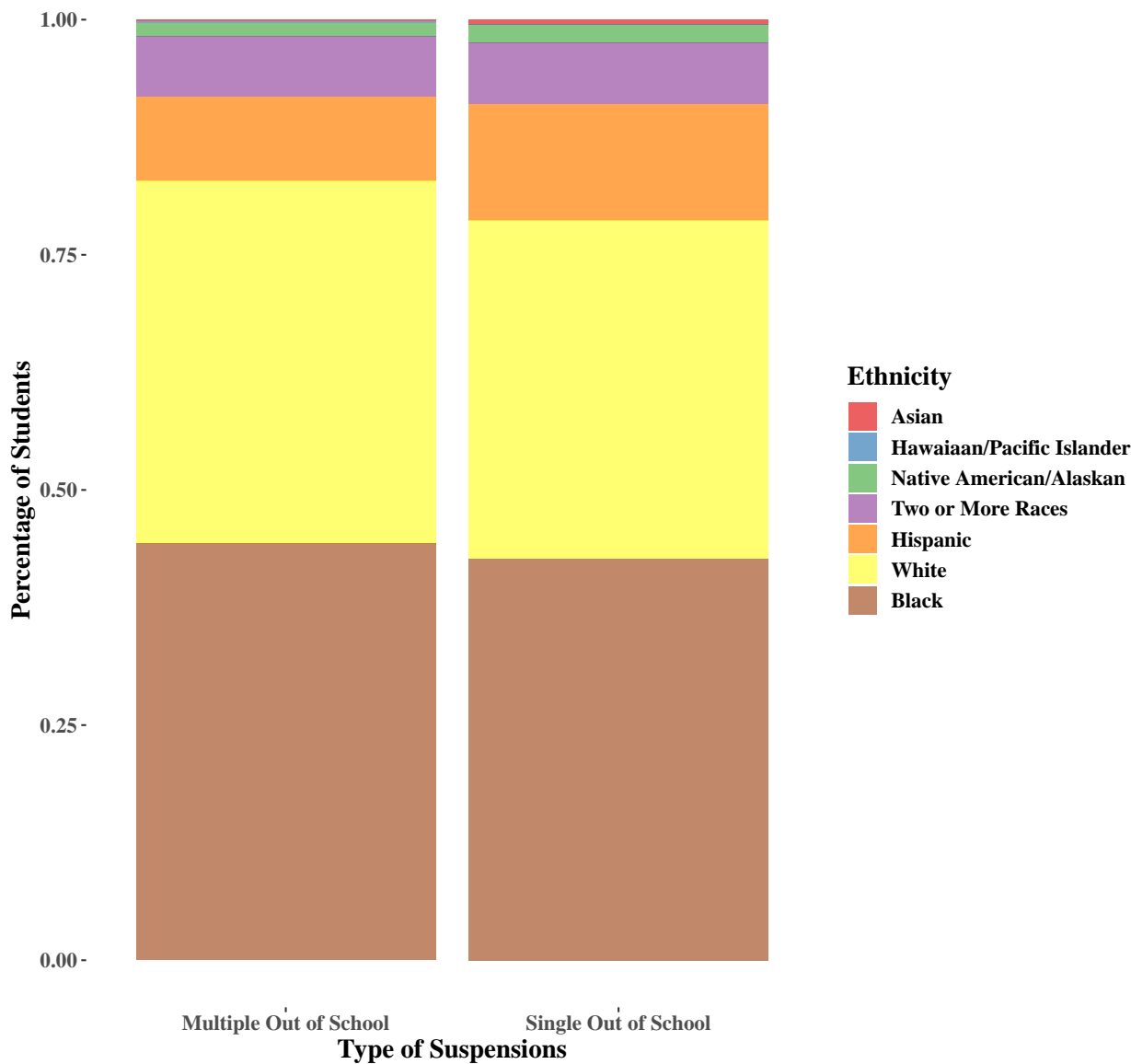


2.2 Research Question 1 - Descriptive Results

Figure 2 and figure 3 about Suspensions rate by Ethnicity in Preschool and K-12 show that **Black Students** were suspended more compared to their peers in Preschool and K-12. In Figure 4 and Figure 5 when gender was included, both **Black Male** and **Black Female** students were suspended more compared to their peers in Preschool and K-12. Overall,

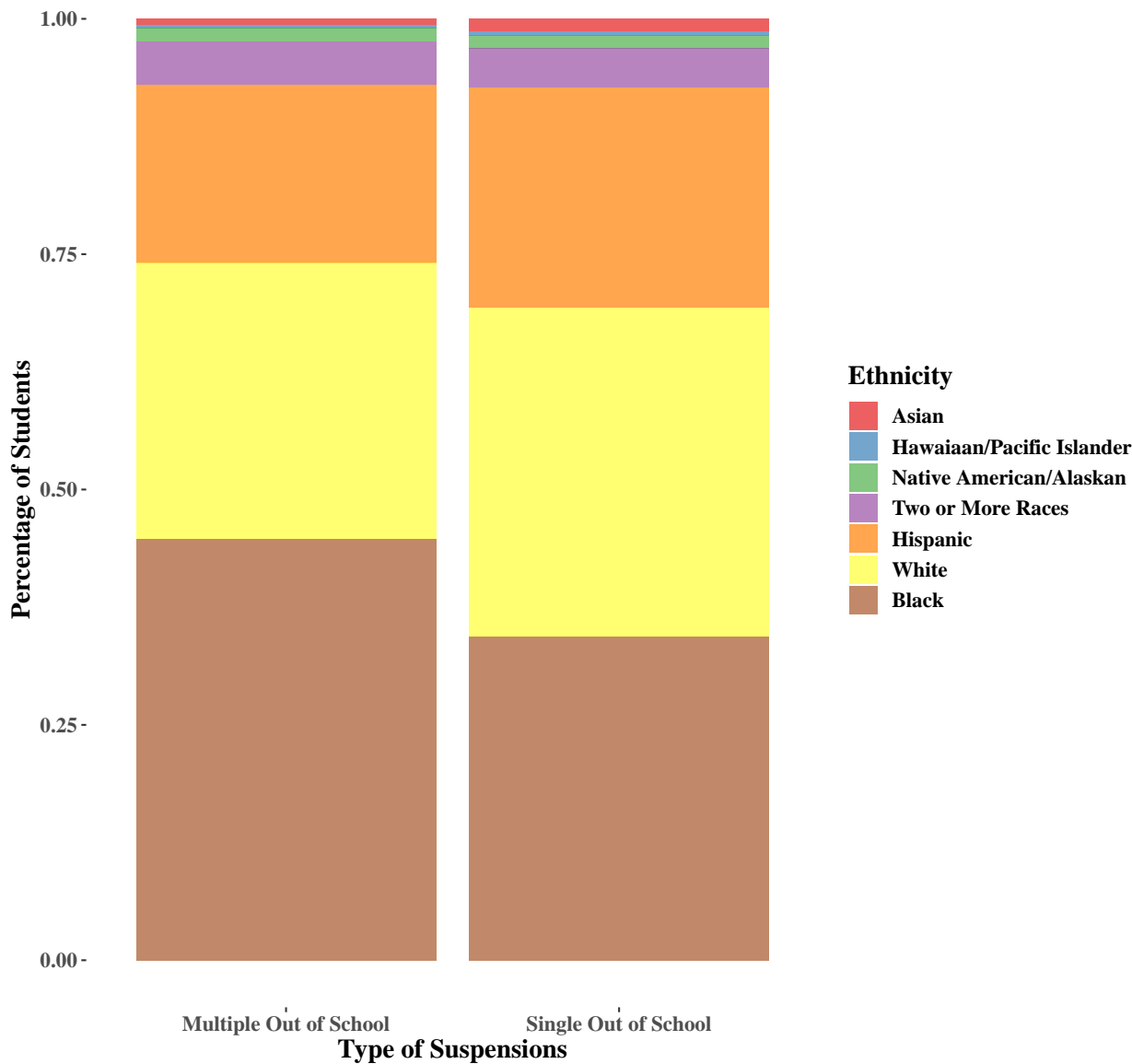
Male students were suspended more than female students across all school level.

2.2.1 Suspension rate by ethnicity in preschool.
Figure 2. Suspension Rate by Ethnicity in Preschool



152

2.2.2 Suspension rate by Ethnicity in k12.
Figure 3. Suspension Rate by Ethnicity in K12

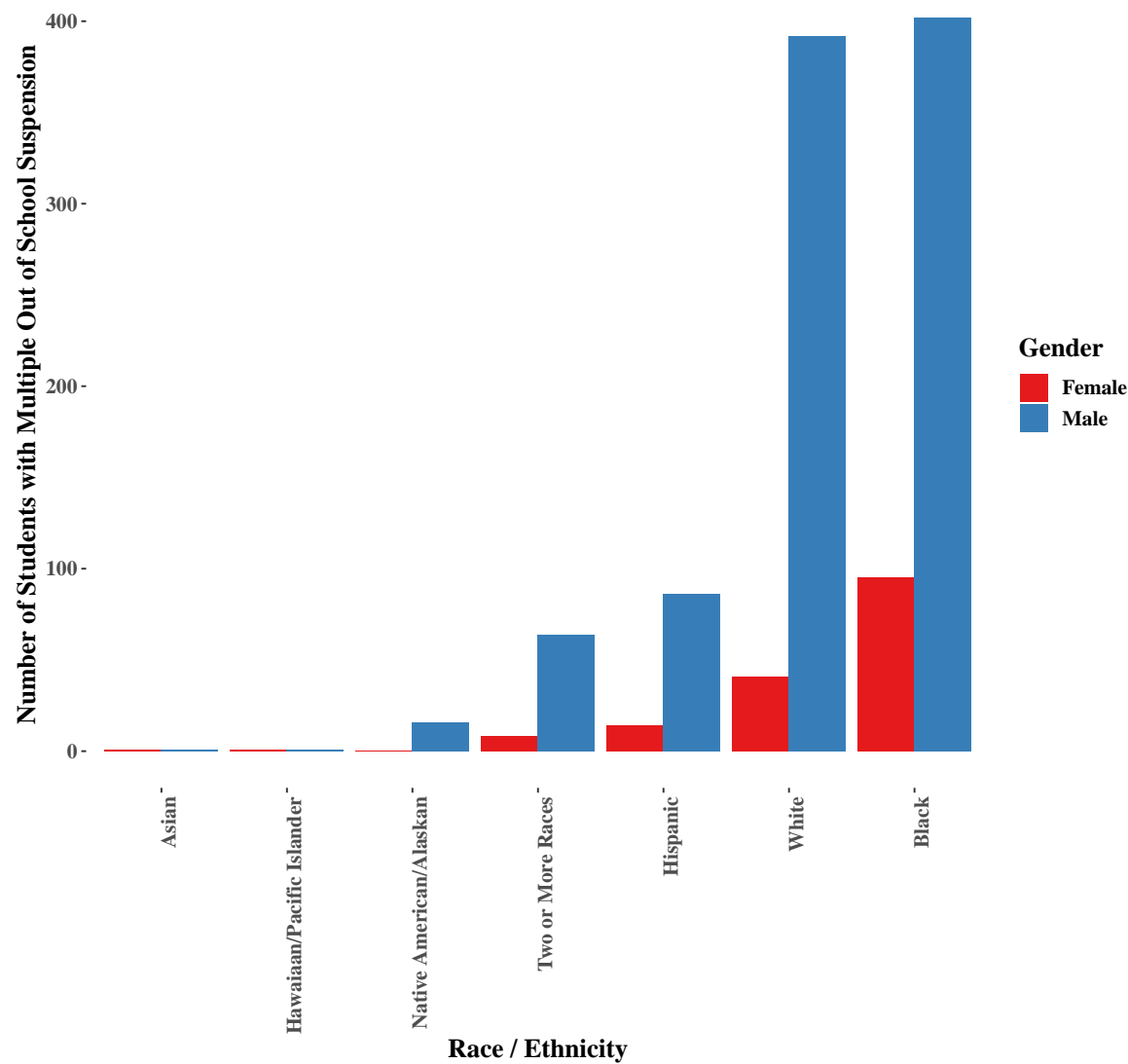


153

154

- Multiple Out of school suspension rate by gender and race for preschool students

Figure 4. Multiple Out-of-school Suspension by Ethnicity & Gender in Presch

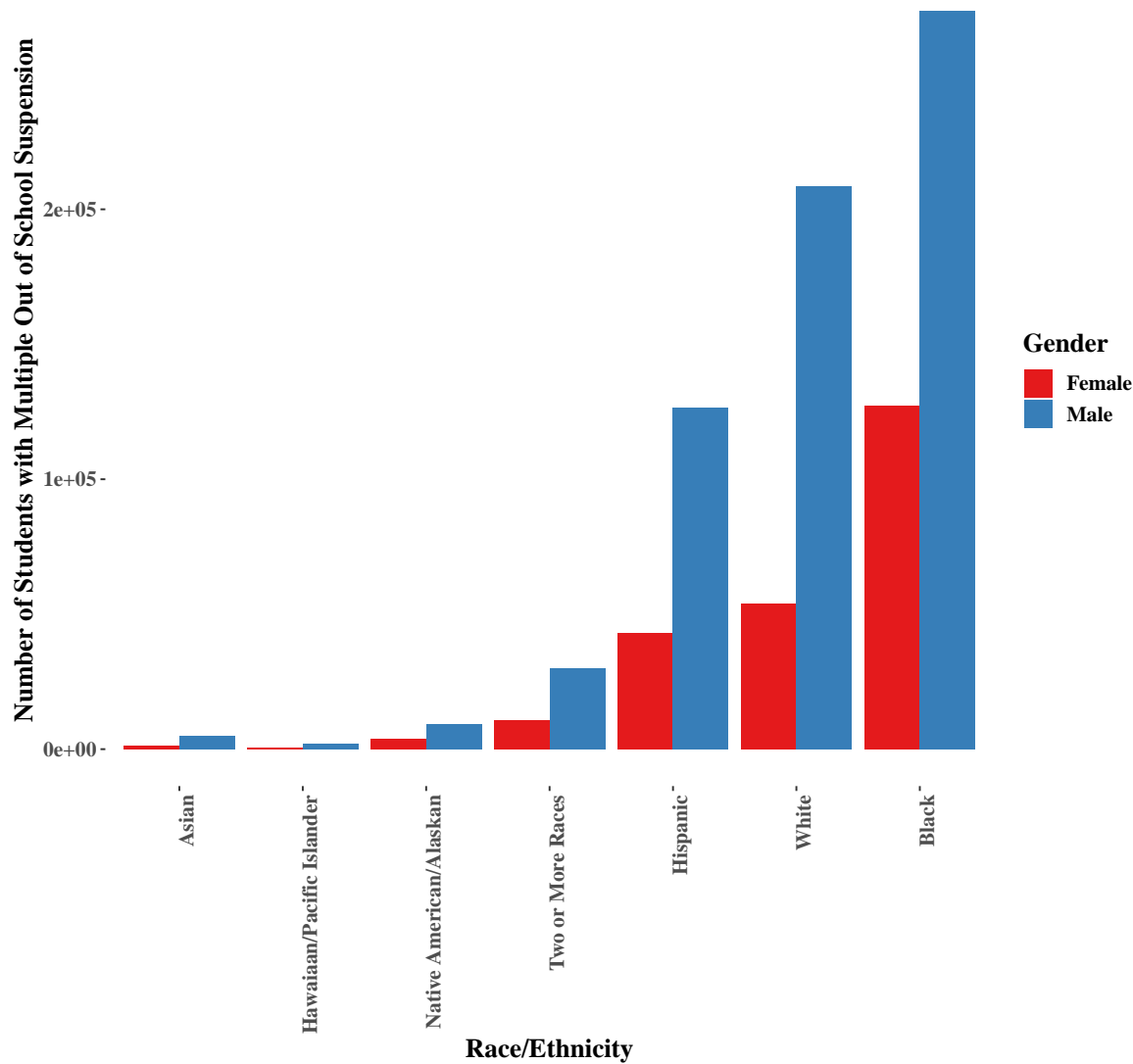


155

156

- Multiple Out of school suspension rate by gender and race for k12 students

Figure 5. Multiple Out-of-school Suspension by Ethnicity & Gender in K12



157

158 2.3 Research Question 2 - Descriptive Results

159 Figure X dis-
160 plays the total number of student arrests and referrals per state broken down by student gender.

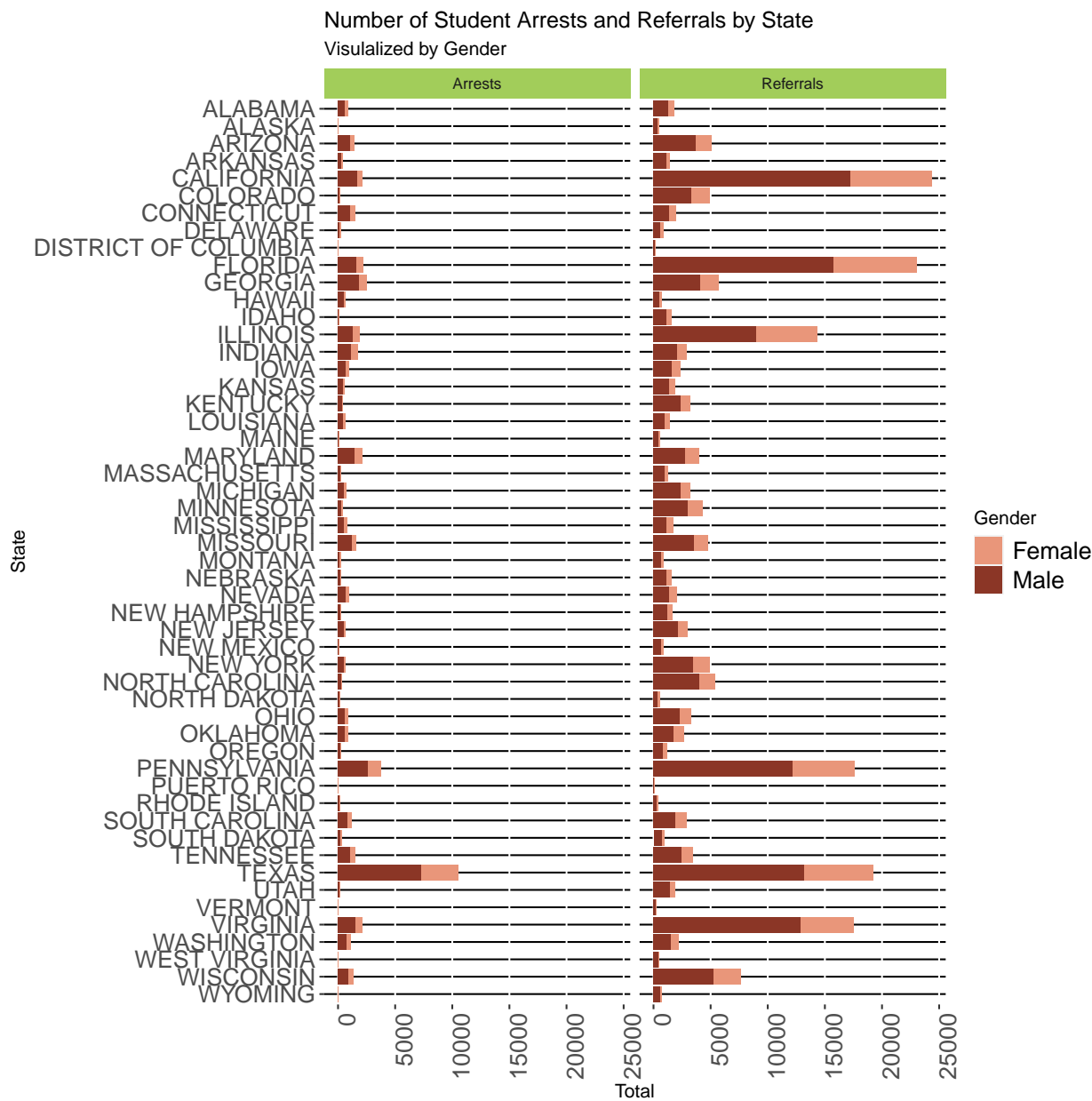
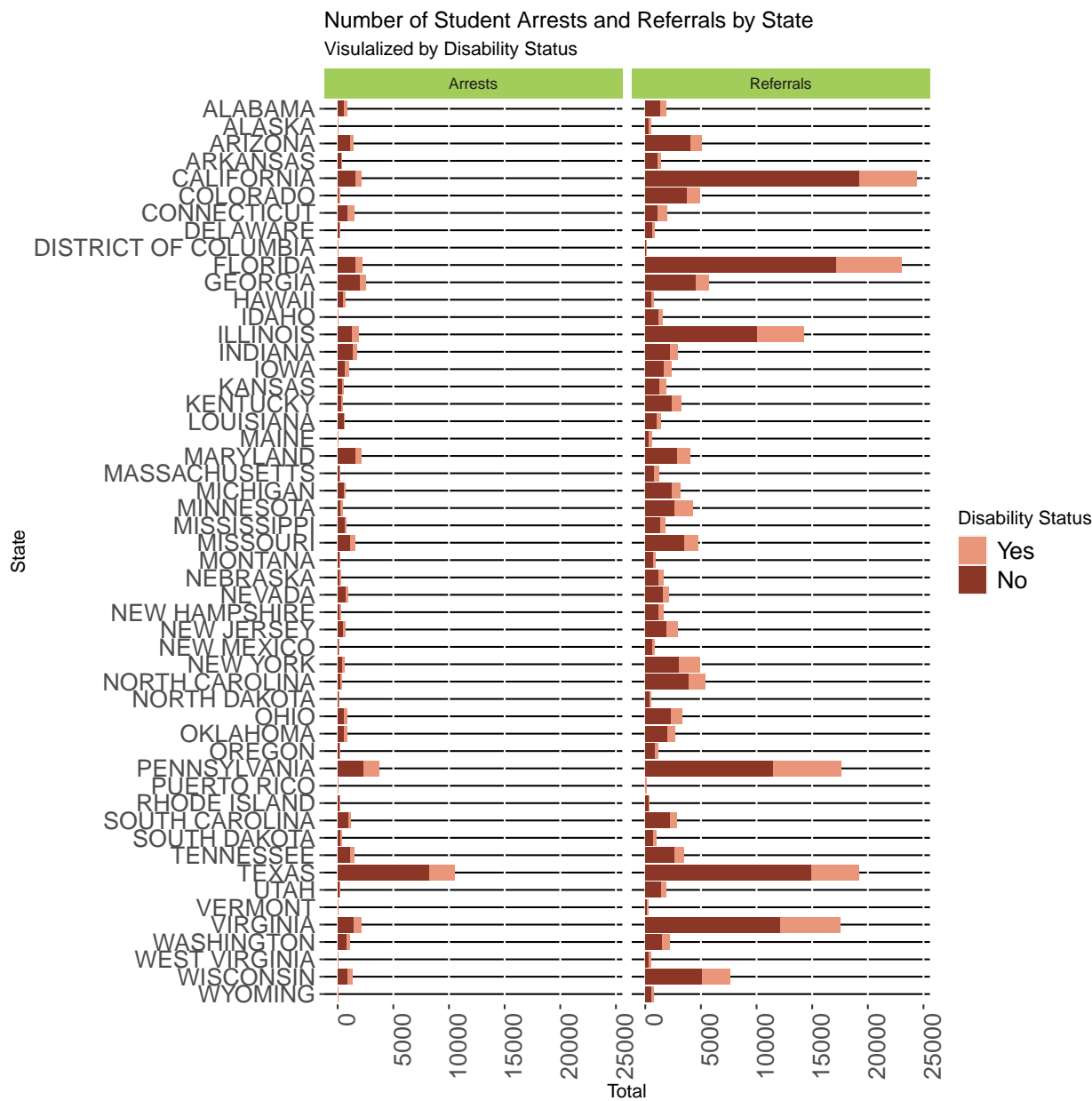


Figure X displays the total number of student arrests and referrals per state broken down by student disability status.



- Create a similar graph with total law enforcement officials

Table X shows descriptive statistics for the subset of data used in RQ2.

##	vars	n	mean	sd	median	trimmed	mad	min	max	range	skew
## total_law	1	140824	3.01	21.26	0.0	0.70	0.00	0	1729.55	1729.55	49.58
## status*	2	140824	1.50	0.50	1.5	1.50	0.74	1	2.00	1.00	0.00
## dis_act*	3	140824	1.50	0.50	1.5	1.50	0.74	1	2.00	1.00	0.00


```

171 ## gender*      4 140824 1.50  0.50    1.5    1.50 0.74    1    2.00    1.00  0.00
172 ## tot_st       5 127292 1.21 14.16    0.0    0.06 0.00    0 2620.00 2620.00 90.78
173 ##              kurtosis    se
174 ## total_law    3457.29 0.06
175 ## status*      -2.00 0.00
176 ## dis_act*     -2.00 0.00
177 ## gender*      -2.00 0.00
178 ## tot_st       12925.71 0.04

```

2.4 Research Question 2 - Relationship Between the Total Number of Law Enforcement Officials and Total Number of Student Disciplinary Actions

As shown in Table X, for every one unit increase in FTE law enforcement officials the number of student disciplinary actions increase by 0.23. After adjusting for student gender and disability status the number of students with disciplinary actions between male and female students remained significant, $\hat{\beta}_2 = 1.01$, $SE(\hat{\beta}_2) = 0.08$, $t(127288) = 12.92$, $p < 0.001$. The model indicated that the male students had 1.01 more disciplinary actions. The model also indicated that after adjusting for student gender and disability status the number of students with disciplinary actions between students with and without a disability remained significant, $\hat{\beta}_3 = 1.14$, $SE(\hat{\beta}_3) = 0.08$, $t(127288) = 14.57$, $p < 0.001$. This model explained 3.4% of the variance.

Anova Table (Type III tests)

##

Response: tot_st

##	Sum Sq	Df	F value	Pr(>F)
## (Intercept)	4841	1	24.987	5.78e-07 ***
## total_law	789488	1	4074.680	< 2.2e-16 ***

```

196 ## gender          32362      1  167.027 < 2.2e-16 ***
197 ## status          41103      1  212.139 < 2.2e-16 ***
198 ## Residuals      24662634 127288
199 ## ---
200 ## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

201 ##
202 ## Call:
203 ## lm(formula = tot_st ~ 1 + total_low + gender + status, data = ra_tidy4)
204 ##
205 ## Residuals:
206 ##      Min       1Q   Median       3Q      Max
207 ## -156.11   -1.60    -0.80     0.33  2575.20
208 ##
209 ## Coefficients:
210 ##              Estimate Std. Error t value Pr(>|t|)
211 ## (Intercept) -0.339893   0.067997  -4.999 5.78e-07 ***
212 ## total_low    0.232670   0.003645  63.833 < 2e-16 ***
213 ## genderm      1.008437   0.078029  12.924 < 2e-16 ***
214 ## statuswdis   1.136492   0.078029  14.565 < 2e-16 ***
215 ## ---
216 ## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
217 ##
218 ## Residual standard error: 13.92 on 127288 degrees of freedom
219 ## (13532 observations deleted due to missingness)
220 ## Multiple R-squared:  0.03381,    Adjusted R-squared:  0.03378
221 ## F-statistic:  1485 on 3 and 127288 DF,  p-value: < 2.2e-16

```

222 Table X shows the results of the regression analysis for RQ2.

223

224 tot st

225 Predictors

226 Estimates

227 CI

228 p

229 (Intercept)

230 -0.34

231 -0.47 – -0.21

232 <0.001

233 total law

234 0.23

235 0.23 – 0.24

236 <0.001

237 gender [m]

238 1.01

239 0.86 – 1.16

<0.001

status [wodis]

1.14

0.98 – 1.29

<0.001

Observations

127292

R2 / R2 adjusted

0.034 / 0.034

3 Discussion

The present study aimed to 1.) identify relationships between novice teachers and student suspension rates, and 2.) law enforcement official concentration and referrals and arrests. Both of these relationships were then investigated for any moderating student demographics.

3.1 New Teachers and Suspensions

Our analysis shows a meaningful relationship between presence of new teachers and student discipline, where more new teachers correlate with more disciplinary actions. ERROL ADD line on gender, race, etc. Our results indicate that new teachers may benefit from additional classroom management training, or for administrators to schedule classroom management trainings when large numbers of new teachers are hired at the same time.

3.2 Law Enforcement Officials and Expulsions/Referrals

The significant relationship between LEO presence and Referral/Arrest Rates may suggest that administrators look for alternative methods of encouraging proper student behavior. ERROL ADD Gender race note.

3.3 Limitations and Future Research

The current study has some shortcomings in regards to applicability of our findings - the school level data does not give a total count of suspensions, only the number of students who had suspensions during the study time. As this data does not break down to specific classrooms, we cannot validate whether more suspensions are happening in classrooms with new teachers specifically. Additionally, our analyses do not examine LEO presence as a proportion of total school staff, but rather as a simple count. Additionally, our analyses includes Juvenile Justice facilities, which tend to have much higher concentrations of law enforcement officers than traditional public schools. A future analysis would benefit from analyzing these two groups separately, as well as investigating the cross-section of schools with high LEO presence and novice teacher percent.

4 References

- James, N., & McCallion, G. (2013). School resource officers: Law enforcement officers in schools. Congressional Research Service Washington, DC.
- Williams, J. A., Johnson, J. N., Dangerfield-Persky, F., & Mayakis, C. G. (2020). Does employing more novice teachers predict higher suspensions for black students? A hierarchical multiple regression analysis. *The Journal of Negro Education*, 89(4), 448–458.