

Is there any difference or bias of stripsearch in terms of race when being arrested?

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INF2178: Experimental Design for Data Science

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1. Introduction

Strip search is a controversial police practice that involves an official performing intimate person search and inspecting their personal effects and body cavities. Thus, this type of search method is often seen as more intrusive than other types of searches, and their usage is normally restricted to circumstances in which there is a reasonable suspicion that the suspect is hiding contraband on their person. Though strip search is legalized in different nations and regions, it is still widely considered traumatic, unnecessary, and ineffective, particularly when performed on individuals who have not been convicted of a crime. Despite the constraints and limitations of using strip search practices, it is still evident that this method may be used disproportionately that affects certain race groups, specifically the black ethnicity.

According to Lemke (Lemke, 2022), black people make up around 10 percent of the City of Toronto's population and nearly one in three of the people who were strip-searched were black. Studies found that strip searches can also leave a long-term impact on the mental health of those who have undergone them, feelings like ashamed, humiliation, and anger often arise after searching. In addition, an article by Phan (2021) underscores the fact that Black individuals are more likely to experience prejudice in arrest due to their affiliation with street culture. They tend to be overrepresented in drug-related and economic cases, mainly because of poverty. Besides, Piquero and Brame also state that except for poverty, inequity and lack of opportunity, Black culture, which has close relationship with violence and drugs also prompts Black crime rate in the neighborhood (Piquero & Brame, 2008).

In the past 20 years, courts and agencies were trying to regulate how police perform strip searches in order to reduce the overall frequency of it since people often feel traumatic after being searched (Lemke, 2022). The supreme court has recognized this issue and stated that it is "likely to represent a disproportionate number of those who are arrested by police and subjected to personal searches, including strip searches" with the absence of statistics (Lemke, 2022).

1.1 Objective

It is quite clear that little research has been conducted on the relationship between the black race, occurrence categories, arrests and strip searches. This report aims to fill the gap in these areas by exploring factors that may be related to the disproportionate impact of strip searches on perceived race occurrence categories, especially on black individuals.

1.2 Methodology

This study will use secondary quantitative data obtained from Toronto Public Services which is considered official police records to explore the relationships between race, occurrence category, strip searches when at arrests. Tests will be used in this study including T-test, Power Analysis and ANCOVA test. A logistic regression model will be used to estimate the probability of being strip searched considering the predictors of perceived race, sex, and occurrence categories to verify the related research questions.

1.3 Research Question

The main research question of this study is that Is there any difference or bias of stripsearch in terms of race when being arrested? In addition to the main research question, the following sub-questions will also be discussed:

- Do Black individuals be treated differently when arrested with strip search practices compared to other races, particularly white and East/South Asian ethics?
- Is there a significant difference in means of the number of strip searches across different occurrence categories, controlling the total arrested number ?
- Are there associations between perceived race, strip search and occurrence category?

2. Literature Review

Discrimination against Black people during the arrest, strip search, and booking process is a significant problem that has been extensively studied by scholars and practitioners. This literature review analyzes three sources to provide key insights into the issue: a legal resource from FindLaw, a research paper from the National Institutes of Health, and a report from the Sentencing Project.

FindLaw's article states that strip searches are typically conducted on people being arrested and taken to jail to prevent the introduction of contraband. However, they can also be a form of humiliation or punishment, particularly for people arrested for minor offenses. The article notes that Black people are disproportionately affected by these types of searches and may be subject to racial profiling by law enforcement officers. Furthermore, according to the Kruse Law, a strip search should be deemed necessary to check for weapons or evidence to ensure a lawful arrest, but there should be reasonable and probable grounds to justify both the search and the arrest (Kruse Law Firm, n.d.).

The National Institutes of Health's research paper explores the impact of race-based data collection in the criminal justice system. The authors argue that Black people are overrepresented in the criminal justice system as victims and defendants due to systemic racism and discriminatory practices, such as racial profiling. The paper also highlights that Black people are more likely to receive bias on assault due to their street culture, have higher proportions in drug-related and robbery/theft cases because of poverty and low income, and more likely to have mental health issues and behaviors when arrested or searched (Phan, 2021). The consequences of discrimination include higher rates of arrest and incarceration, harsher sentences, and trauma from degrading treatment.

The Sentencing Project's report to the United Nations on racial disparities in the criminal justice system provides further evidence of the discrimination faced by Black people. The report highlights that Black people are more likely to be arrested and incarcerated than white people, even when they have committed the same crime, due to the prevalence of racial bias in the criminal justice system. The report also discusses the negative impact of strip searches on Black people as traumatizing, humiliating, and a form of punishment (Interactive, 2022).

Piquero and Brame's *Assessing the Race–Crime and Ethnicity–Crime Relationship in a Sample of Serious Adolescent Delinquents* argues that black people's street culture, which encompasses

attitudes and behaviors related to violence, respect, and masculinity, may influence the likelihood of engaging in criminal behavior. Except for factors, such as poverty, lack of opportunities, and racism, the street culture can promote criminal behavior by emphasizing aggression and a willingness to use violence to maintain respect and status. In addition, the authors also suggest that street culture may play a role in shaping the behavior of some Black youth in inner-city neighborhoods, but that this relationship is complex and influenced by a range of contextual factors (Piquero & Brame, 2008).

In summary, the literature on this topic suggests that Black people are subjected to discrimination and mistreatment during the arrest and booking process, including strip searches. This discrimination stems from poverty, lack of opportunities, racism, and the street culture of Black communities. Therefore, we will first verify if the arrest system is fair and just for all people, regardless of race and then focus on occurrence categories related to Black people's violence street culture and conduct further research to verify if the street culture is associated with criminal behavior and rates.

3. EDA

We first conducted Exploratory data analysis to figure out relationships among exploratory variables and detect any mistakes to help us select appropriate models for the next step.

3.1 Descriptive Statistics

Table 1. *The counts for categories of Sex, Perceived Race, Strip Search, and Occurrence Category.*

| Variables | Categories | Counts |
|---------------------|---|--------|
| Sex | M | 52502 |
| | F | 12576 |
| | U | 9 |
| Perceived_Race | White | 27635 |
| | Black | 17487 |
| | Unknown or Legacy | 5044 |
| | East/Southeast Asian | 4402 |
| | South Asian | 3603 |
| | Middle-Eastern | 3227 |
| | Indigenous | 1926 |
| | Latino | 1759 |
| StripSearch | 0 | 57287 |
| | 1 | 7800 |
| Occurrence_Category | Assault | 7724 |
| | Assault & Other crimes against persons | 7234 |
| | Robbery & Theft | 4580 |
| | Robbery/Theft | 3753 |
| | Warrant | 4378 |
| | FTA/FTC/Compliance Check/Parollee | 4246 |
| | FTA/FTC, Compliance Check & Parollee | 3877 |
| | Police Category - Administrative | 3885 |
| | Drug Related | 2751 |
| | Other Statute | 944 |
| | Other Statute & Other Incident Type | 2339 |
| | Vehicle Related | 768 |
| | Vehicle Related (inc. Impaired) | 1977 |
| | Other Offence | 1972 |
| | Mischief & Fraud | 1732 |
| | Mischief | 1321 |
| | Impaired | 1362 |
| | Harassment/Threatening | 1346 |
| | Harassment & Threatening | 1268 |
| | Weapons | 1106 |
| | Weapons & Homicide | 1105 |
| | Break & Enter | 1784 |
| | Sexual Related Crime | 839 |
| | Sexual Related Crimes & Crimes Against Children | 793 |
| | LLA | 586 |
| | Police Category - Incident | 562 |
| | Fraud | 474 |
| | Mental Health | 239 |
| | Homicide | 73 |
| | Crimes against Children | 69 |

Figure 1. *Line Graph Of Total Amount of Strip Searches in Arrest Location*

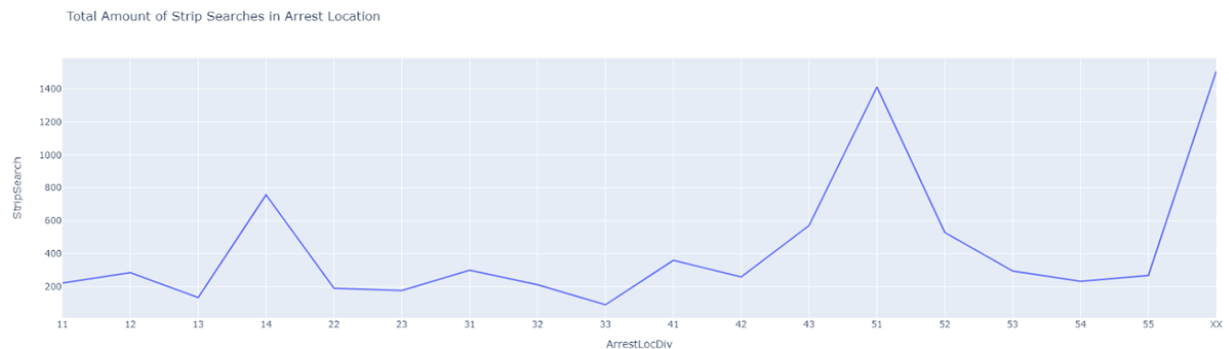


Figure 1 helps us to tell the trend of Strip Search happening in different Arrest Locations. Generally, different divisions have similar amounts of strip searches. The Division XX (the location is not geo-coded or the arrest took place outside of City of Toronto boundaries in other jurisdictions) has the highest strip search of 1500 cases. The Division 51 also has high strip searches of 1400 cases, and the Division 14 has obvious high strip searches of nearly 800 cases. The Division 33 has the lowest high strip search of 100 cases.

Figure 2. *Line Graph Of Total Amount of Strip Searches in Occurrence Category*

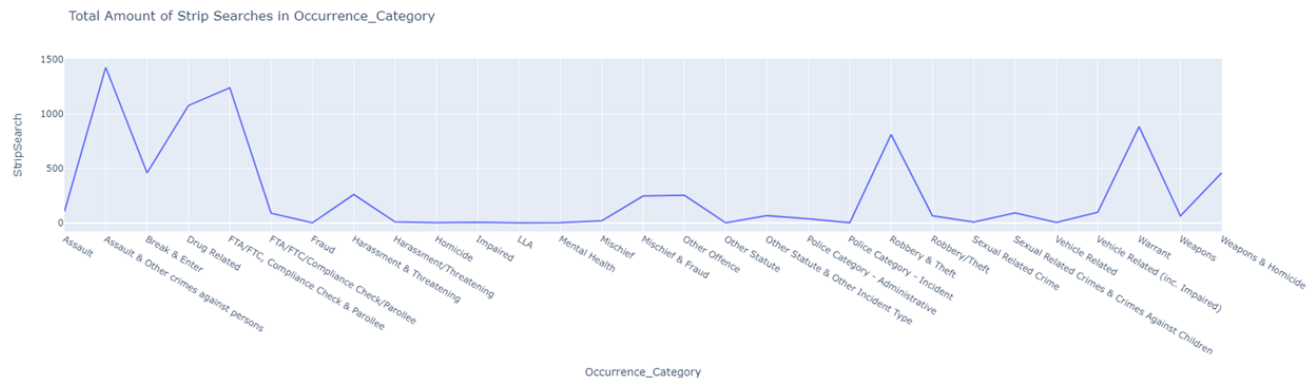


Figure 2 shows the trend of Strip Search happening on various Occurrence Categories. Most occurrence categories have low strip searches. The Assault & Other crimes against persons have highest strip search happenings of nearly 1500. The FTA/ FTC, Compliance Check & Parollee has the second highest strip searches of 1300. The Drug Related also has high strip search happenings of 1000. Then the Robbery & Theft and Warrant has an obvious peak of strip searches of nearly 800. This Line Graph helps us to figure out the high level occurrence category among all categories to conduct further analysis for the following steps.

Figure 3. *Barplot Of Race vs. Strip Search*

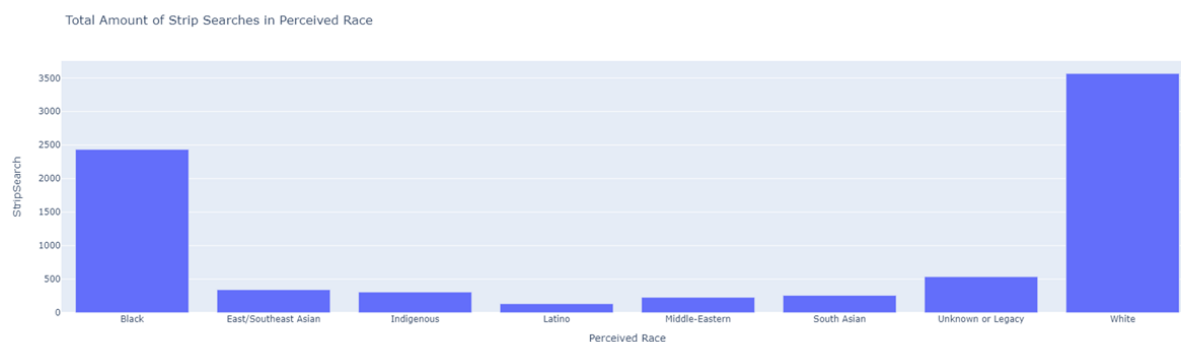
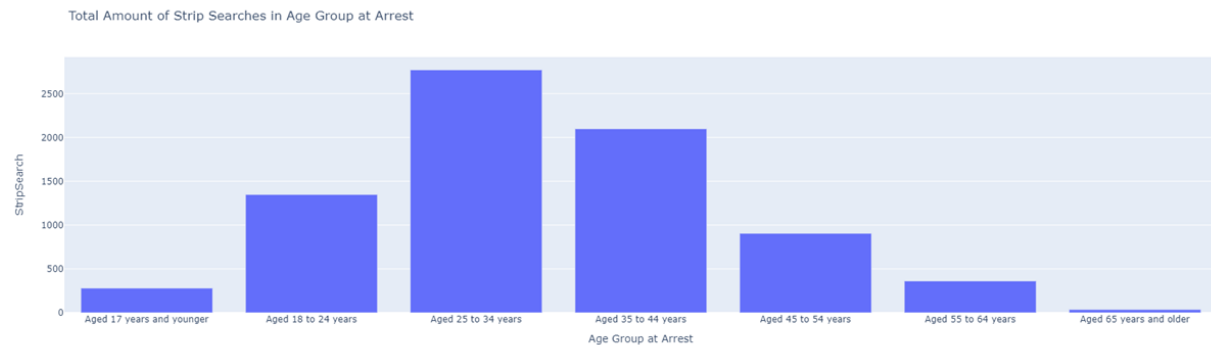


Figure 3 compares the strip search amount between each perceived race group. The White people have the highest strip search amount of 3500. The Black people have the second highest strip search of nearly 2500. In general, race groups except Black and White have average strip searches. We might conduct further analysis focusing on only Black and White groups.

Figure 4. *Barplot Of Age Group at Arrest vs. Strip Search*



We can compare the strip search amounts between each Age Group at Arrest by Figure 4. Aged 25 to 34 years people have the highest strip searches of nearly 2800. Aged 35 to 44 years people have the second highest strip searches of nearly 2100. Aged 65 years and older has the lowest strip searches. Strip searches mainly concentrate in the young and middle-aged people, aged 25 to 44 years.

Figure 5. *Histogram Of Total Amount Of Strip Searches In Perceived Race With Different Age Groups At Arrest*

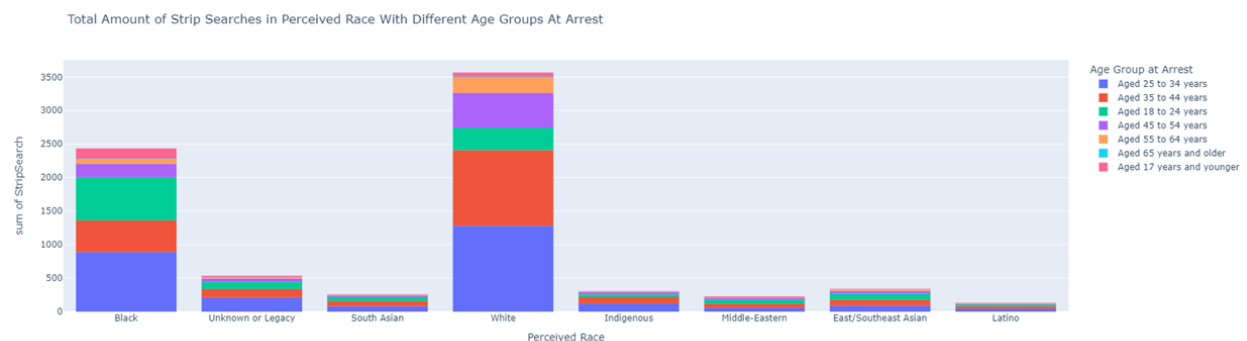
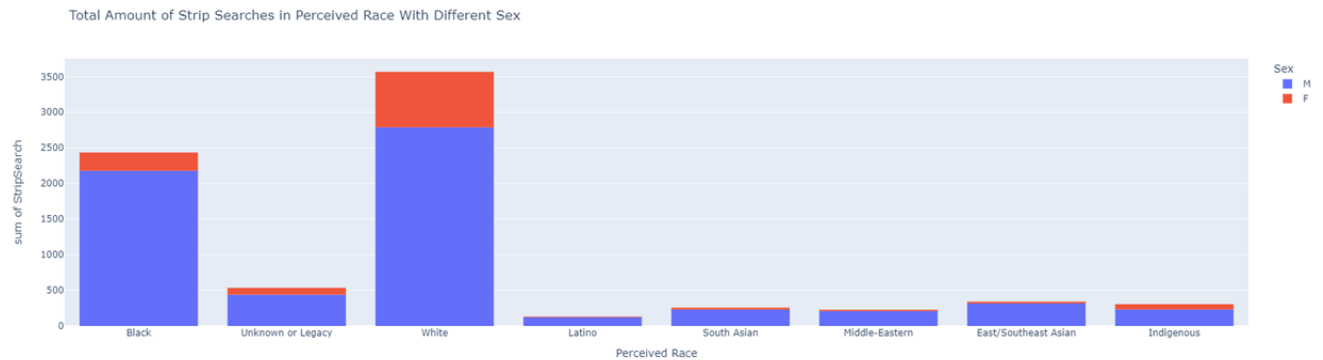


Figure 5 compares the distribution of strip searches of perceived race groups with different Age groups at arrest within each race. Aged 18 to 24 years, Aged 25 to 34 years, and Aged 35 to 44 years occupy the majority of strip searches within each race group. Black people have the highest juvenile strip searches, Aged 17 years and younger. Indigenous have the highest elderly crime, Aged 65 years and older. Although Black people have lower strip searches than White people, Black Aged 18 to 24 years people have higher strip searches than White Aged 18 to 24 years. Black people are committing crimes at a younger age.

Figure 6. *Histogram Of Total Amount Of Strip Searches In Perceived Race With Different Sex*



We can compare the distribution of strip searches among different perceived race groups with sex from Figure 6. The majority of strip searches for each race group are male, but White people have higher female strip searches. Black females have the second highest strip searches.

Figure 7. *Histogram Of Total Amount Of Strip Searches In Perceived Race With Different Occurrence Category*

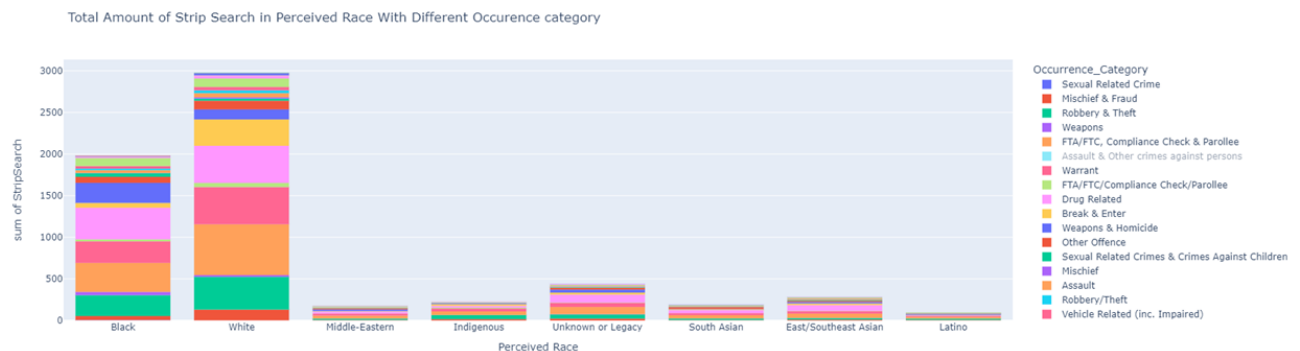


Figure 7. shows the distribution of strip searches among different perceived race groups within different occurrence categories. Drug Related, Warrant, Robbery & Theft, FTA/FTC, Compliance Check & Parolee, and Robbery & Theft occupy the majority of strip searches for almost all race groups. Weapons & Homicide and Drug Related occupy a higher proportion in Black people than other groups.

Figure 8. *Sub-Barplots Of Difference Actions At Arrest*

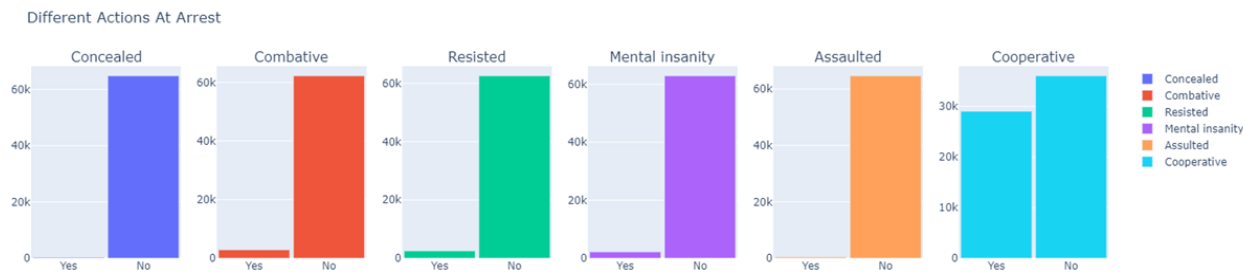
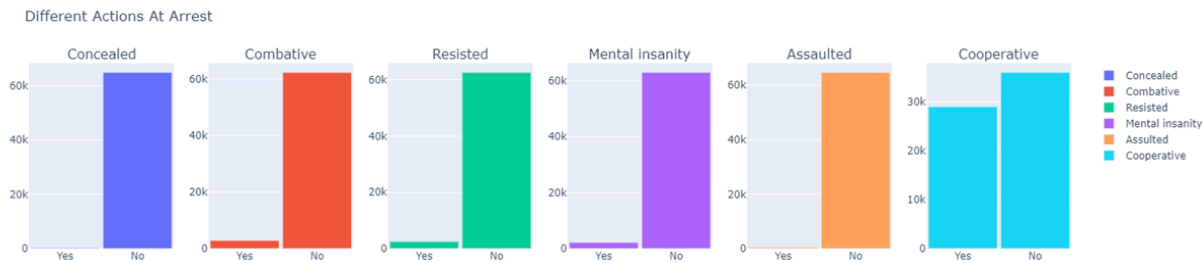


Figure 8. compares all different actions at arrest at the same time. Merely suspects choose to conceal or assault when being arrested. A fraction of suspects have combative, resisted behavior and mental insanity when being arrested. Although nearly half of suspects are cooperative while more than a half of suspects are not.

Figure 9. *Sub-Barplots Of Difference Search Reason*



We can compare all different search reasons at one time from Figure 9 that the highest suspects are searched due to the cause of injury. Lowest suspects are searched because of assisted escape. But in general, it has the average trend of being searched for the four reasons.

Figure 10 *Violin Plots - Number Of Strip Search and Perceived Race With Sex*

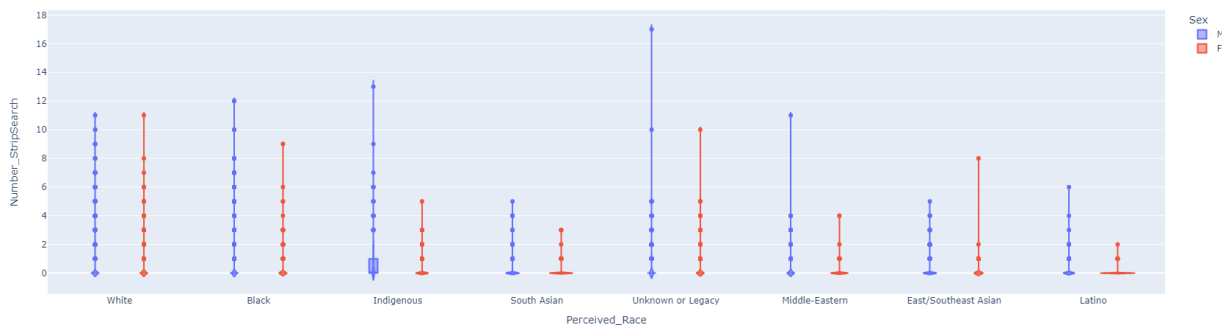


Figure 10. compares the number of strip search distributions of different racial groups in male and female using a violin plot. Most suspects do not have strip searches because almost all the widest parts are located at 0, indicating there is more data in that range. Latino female, Middle Eastern female, and South Asian female have a wider shape, indicating the data are more spread out while the number of strip searches in Black, White, and Indigenous are more concentrated around the median. In terms of outliers, Black, White, and Indigenous male have a higher maximum number of strip searches of 11, 12, and 13 respectively. Indigenous male has the most variability. The middle 50% of the number of Indigenous male's strip searches fall within a range of 2 times, from 0 to 2.

Figure 11 *Box Plots - Number Of Strip Search and Perceived Race With Occurrence Categories*

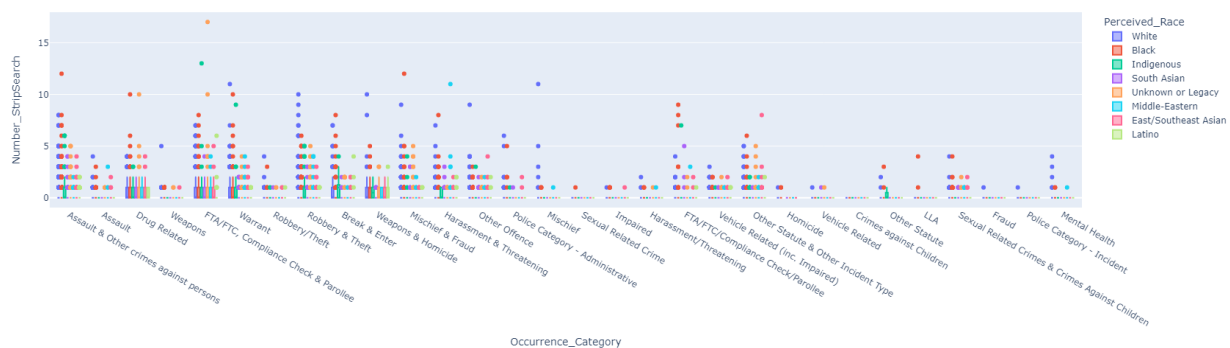


Figure 11. compares the number of strip search distributions of different racial groups in occurrence categories using a box plot. It is noticeable that the occurrence of drugs, FTA/FTC, warrant, weapons and homicide, and break and enter in Black, White, and Indigenous groups have a higher box height, indicating a wider range of values in the middle 50% of the dataset, which can indicate greater variability or dispersion of the data. In addition, white and black groups have extreme outliers on these occurrence categories. It is not conflicted with our knowledge in the literature review.

3.2 Power Analysis

Before conducting t-tests to examine if there is a significant difference between the means of two selected race groups, specifically black individuals compared to other race groups, we calculated the effect size of the explanatory variable using Cohen's D metric.

3.2.1 Perceived Race

Table 2. *Perceived Race Power Analysis Result – Black VS White*

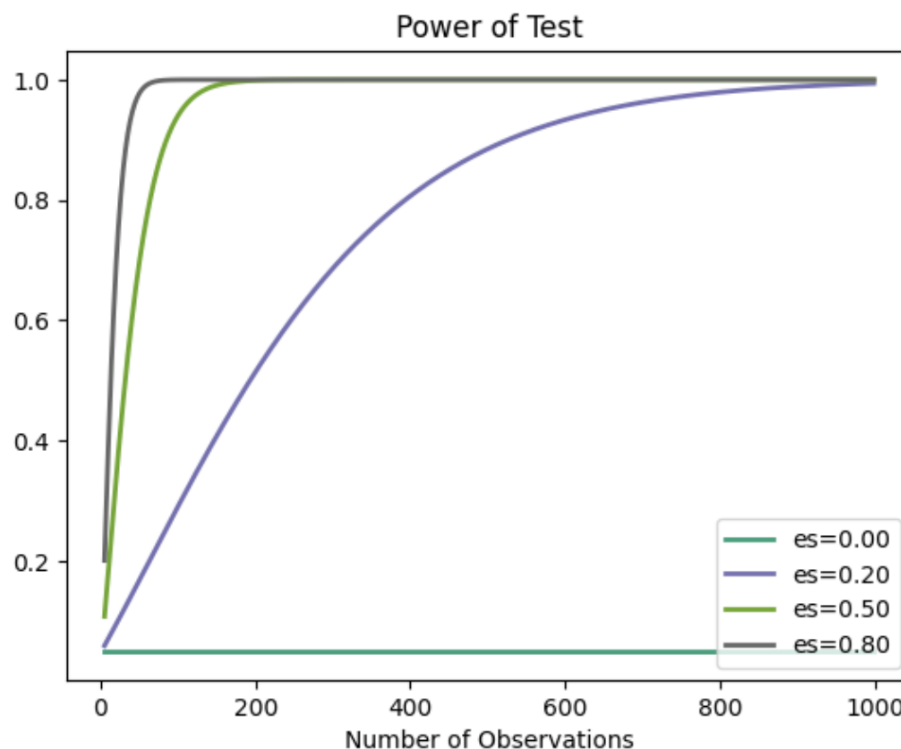
| Black VS White | |
|--|------------------------------|
| Effect size (Cohen's D) for Strip Search | 0.0012072019455060734 |
| Sample Size of nobsl | 9075178.243 needed for BL_ss |

| | |
|----------------------|------------------------------|
| Actual size of BL_ss | 9909 |
| Sample Size of nob2 | 13247800.312 needed for W_ss |
| Actual size of W_ss | 14465 |

As summarized in the above table, the effect size of Cohen's D metric is 0.0012. According to Cohen's criteria, effect sizes can be categorized into small (0.2), medium (0.5), or large (0.8 and above). This number represents a minimal effect, as it is below Cohen's small effect standard. This suggests that there is a minimal difference between the means of black and white communities when facing strip search practices.

After obtaining the effect size, the required sample size was computed using the obtained effect size and establishing the statistical power at 80%. This analysis indicated that a sample size of 13,247,801 was needed for the White group in the Perceived Race variable, while a sample size of 9,075,179 was needed for the Black group in the Perceived Race variable. This finding is significant as the sample sizes available in the dataset are only 14,465 and 9,909 for the respective groups, which can affect the reliability of the test results.

Figure 12. *Power Analysis Graph – Black VS White*



The above figure represents a comparison of effect size according to Cohen's criteria, the dark green line in the above graph shows the actual effect size of this test which is 0.0012. This line indicates minimal even hard-to-notice differences between the two chosen groups.

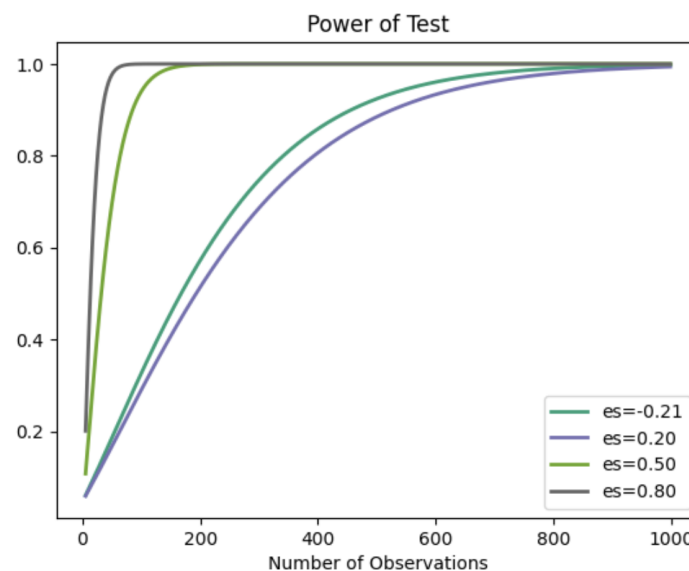
Table 3. *Perceived Race Power Analysis Result – Black VS East/South Asian*

| Black VS East/Southeast Asian | |
|--|--------------------------|
| Effect size (Cohen's D) for Strip Search | -0.2147784226845171 |
| Sample Size of nob1 | 716.360 needed for BL_ss |
| Actual size of BL_ss | 9909 |
| Sample Size of nob2 | 223.750 needed for ES_ss |
| Actual size of ES_ss | 3095 |

As summarized in the above table, the effect size of Cohen's D metric is -0.2148. According to Cohen's criteria, this test result of effect size falls into the small effect region which is just a little above 0.2 standard. This number represents a small effect and suggests that there is a small difference between the means of Black and East/Southeast Asian communities when facing strip search practices.

After obtaining the effect size, the required sample size was computed using the obtained effect size and establishing the statistical power at 80%. This analysis indicated that a sample size of 224 was needed for the East/South Asian group in the Perceived Race variable, while a sample size of 717 was needed for the Black group in the Perceived Race variable. This finding is significant as the sample sizes available in the dataset are 3,095 and 9,909 for the respective groups, which could lead to a more precise estimate of the test result.

Figure 13. *Power Analysis Graph – Black VS East/South Asian*



The above figure represents a comparison of effect size according to Cohen's criteria, the dark green line in the above graph shows the actual effect size of this test which is -0.2148 is just a little bit above small effect size line.

3.2.2 Sex

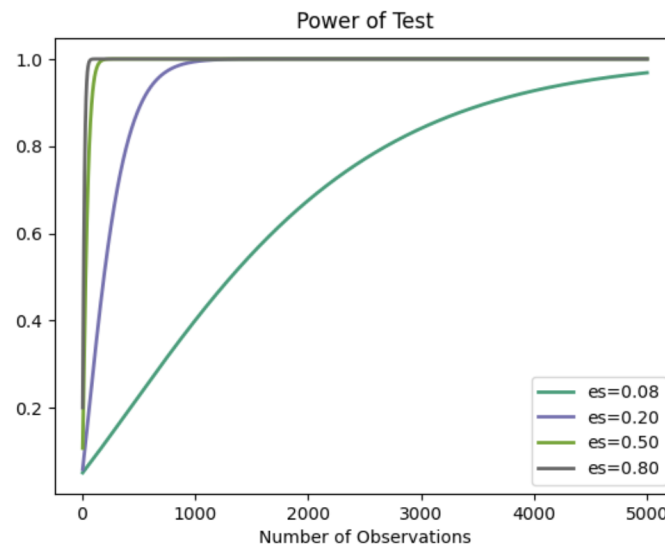
Table 4. *Sex Power Analysis Result – Female VS Male*

| Female VS Male | |
|--|-------------------------------------|
| Effect size (Cohen's D) for Strip Search | 0.07640487121055602 |
| Sample Size of nob1 | 1692.384 needed for F _{ss} |
| Actual size of F _{ss} | 7646 |
| Sample Size of nob2 | 6548.415 needed for M _{ss} |
| Actual size of M _{ss} | 29585 |

As summarized in the above table, the effect size of Cohen's D metric is 0.0764. According to Cohen's criteria, this test result of effect size is below Cohen's small effect standard. This suggests that there is a minimal difference between the means of female and male groups when facing strip search practices.

After obtaining the effect size, the required sample size was computed using the obtained effect size and establishing the statistical power at 80%. This analysis indicated that a sample size of 6,549 was needed for the male group in the Perceived Race variable, while a sample size of 1,963 was needed for the female group in the Perceived Race variable. This finding is significant as the actual sample sizes available in the dataset are 29,585 and 7,646 for the respective groups, which could lead to a more precise estimate of the test result.

Figure 14. *Power Analysis Graph – Female VS Male*



The above figure represents a comparison of effect size according to Cohen's criteria, the dark green line in the above graph shows the actual effect size of this test which is 0.0764. The actual effect size line falls under the small effect range according to Cohen's standard, which indicates minimal even hard-to-notice differences between the two chosen groups.

Overall, there are minimal or hard-to-notice mean differences found in the Black and White group comparison and Female and male group comparisons, and only a small effect size was founded between the Black and East/South Asian group when facing strip search practices. Still, it is worth doing these tests before conducting t-tests and other tests. It is particularly useful when dealing with these large sample sizes, where even small or hard-to-notice differences may be statistically significant.

3.3 T-tests

The t-test enables us to further compare the means of strip searches between different groups.

3.3.1 T-tests - Number of Strip Search & Perceived Race (Black and White)

Since our research question is that Is there any difference or bias of stripsearch in terms of race when being arrested, specifically do Black individuals be treated differently when arrested with strip search practices compared to other races, particularly white ethics and is there a significant difference in means of the number of strip searches across different occurrence categories, we will first apply the t-test to compare the means of number of strip searches of black and white groups firstly.

- Null Hypothesis: the number of strip searches mean of black people has no difference from the number of strip searches mean of white people.
- Alternative Hypothesis: the number of strip searches mean of black people is different from the number of strip searches mean of white people.

Table 5. *t-test results – Number of Strip Search at arrest & Perceived Race (Black and White)*

| | | t | p-value | df | Mean | Std | 95% Confidence Interval of the Difference | |
|------------------------|----------------------|--------------------|----------------------|-------|--------------------|--------------------|---|---------------------|
| Number of Strip Search | Perceived_Race Black | 2.7307830615009934 | 0.006321576386601609 | 34902 | 0.7214153988012909 | 1.6430558162449205 | Lower | Upper |
| | Perceived_Race White | | | | 0.7637763666885629 | 1.5266440674694435 | 0.011956190630020368 | 0.07276574514452352 |

Checking the two tailed t-distribution table, when df is 34902, p is 0.05, the t is 1.96. The absolute value of the t value given by the t test above is 2.73, which is greater than the critical value found in the table, so we can reject the null hypothesis of the t-test and conclude that the results of the test are statistically significant. Besides, our p value of 0.006 is much smaller than 0.05, so we can reject the null hypothesis of no difference and say with a high degree of confidence that there is a true difference in group means. Also, we can see that the difference in means for our sample data is 0.04 (0.76 – 0.72), and the confidence interval shows that the true

difference in means is between 0.012 and 0.073. So, 95% of the time, the true difference in means will be different from 0.

In conclusion, the mean score of black people's number of strip searches is different from the mean score of white people's number of strip searches. We will conduct further research among perceived race groups.

3.3.2 T-tests - Number of Strip Search & Sex of Black

Next, we want to compare the means of number of strip searches of black male and black females continuously with t-test.

- Null Hypothesis: the number of strip searches mean of black male has no difference from the number of strip searches mean of females.
- Alternative Hypothesis: the number of strip searches mean of black male is different from the number of strip searches mean of black females.

Table 6. *t-test results – Number of Strip Search at arrest & Sex of Black*

| | | t | p-value | df | Mean | Std | 95% Confidence Interval of the Difference | |
|------------------------|--------------|----------------------------|---------------------------|------|------------------------|------------------------|---|------------------------|
| Number of Strip Search | Black Male | 10.819868 17580217 8 | 5.0887633427 04695e-27 | 5657 | 0.4817786693 413574 | 1.23775027 02881396 | Lower | Upper |
| | Black Female | | | | 0.7713251166 353318 | 1.71128142 05996583 | 0.23708536 116432827 | 0.3420075 334236205 |

Checking the two tailed t-distribution table, when df is 5657, p is 0.05, the t is 1.96. The t value given by the t test above is 10.82, which is greater than the critical value found in the table, so we can reject the null hypothesis of the t-test and conclude that the results of the test are statistically significant. Besides, our p value of 5.088763342704695e-27 is much smaller than 0.05, so we can reject the null hypothesis of no difference and say with a high degree of confidence that there is a true difference in group means. Also, we can see that the difference in means for our sample data is 0.29 (0.77 – 0.48), and the confidence interval shows that the true difference in means is between 0.237 and 0.342. So, 95% of the time, the true difference in means will be different from 0.

In conclusion, the mean score of black male's number of strip searches is different from the mean score of black females's number of strip searches.

3.3.3 T-tests - Number of Strip Search & Weapons & Homicide Occurrence in Black and White

From Figure 7. *Histogram Of Total Amount Of Strip Searches In Perceived Race With Different Occurrence Category*, we observed that Weapons & Homicide and Drug Related occupy a higher proportion in Black people than other groups. Then we first conduct a t-test to compare the means of number of strip searches of Weapons & Homicide Occurrence in Black and White.

- Null Hypothesis: the mean of number of strip search for Weapons & Homicide occurrence of black has no difference from the mean of number if strip search for Weapons & Homicide occurrence of white.
- Alternative Hypothesis: the mean of number of strip searches for Weapons & Homicide occurrence of black is different from the mean of number of strip searches for Weapons & Homicide occurrence of white.

Table 7. *t-test results – Number of Strip Search at arrest & Weapons & Homicide Occurrence in Black and White*

| | | t | p-value | df | Mean | Std | 95% Confidence Interval of the Difference | |
|------------------------|--|--------------------|--------------------|-----|--------------------|--------------------|---|---------------------|
| Number of Strip Search | Weapons & Homicide Occurrence in Black | 0.9337841468290811 | 0.3508417047505721 | 528 | 0.8008130081300813 | 1.1755136458423632 | Lower | Upper |
| | Weapons & Homicide Occurrence in White | | | | 0.8984126984126984 | 1.5989140486186502 | -0.3029265820312859 | 0.10772720146605158 |

Checking the two tailed t-distribution table, when df is 528, p is 0.05, the t is 1.984. The t value given by the t test above is 0.934, which is smaller than the critical value found in the table, so we cannot reject the null hypothesis of the t-test and conclude that the results of the test are not statistically significant. Besides, our p value of 0.351 is greater than 0.05, so we cannot reject the null hypothesis of no difference and say that there is not a true difference in group means.

In conclusion, the mean score of Weapons & Homicide Occurrence of black's number of strip searches is not different from the mean score of Weapons & Homicide Occurrence of white's number of strip searches, which is conflicted with our observation from EDA graph and understanding from our literature review. Therefore, we will further explore if there is any difference among other race groups.

3.3.4 T-tests - Number of Strip Search & Drug Related Occurrence in Black and White

Then we conduct another t-test to compare the means of number of strip searches of Drug Related Occurrence in Black and White.

- Null Hypothesis: the mean of number of strip searches for Drug Related occurrences of black has no difference from the mean of number of strip searches for Drug Related occurrence of white.
- Alternative Hypothesis: the mean of number of strip searches for Drug Related occurrence of black is different from the mean of number of strip searches for Drug Related occurrence of white.

Table 8. - *t-test results – Number of Strip Search at arrest & Drug Related Occurrence in Black and White*

| | | t | p-value | df | Mean | Std | 95% Confidence Interval of the Difference | |
|------------------------|----------------------------------|--------------------|---------------------|------|--------------------|--------------------|---|----------------------|
| Number of Strip Search | Drug Related Occurrence in Black | 1.4840551910959856 | 0.13795562535731254 | 1953 | 0.8991507430997877 | 1.4407974385275928 | Lower | Upper |
| | Drug Related Occurrence in White | | | | 0.9925650557620818 | 1.3755136107789807 | -0.21686134720434724, | 0.030032721879759153 |

Checking the two tailed t-distribution table, when df is 1953, p is 0.05, the t is 1.96. The t value given by the t test above is 1.48, which is smaller than the critical value found in the table, so we cannot reject the null hypothesis of the t-test and conclude that the results of the test are not statistically significant. Besides, our p value of 0.13 is greater than 0.05, so we cannot reject the null hypothesis of no difference and say with a high degree of confidence that there is no difference in group means.

In conclusion, the mean score of Drug Related Occurrence of black's strip searches has no difference from the mean score of Drug Related Occurrence of white's strip searches. This is conflicted with our observation from the previous EDA graph and our literature review. We need further research and analysis on Drug Related occurrences with perceived race groups.

3.3.5 T-tests - Number of Strip Search & Break and Enter Occurrence in Black and White

From the literature review, we also notice that Break and Enter also occupies a higher proportion in the occurrence category of strip search because of the street culture of the Black group. Then we first conduct a t-test to compare the means of strip searches of Break and Enter Occurrence in Black and White.

- Null hypothesis: the mean of number of strip search for Break and Enter occurrence of black and the mean of number of strip search for Break and Enter occurrence of white are not different
- Alternative hypothesis: the mean of number of strip search for Break and Enter occurrence of black and the mean of number of strip search for Break and Enter occurrence of white are different

Table 9. *t*-test results – Number of Strip Search at arrest & Break and Enter Occurrence in Black and White

| | | t | p-value | df | Mean | Std | 95% Confidence Interval of the Difference | |
|------------------------|-------------------------------------|-------------------|----------------------|-----|--------------------|--------------------|---|--------------------|
| Number of Strip Search | Break and Enter Occurrence in Black | 2.869848874564793 | 0.004303850577108006 | 441 | 1.2535714285714286 | 2.046937067153468 | Lower | Upper |
| | Break and Enter Occurrence in White | | | | 1.6492048643592143 | 2.0783915525759364 | 0.12469293379516838, | 0.6665739377804032 |

Checking the two tailed t-distribution table, when df is 441, p is 0.004 the t is 1.98. The t value given by the t test above is 2.86, which is greater than the critical value found in the table, so we can reject the null hypothesis of the t-test and conclude that the results of the test are statistically significant. Besides, our p value of 0.0043 is smaller than 0.05, so we can reject the null hypothesis of no difference and say with a high degree of confidence that there is a true difference in group means. Also, we can see that the difference in means for our sample data is 0.39 (1.64 – 1.25), and the confidence interval shows that the true difference in means is between 0.13 and 0.67. So, 95% of the time, the true difference in means will be different from 0.

In conclusion, the mean score of Break and Enter Occurrence of black's number of strip searches is different from the mean score of Break and Enter Occurrence of white's number of strip searches, which is not conflicted with our understanding from literature review and the observation from EDA graph.

4. Method

4.1 Dataset Description

The dataset contains information about 65276 entries and 25 variables related to all arrests and strip searches. Based on the research fact that black people suffer from discrimination during the arrest, strip searches, and booking process, this paper tends to explain the booked and strip searches by the following factors. These are Age, Sex, Perceived Race (we only extract Black and White), Occurrence Category, Actions at arrest - Concealed items, Actions at arrest -

Combative, violent or spitter/biter, Actions at arrest - Resisted, defensive or escape risk, Actions at arrest - Mental instability or possibly suicidal, Actions at arrest - Assaulted officer, Actions at arrest – Cooperative, SearchReason-CauseInjury, SearchReason-AssistEscape, SearchReason-PossessWeapons, and SearchReason-PossessEvidence (2022). For this study, we analyzed Arrests and Strip Searches (RBDC-ARR-TBL-001) updated in 2022 and considered the demographic characteristics and arrested behaviors to illustrate the relationship between the strip search and book taking place and the above 14 factors.

- Outcome Variables - DV

The outcome variable of the dataset is “StripSearch”. A strip search is a type of search performed by a law enforcement officer on an individual that involves the removal of some or all of their clothing and a visual examination of their body. It has 0 (not receive strip search) and 1 (receive strip search). In probability theory, 0 and 1 are used to represent the probability of an event occurring, so we assume this dummy variable to be equivalent to a continuous variable. Therefore, we chose to use strip search as our outcome variable.

The “Number_StripSearch” variable has been created according to the “StripSearch” columns which represent the total amount of people who have been strip-searched while being arrested. Repeated values have been removed based on the unique Person ID column.

- Exploratory Variables - IV

Perceived_Race: perceived race is the race group suspects are treated by police when being arrested. It has eight categorical groups - White, Black, Unknown or Legacy, East/Southeast Asian, South Asian, Middle-Eastern, Indigenous, and Latino.

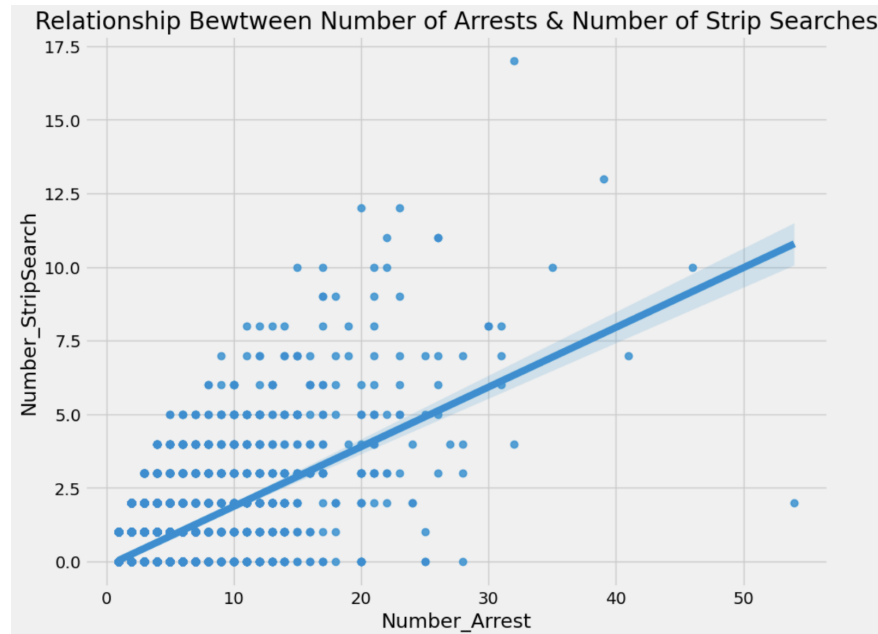
Occurrence_Category: Occurrence categories are taxonomies or classifications of accidents and incidents happening at a high level to permit analysis of the data in support of safety (2011). It has 31 categorical levels, including Assault, Assault & Other crimes against persons, Robbery & Theft, Robbery/Theft, Warrant, FTA/FTC/Compliance Check/Parollee, FTA/FTC, Compliance Check & Parollee, Police Category - Administrative, Drug Related, Other Statute, Other Statute & Other Incident Type, Vehicle Related, Vehicle Related (inc. Impaired), Other Offence, Mischief & Fraud, Mischief, Impaired, Harassment/Threatening, Harassment & Threatening, Weapons, Weapons & Homicide, Break & Enter, Break and Enter, Sexual Related Crime, Sexual Related Crimes & Crimes Against Children, LLA, Police Category - Incident, Fraud, Mental Health, Homicide, and Crimes against Children, and NaN. We will clean the dataset to combine Break & Enter and Break and Enter together and remove NaN.

Sex: sex is the physical sexuality suspects are treated by police when being arrested. It has three categorical levels - Male, Female, and Unknown. We drop the “Unknown” during the data cleaning process.

5. ANCOVA Test

ANCOVA is used here to determine the differences between group means while controlling for the effects of covariates, the Number_Arrest. Prior to doing ANCOVA tests, a plot was used to determine whether there is a straightforward mathematical relationship (typically linear) between the control variable and the outcome. The below figure shows a linear relationship between variables Number_StripSearch and Number_Arrest.

Figure 15. *Power Analysis Graph – Female VS Male*



5.1 ANCOVA Test - Perceived Race

Research Question: Do strip search practices vary across different racial groups?

- Null Hypothesis: There is no significant difference in the mean number of strip searches between the different perceived race groups when controlling for the number of arrests.
- Alternative Hypothesis: There is a significant difference in the mean number of strip searches between the different perceived race groups when controlling for the number of arrests.

Table 10. *ANCOVA results – Number_StripSearch & Perceived Race*

| Source | SS | DF | F | p-unc | np2 |
|----------------|-------------|-------|--------------|--------------|----------|
| Perceived_Race | 21.514958 | 7 | 12.278243 | 8.762727e-16 | 0.002304 |
| Number_Arrest | 6044.292151 | 1 | 24145.666378 | 0.000000e+00 | 0.393459 |
| Residual | 9317.640644 | 37222 | NaN | NaN | NaN |

The ANCOVA test with a p-unc (uncorrected p-value) value of 8.762727e-16 (<0.05) for Perceived Race suggests that there is a significant difference in mean values of strip search practices among different perceived race groups while controlling for the total number of arrests. Therefore, we can reject the null hypothesis. Our initial hypothesis was that perceived race could predict whether someone would be strip searched during an arrest. From our results, there is indeed a statistically significant relationship between perceived race and strip search practices. These findings provide valuable insights that will be further elaborated on in the results and findings section.

5.2 ANCOVA Test - Occurrence Category

Research Question: Do strip search practices vary across different racial groups?

- Null Hypothesis: There is no significant difference in the mean number of strip searches between the different occurrence categories when controlling for the number of arrests.
- Alternative Hypothesis: There is a significant difference in the mean number of strip searches between the different occurrence categories when controlling for the number of arrests.

Table 11. *ANCOVA results – Number_StripSearch & Occurrence Category*

| Source | SS | DF | F | p-unc | np2 |
|---------------------|-------------|-------|--------------|----------|----------|
| Occurrence_Category | 588.171356 | 29 | 86.216802 | <0.001 | 0.062979 |
| Number_Arrest | 5453.742413 | 1 | 23183.588502 | <0.001 | 0.383939 |
| Residual | 8750.984246 | 37200 | NaN | NaN | NaN |

After conducting an ANCOVA test with a p-unc (uncorrected p-value) value of <0.001 (<0.05) for Occurrence Category and controlling for the total number of arrests, the null hypothesis that the mean value between strip search practices for different occurrence categories is equal, can be rejected. Our initial hypothesis was that different occurrence categories would predict whether an individual would be strip searched during an arrest. Our results indicate that there is a statistically significant relationship between occurrence category and strip search. It is worth noting that the Python test result showed an actual p-unc value of 0.0, which typically implies that the p-value is extremely small but not necessarily zero. Therefore, it is important to interpret a p-value of 0.0 as a strong indication of statistical significance. The recorded p-unc value in this study is <0.001 , and we will provide a detailed explanation of our findings in the results and findings section.

6. Chi-Square

The chi-square test is used to determine whether there is an association between two categorical variables and if the occurrence of one variable is related to the occurrence of the other variable.

We adopted the chi-square test to exam our sub research question: Are there associations between perceived race, strip search and occurrence category?

6.1 Perceived Race VS Strip Search

Research Question: Is there an association between perceived race and strip search?

- Null hypothesis: Perceived Race and Strip Search are independent.
- Alternative hypothesis: Perceived Race and Strip Search are dependent.

Table 12. *Chi-Square results – Perceived Race & StripSearch*

| Perceived Race VS Strip Search | |
|--------------------------------|-----------------------|
| Chi-squared statistic: | 356.12485254652904 |
| P-value | 6.017709683374717e-73 |

The p-value of the test is 6.017709683374717e-73, which indicates significant evidence against the null hypothesis. In other words, it suggests that Perceived Race and Strip Search are not independent variables, but rather have a significant association on statistical level. A p-value of less than 0.05 is often considered statistically significant, therefore this p-value is significantly below the significance threshold. As a result, we would reject the null hypothesis and accept the alternative hypothesis that Perceived Race and Strip Search are dependent.

6.2 Perceived Race VS Occurrence Category

Research Question: Is there an association between perceived race and occurrence category?

- Null hypothesis: Perceived Race and Occurrence Category are independent.
- Alternative hypothesis: Perceived Race and Occurrence Category are dependent.

Table 13. *Chi-Square results – Perceived Race & Occurrence Category*

| Perceived Race VS Occurrence Category | |
|---------------------------------------|--------------------|
| Chi-squared statistic: | 2751.6587949730747 |
| P-value | <0.001 |

The p-value of the test in Python is 0.0, indicating that the p-value is less than the lowest value that the computer can represent, which is generally approximately 2.2e-16. As a result, the p-value is reported as <0.001. The p-value of <0.001 implies that there is substantial evidence against the null hypothesis and that the alternative hypothesis should be adopted. In other words, the p-value indicates a very high relationship between Perceived Race and Occurrence Category, implying that these two variables are dependent.

6.3 Strip Search VS Occurrence Category

Research Question: Is there an association between strip search and occurrence category?

- Null hypothesis: Strip Search and Occurrence Category are independent.
- Alternative hypothesis: Strip Search and Occurrence Category are dependent.

Table 14. *Chi-Square results – Strip Search & Occurrence Category*

| Strip Search & Occurrence Category | |
|------------------------------------|-------------------|
| Chi-squared statistic: | 8547.072981535563 |
| P-value | <0.001 |

The p-value of the test shows in python is 0.0, which indicates that the p-value is smaller than the smallest value that can be represented by the computer, which is usually around $2.2e-16$. Therefore, the p-value is reported as <0.001. The p-value is <0.001 indicates that there is significant evidence against the null hypothesis and alternative hypothesis should be accepted. In other words, the p-value suggests there is a very strong association between Strip Search and Occurrence Category, and we can conclude that these two variables are dependent.

In conclusion, the chi-square test findings suggest that the incidence of the selected exploratory variables, namely perceived race, strip search, and occurrence category, has a statistically significant association. These findings support our study objectives by providing strong evidence that there are substantial connections between these factors. Overall, research implies that perceptions of race and occurrence category have a substantial impact in deciding whether people are subjected to strip searches during police enforcement practices.

7. Logistic Regression

Based on the Chi-square results, we found that the occurrence category is associated with perceived race. Therefore, we perform a logistic regression to examine the effects of Sex, Perceived_Race_Black, Perceived_Race_East_Southeast_Asian, Perceived_Race_Indigenous, Perceived_Race_Latino, Perceived_Race_Middle_Eastern, Perceived_Race_South_Asian, Perceived_Race_White, Occurrence_Category_Drug_Related, Occurrence_Category_Weapons_Homicide, Occurrence_Category_Break_Enter. The logistic regression results suggest that several features are significantly associated with the likelihood of suspects being strip searched. Most of the features are statistically significant except for Perceived_Race_Latino.

Figure 16. *Logit Regression Results*

| Logistic Regression Results | | | | | | |
|--------------------------------------|---------|---------|---------|-------|----------------|--------|
| | coef | std err | z | P> z | [0.025, 0.975] | |
| Intercept | -2.4821 | 0.061 | -40.796 | 0 | -2.601 | -2.363 |
| Sex | -0.2031 | 0.041 | -4.967 | 0 | -0.283 | -0.123 |
| Perceived_Race_Black | 0.3486 | 0.066 | 5.276 | 0 | 0.219 | 0.478 |
| Perceived_Race_East_Southeast_Asian | -0.3106 | 0.093 | -3.324 | 0.001 | -0.494 | -0.127 |
| Perceived_Race_Indigenous | 0.6777 | 0.098 | 6.906 | 0 | 0.485 | 0.87 |
| Perceived_Race_Latino | -0.1328 | 0.124 | -1.072 | 0.284 | -0.376 | 0.11 |
| Perceived_Race_Middle_Eastern | -0.3421 | 0.106 | -3.238 | 0.001 | -0.549 | -0.135 |
| Perceived_Race_South_Asian | -0.2703 | 0.099 | -2.72 | 0.007 | -0.465 | -0.076 |
| Perceived_Race_White | 0.3271 | 0.064 | 5.094 | 0 | 0.201 | 0.453 |
| Occurrence_Category_Drug_Related | 1.8488 | 0.051 | 36.463 | 0 | 1.749 | 1.948 |
| Occurrence_Category_Weapons_Homicide | 1.9447 | 0.076 | 25.494 | 0 | 1.795 | 2.094 |
| Occurrence_Category_Break_Enter | 1.0791 | 0.071 | 15.211 | 0 | 0.94 | 1.218 |

Interpretation of the above coefficients:

Compared with female suspects, the predicted log of the odds of male suspects being strip searched are 0.2031 higher, controlling for other features ($\beta = 0.2031$, $p < 0.05$). Sex is statistically significant to strip search. This finding is consistent with our t-test results, suggesting that sex is associated with the likelihood of suspects being strip searched.

Compared with non-black suspects, the predicted log of the odds of suspects perceived as black being strip searched are 0.3486 higher, controlling for other features ($\beta = 0.3486$, $p < 0.001$). The perceived race black is statistically significant to strip search. This finding is consistent with our ANOVA results, suggesting that whether the perceived race is black is associated with the likelihood of suspects being strip searched.

Compared with non-east southeast asian suspects, the predicted log of the odds of southeast asian suspects being strip searched are 0.3106 lower, controlling for other features. The perceived race southeast asian is statistically significant to strip search, which is not conflicted with our ANOVA results. Whether the perceived race is east southeast asian is associated with likelihood suspects being strip searched.

Compared with non-indigenous suspects, the predicted log of the odds of indigenous suspects being strip searched are 0.6777 higher, controlling for other features. The perceived race indigenous is statistically significant to strip search, which is not conflicted with our ANOVA results. Whether the perceived race is east indigenous is associated with likelihood suspects being strip searched.

Compared with non-latino suspects, the predicted log of the odds of latino suspects being strip searched are 0.1328 lower, controlling for other features. The perceived race latino is statistically significant to strip search, which is not conflicted with our ANOVA results. Whether the perceived race is latino is not associated with likelihood suspects being strip searched.

Compared with non-middle eastern suspects, the predicted log of the odds of middle eastern suspects being strip searched are 0.3421 lower, controlling for other features. The perceived race middle eastern is statistically significant to strip search, which is not conflicted with our ANOVA

results. Whether the perceived race is middle eastern is associated with likelihood suspects being strip searched.

Compared with non-south asian suspects, the predicted log of the odds of south asian suspects being strip searched are 0.2703 lower, controlling for other features. The perceived race south asian is statistically significant to strip search, which is not conflicted with our ANOVA results. Whether the perceived race is south asian is associated with likelihood suspects being strip searched.

Compared with non-white suspects, the predicted log of the odds of white suspects being strip searched are 0.3271 lower, controlling for other features. The perceived race white is statistically significant to strip search, which is not conflicted with our t-test results. Whether the perceived race is white is associated with likelihood suspects being strip searched.

Compared with suspects who do not have drug related occurrence, the predicted log of the odds of suspects who are strip searched with drug related occurrence are 1.8488 higher, controlling for other features. The occurrence category drug related is statistically significant to strip search, which is not conflicted with our t-test results. Whether the occurrence category is drug related is associated with likelihood suspects being strip searched.

Compared with suspects who do not have weapons and homicide occurrence, the predicted log of the odds of suspects who are strip searched with weapons and homicide occurrence are 1.9447 higher, controlling for other features. The occurrence category weapons and homicide is statistically significant to strip search, which is not conflicted with our t-test results. Whether the occurrence category is weapons and homicide is associated with likelihood suspects being strip searched.

Compared with suspects who do not have break and enter occurrence, the predicted log of the odds of suspects who are strip searched with break and enter occurrence are 1.0791 higher, controlling for other features. The occurrence category break and enter is statistically significant to strip search, which is not conflicted with our t-test results. Whether the occurrence category is break and enter is associated with likelihood suspects being strip searched.

Figure 17. *Odds Ratio of Independent Variables*

| Odds Ratio of Logit Regression Model | |
|--------------------------------------|------------|
| | Odds ratio |
| Intercept | 0.083568 |
| Sex | 0.816174 |
| Perceived_Race_Black | 1.417045 |
| Perceived_Race_East_Southeast_Asian | 0.732984 |
| Perceived_Race_Indigenous | 1.96935 |
| Perceived_Race_Latino | 0.875636 |
| Perceived_Race_Middle_Eastern | 0.710265 |
| Perceived_Race_South_Asian | 0.763185 |
| Perceived_Race_White | 1.386888 |
| Occurrence_Category_Drug_Related | 6.352061 |
| Occurrence_Category_Weapons_Homicide | 6.991492 |
| Occurrence_Category_Break_Enter | 2.942077 |

Interpretation of Odds Ratio:

The odds ratio (OR) of sex is smaller than 1, the probability of female suspects being strip searched is smaller than the probability of male suspects being strip searched.

In this logistic regression model, with 95% confidence interval, the confidence interval for Sex is [0.753, 0.884], it means that there is a 95% probability that the true coefficient for the sex lies between 0.753 and 0.884. Since sex is a dummy variable, it indicates that whether the suspect's sex is male or female is associated with a change in the log-odds of the being strip searched outcome between 0.2 and 0.3, holding all other predictors constant.

The odds ratio (OR) of Perceived Race Black is larger than 1, the probability of black suspects being strip searched is larger than the probability of non-black suspects being strip searched.

The odds ratio (OR) of Perceived Race East Southeast Asian is smaller than 1, the probability of East Southeast Asian suspects being strip searched is smaller than the probability of non-East Southeast Asian suspects being strip searched.

The odds ratio (OR) of Perceived Race Indigenous is larger than 1, the probability of Indigenous suspects being strip searched is larger than the probability of non-Indigenous suspects being strip searched.

The odds ratio (OR) of Perceived Race Latino is smaller than 1, the probability of Latino suspects being strip searched is smaller than the probability of non-Latino suspects being strip searched.

The odds ratio (OR) of Perceived Race Middle Eastern is smaller than 1, the probability of Middle Eastern suspects being strip searched is smaller than the probability of non-Middle Eastern suspects being strip searched.

The odds ratio (OR) of Perceived Race South Asian is smaller than 1, the probability of South Asian suspects being strip searched is smaller than the probability of non-South Asian suspects being strip searched.

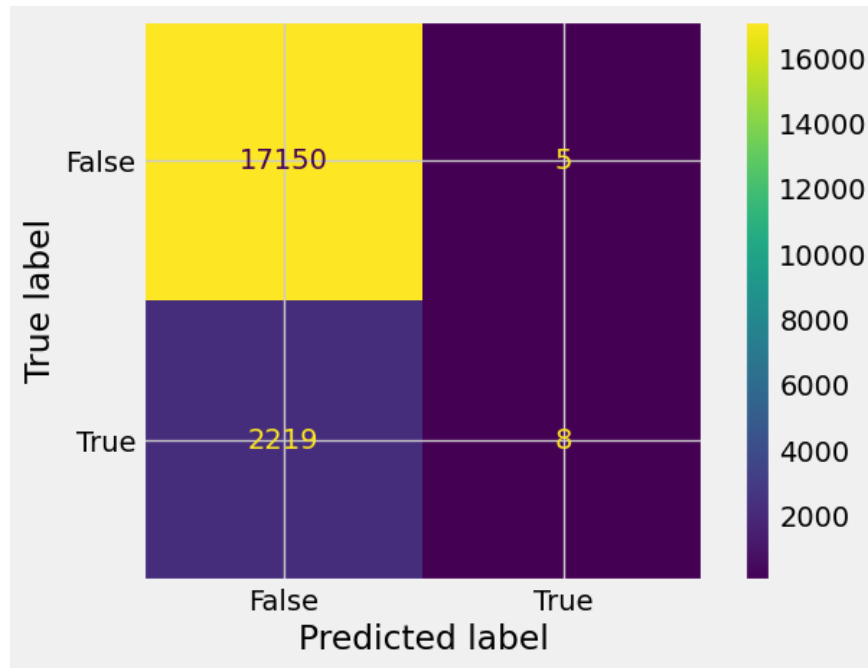
The odds ratio (OR) of Perceived Race White is larger than 1, the probability of white suspects being strip searched is larger than the probability of non-white suspects being strip searched.

The odds ratio (OR) of Occurrence Category Drug Related is larger than 1, the probability of suspects being strip searched with drug related occurrence is larger than the probability of suspects being strip searched without drug related occurrence.

The odds ratio (OR) of Occurrence Category Weapons and homicide is larger than 1, the probability of suspects being strip searched with weapons and homicide occurrence is larger than the probability of suspects being strip searched without weapons and homicide occurrence.

The odds ratio (OR) of Occurrence Category Break and Enter is larger than 1, the probability of suspects being strip searched with Break and Enter occurrence is larger than the probability of suspects being strip searched without Break and Enter occurrence.

Figure 18. *Confusion Matrix*



Interpret Confusion Matrix

Top-Left Quadrant shows the outcome of True Negative (TN), displaying 17150 instances were incorrectly classified as negative. It means 17150 instances who were strip searched were incorrectly classified as not being strip searched.

Top-Right Quadrant shows the outcome of False Positive (FP), displaying 5 instances were correctly classified as negative. It means 5 instances who were not strip searched were incorrectly classified as being strip searched.

Bottom-Left Quadrant shows the outcome of False Negative (FN), displaying 2219 instances were incorrectly classified as positive. It means 2219 instances who were not strip searched were correctly classified as not being strip searched.

Bottom-Right Quadrant shows the outcome of True Positive (TP), displaying 8 instances were correctly classified as positive. It means 8 instances who were strip searched were correctly classified as being strip searched.

Using these values, we can calculate the performance metrics:

Accuracy: $(17150 + 8) / (5 + 8 + 2219 + 17150) = 0.88$

Precision: $8 / (8 + 5) = 0.62$

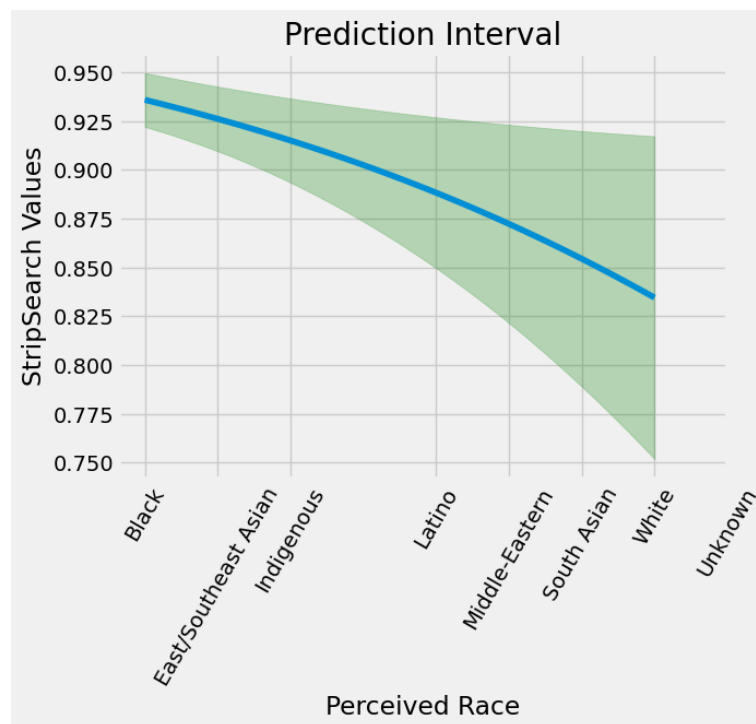
Recall (Sensitivity or True Positive Rate): $8 / (8 + 2219) = 0.0035$

F1 Score: $2 * (0.62 * 0.0035) / (0.62 + 0.0035) = 0.0069$

From this example, we can see that the model has an accuracy of 88%, which means that 88% of the instances in the test set were correctly classified by the model. The precision of 0.62 indicates that the model is not making many false positive predictions, while the recall of 0.0035 indicates that the model is not capturing most of the positive instances. The F1 Score of 0.0035 is the harmonic mean of precision and recall and provides a balance between the two metrics.

Initially, we decompose the Perceived_Race into groups of dummy variables to determine the relationship between the respective race group as independent variables and the binary dependent variable StripSearch. However, we also would like to compare among race groups. Therefore, to get the prediction Interval, we conduct another logit regression model making the race independent variable as a categorical variable with 8 levels.

Figure 19. *Prediction Interval*



The prediction interval plot helps us to view both the expected value of our predictions - StripSearch(the blue line) and the uncertainty associated with those predictions (the green shaded area).the model predicted values - Strip Search values with their associated intervals of uncertainty. In this plot, the blue line represents the estimated StripSearch values given the perceived race groups. The green shaded area around the line represents the prediction interval, which indicates the range of possible values for a new observation. We can predict the black people have the highest stripsearch probability of 0.94. And the green shaded area around the line is quite thin, indicating a low degree of uncertainty in our prediction. However, the white people have a low stripsearch probability of 0.85. And the green shaded area around the line is quite wide, indicating a high degree of uncertainty in our prediction.

8. Results and Findings

8.1 ANCOVA Test

Two ANCOVA tests have been conducted in the previous sections, where we are able to reject all null hypotheses and can conclude that, when controlling the total number of arrests, there are significant mean differences of being strip searched within different race groups and within different occurrence categories.

A strip search is not a mandatory procedure when an individual is arrested. However, our findings also reveal that while controlling the total arrests amounts, there are significant mean differences between various race groups, which raises important questions about potential biases and discrimination during law enforcement practices. The power analysis section of our study also sheds light on the mean differences between black individuals and white individuals, as well as those of East/South Asian descent. These results underscore the urgent need for further investigation and intervention to ensure that all individuals, regardless of their perceived race, are treated fairly and equitably throughout the criminal justice system.

Moreover, there are also significant mean differences found in different occurrence categories when facing strip search practices. This means that certain occurrence categories may be more likely to result in strip searches, even if the total number of arrests is the same. Strip searches may be conducted depending on the severity of the offense, the behavior of the arrestees, and the policies and procedures of the arresting agencies. Still, the test results indicate that there are possibilities that officers may be more likely to assume that individuals in certain occurrence categories are more likely to be carrying contraband, and therefore more likely to conduct strip searches in these cases. This could be due to biases or stereotypes about certain groups of people. Ultimately, our tests highlight the need for ongoing efforts to promote justice and equality in all aspects of law enforcement and criminal justice practices.

8.2 Chi-Square

The findings suggest that there are significant associations between perceived race, strip search, and occurrence category. This means that the occurrence of strip search practices and occurrence category vary depending on the perceived race of the individual being arrested. This raises important questions about potential biases and discrimination during law enforcement practices. This highlights the importance of recognizing and addressing potential biases and discrimination in law enforcement practices. The findings suggest that individuals of certain perceived races may be disproportionately targeted for strip searches, and that occurrence category may also play a role in determining who is subjected to these invasive practices. It is important for law and regulation agencies to be aware of these potential biases and take steps to ensure that all individuals are treated fairly and justly, regardless of their perceived race or the circumstances surrounding their arrest. It signals the need for further investigation and intervention to ensure fair and just treatment for all individuals, regardless of their perceived race for strip search processes when at arrest. It is critical that law enforcement and regulatory organizations recognize these possible prejudices and take efforts to ensure that all persons are treated fairly and justly, regardless of their perceived race or the circumstances surrounding their arrest. It

indicates the need for further investigation and intervention to ensure fair and just treatment for all individuals, regardless of their perceived race for strip search processes when at arrest.

8.3 Logistic Regression

Based on the logistic regression analysis, we found that several factors are significantly associated with the likelihood of suspects being strip searched, including Sex, Perceived Race Black, Perceived Race East Southeast Asian, Perceived Race Indigenous, Perceived Race Middle Eastern, Perceived Race South Asian, Perceived Race White, Occurrence Category Drug Related, Occurrence Category Weapons & Homicide, and Occurrence Category Break & Enter. The only feature that was not statistically significant in this analysis was the Perceived Race Latino. This finding can verify both our research question one: Black individuals are treated differently when arrested with strip search practices compared to other races” and research question two: there is a significant difference in means of the number of strip searches across different occurrence categories, controlling the total arrested number.

The logit regression results indicate that male suspects have a higher likelihood of being strip searched compared to female suspects. Additionally, suspects perceived as Black, Indigenous, and White have a higher likelihood of being strip searched compared to other race groups. Regarding the occurrence categories, suspects involved in drug-related occurrences, weapons, and homicide occurrences, and break and enter occurrences have a higher likelihood of being strip searched compared to suspects not involved in these occurrences. These findings suggest that there are significant disparities in the likelihood of suspects being strip searched based on their sex, perceived race, and the type of occurrence they are involved in.

To further investigate the relationship between perceived race and the likelihood of being strip searched, we conducted another logit regression model with perceived race as a categorical variable with 8 levels. The prediction interval plot helps us to view both the expected value of our predictions (StripSearch) and the uncertainty associated with those predictions. It shows that black people have the highest strip search probability and a low degree of uncertainty in our prediction. On the other hand, white people have a low strip search probability and a high degree of uncertainty in our estimation. Therefore, it is not conflicted with our literature review findings and answers our research questions again.

Overall, the results suggest that perceived race, sex, and occurrence category variables are significant predictors of the likelihood of suspects being strip searched. The odds ratios provide insight into the direction and magnitude of the effects of these variables, while the confusion matrix and prediction interval provide useful information for evaluating the performance of the model and understanding the relationship between perceived race and the likelihood of being strip searched. It is important to note that correlation does not imply causation and further research is needed to establish causal relationships between these variables and the outcome of strip search.

9. Discussion

9.1 Limitation

This dataset contains a sufficient amount of information with several columns and rows, but no numerical data can be discovered in it. Initially, we wish to integrate all search reason categories and rank them in severity order, assuming that they are continuous numerical variables. Because this variable may offer us some insight into if there are underlying relationships between perceived race groups and the reasons why people are strip searched. Yet, there isn't enough research to back up our assumptions and provide a guide on the severity of each search reason, which might render this assumption useless and so contribute nothing to the research subject. Therefore, we decided to assume the strip search column as a numerical value where it represents the probability of getting strip searched. The probability of this event that is certain to occur is represented by 1, while the probability of an event that is impossible to occur is represented by 0. Moreover, we also created new variables for the ANCOVA test since it requires continuous variables, namely Number_StripSearch and Number_Arrest.

Furthermore, another limitation this study has was the sample size issue with power analysis between the Black and White races on strip search practices. The effect size for the difference in strip search practices between black and white individuals is very small, as indicated by Cohen's D metric of 0.0012. This means that the difference between the means of black and white communities is minimal. However, even though the effect size is small, a large sample size is still required to detect this minor difference with statistical power. The power analysis in these scenarios suggested that sample sizes of more than 13 million for the white group and more than 9 million for the black group would be required to attain a statistical power of 80%.

However, the required sample size of 13 million for the white group and 9 million for the black group are likely too large and impractical to obtain in reality and the statistical power of the analysis can only be limited, and the results will be reliable indeed. Therefore, in reality, we suggest that researchers can explore other options to improve the reliability of their results, such as increasing the sample size within the available dataset or utilizing other statistical methods that are less affected by small sample sizes. Additionally, researchers can use their study as a starting point for future research to continue exploring the relationship between the variables of interest with a larger and more diverse sample size.

9.2 Future Work

As mentioned in previous sections, studies have shown that strip searches are considered traumatic experiences for individuals and can lead to long-lasting emotional and psychological damage. As a result, there is an urgent need for more study to better understand the experiences of various racial groups during strip searches and to identify viable solutions that might mitigate the harm caused.

Furthermore, a study done by Reventlow (2020) argued that while statistics can give significant insights into the amount and character of racism, relying solely on data collection is insufficient to address and mitigate the systematic bias in racism. Comprehensive plans that comprehend the

complexities of problems and involve various parties and techniques are essential to accomplish long-term change. For example, by collaborating with people of color and other marginalized communities and emphasizing their needs and viewpoints, society may develop more effective ways for combating racism and establishing a more inclusive environment (Reventlow, 2020).

10. Conclusion

This study is an attempt to explore the question of “Is there any difference or bias of stripsearch in terms of race when being arrested?” We are particularly interested in sub research questions of comparing stripsearch of black to white and East/ South Asian, number of strip searches among different occurrence categories, and the associated relationship between perceived race and occurrence categories. Regardless of the limits, there is still considerable evidence to demonstrate that there are differences and biases of strip search when being arrested among different racial groups. Black, white, and indigenous communities display significant association with being strip searched than other racial groups. In addition, during our exploratory study, we verify the association between perceived race and occurrence categories. And we also verify the significant associations of strip searches and occurrence categories, specifically drugs, weapons and homicide, and break and enter, which is corresponding to our literature review. However, the study has limitations such as the assumption of categorical variables as numerical values and small sample sizes that affect statistical power. Future research should focus on understanding the experiences of various racial groups during strip searches and identifying viable solutions to mitigate the harm caused. Additionally, it's important to implement comprehensive plans that involve various parties and techniques to address and combat racism in law enforcement practices. Only then can we hope to build a system that truly serves the needs and interests of all members of the society.

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Appendices

ANCOVA Test Result

Numer_StripSearch & Perceived Race

| OLS Regression Results | | | | | | |
|--|--------------------|---------------------|-------------|-------|--------|--------|
| Dep. Variable: | Number_StripSearch | R-squared: | 0.399 | | | |
| Model: | OLS | Adj. R-squared: | 0.399 | | | |
| Method: | Least Squares | F-statistic: | 3095. | | | |
| Date: | Sat, 15 Apr 2023 | Prob (F-statistic): | 0.00 | | | |
| Time: | 00:28:32 | Log-Likelihood: | -27042. | | | |
| No. Observations: | 37231 | AIC: | 5.410e+04 | | | |
| Df Residuals: | 37222 | BIC: | 5.418e+04 | | | |
| Df Model: | 8 | | | | | |
| Covariance Type: | nonrobust | | | | | |
| | coef | std err | t | P> t | [0.025 | 0.975] |
| Intercept | -0.1233 | 0.006 | -22.336 | 0.000 | -0.134 | -0.112 |
| Perceived_Race[T.East/Southeast Asian] | -0.0569 | 0.010 | -5.519 | 0.000 | -0.077 | -0.037 |
| Perceived_Race[T.Indigenous] | -0.0348 | 0.020 | -1.730 | 0.084 | -0.074 | 0.005 |
| Perceived_Race[T.Latino] | -0.0817 | 0.016 | -5.117 | 0.000 | -0.113 | -0.050 |
| Perceived_Race[T.Middle-Eastern] | -0.0679 | 0.012 | -5.565 | 0.000 | -0.092 | -0.044 |
| Perceived_Race[T.South Asian] | -0.0726 | 0.011 | -6.434 | 0.000 | -0.095 | -0.050 |
| Perceived_Race[T.Unknown or Legacy] | -0.0338 | 0.010 | -3.440 | 0.001 | -0.053 | -0.015 |
| Perceived_Race[T.White] | -0.0277 | 0.007 | -4.240 | 0.000 | -0.040 | -0.015 |
| Number_Arrest | 0.2019 | 0.001 | 155.389 | 0.000 | 0.199 | 0.204 |
| Omnibus: | 25527.771 | Durbin-Watson: | 2.011 | | | |
| Prob(Omnibus): | 0.000 | Jarque-Bera (JB): | 1649823.828 | | | |
| Skew: | 2.632 | Prob(JB): | 0.00 | | | |
| Kurtosis: | 35.184 | Cond. No. | 22.2 | | | |

Notes:
[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Number_StripSearch & Occurrence Category

| OLS Regression Results | | | | | | |
|--|--------------------|---------------------|-------------|-------|--------|--------|
| Dep. Variable: | Number_StripSearch | R-squared: | 0.436 | | | |
| Model: | OLS | Adj. R-squared: | 0.436 | | | |
| Method: | Least Squares | F-statistic: | 958.5 | | | |
| Date: | Sat, 15 Apr 2023 | Prob (F-statistic): | 0.00 | | | |
| Time: | 00:28:33 | Log-Likelihood: | -25874. | | | |
| No. Observations: | 37231 | AIC: | 5.181e+04 | | | |
| Df Residuals: | 37200 | BIC: | 5.207e+04 | | | |
| Df Model: | 30 | | | | | |
| Covariance Type: | nonrobust | | | | | |
| | coef | std err | t | P> t | [0.025 | 0.975] |
| Intercept | -0.2363 | 0.007 | -33.363 | 0.000 | -0.250 | -0.222 |
| Occurrence_Category[T.Assault & Other crimes against persons] | 0.1189 | 0.010 | 12.480 | 0.000 | 0.100 | 0.138 |
| Occurrence_Category[T.Break & Enter] | 0.1844 | 0.020 | 8.996 | 0.000 | 0.144 | 0.225 |
| Occurrence_Category[T.Crimes against Children] | 7.878e-05 | 0.067 | 0.001 | 0.999 | -0.131 | 0.131 |
| Occurrence_Category[T.Drug Related] | 0.4441 | 0.013 | 33.038 | 0.000 | 0.418 | 0.470 |
| Occurrence_Category[T.FTA/FTC, Compliance Check & Parollee] | 0.3433 | 0.014 | 23.951 | 0.000 | 0.315 | 0.371 |
| Occurrence_Category[T.FTA/FTC/Compliance Check/Parollee] | -0.0326 | 0.021 | -1.579 | 0.114 | -0.073 | 0.008 |
| Occurrence_Category[T.Fraud] | -0.0032 | 0.027 | -0.120 | 0.905 | -0.056 | 0.050 |
| Occurrence_Category[T.Harassment & Threatening] | 0.1445 | 0.018 | 8.054 | 0.000 | 0.109 | 0.180 |
| Occurrence_Category[T.Harassment/Threatening] | -0.0195 | 0.019 | -1.037 | 0.300 | -0.056 | 0.017 |
| Occurrence_Category[T.Homicide] | 0.0665 | 0.070 | 0.945 | 0.344 | -0.071 | 0.204 |
| Occurrence_Category[T.Impaired] | 0.0295 | 0.016 | 1.873 | 0.061 | -0.001 | 0.060 |
| Occurrence_Category[T.LLA] | 0.0046 | 0.030 | 0.154 | 0.878 | -0.053 | 0.063 |
| Occurrence_Category[T.Mental Health] | -0.0157 | 0.043 | -0.368 | 0.713 | -0.099 | 0.068 |
| Occurrence_Category[T.Mischief] | -0.0233 | 0.021 | -1.113 | 0.266 | -0.064 | 0.018 |
| Occurrence_Category[T.Mischief & Fraud] | 0.0560 | 0.016 | 3.487 | 0.000 | 0.025 | 0.088 |
| Occurrence_Category[T.Other offence] | 0.1058 | 0.016 | 6.745 | 0.000 | 0.075 | 0.137 |
| Occurrence_Category[T.Other Statute] | -0.0376 | 0.023 | -1.652 | 0.098 | -0.082 | 0.007 |
| Occurrence_Category[T.Other Statute & Other Incident Type] | -0.0159 | 0.014 | -1.121 | 0.262 | -0.044 | 0.012 |
| Occurrence_Category[T.Police Category - Administrative] | -0.0221 | 0.017 | -1.288 | 0.198 | -0.056 | 0.012 |
| Occurrence_Category[T.Police Category - Incident] | -0.0106 | 0.027 | -0.390 | 0.697 | -0.064 | 0.043 |
| Occurrence_Category[T.Robbery & Theft] | 0.1091 | 0.011 | 9.734 | 0.000 | 0.087 | 0.131 |
| Occurrence_Category[T.Robbery/Theft] | -0.0183 | 0.013 | -1.359 | 0.174 | -0.045 | 0.008 |
| Occurrence_Category[T.Sexual Related Crime] | 0.0044 | 0.021 | 0.209 | 0.834 | -0.036 | 0.045 |
| Occurrence_Category[T.Sexual Related Crimes & Crimes Against Children] | 0.0632 | 0.020 | 3.114 | 0.002 | 0.023 | 0.103 |
| Occurrence_Category[T.Vehicle Related] | 0.0253 | 0.021 | 1.223 | 0.221 | -0.015 | 0.066 |
| Occurrence_Category[T.Vehicle Related (inc. Impaired)] | 0.0435 | 0.013 | 3.253 | 0.001 | 0.017 | 0.070 |
| Occurrence_Category[T.Warrant] | 0.1451 | 0.012 | 11.804 | 0.000 | 0.121 | 0.169 |
| Occurrence_Category[T.Weapons] | 0.0567 | 0.020 | 2.880 | 0.004 | 0.018 | 0.095 |
| Occurrence_Category[T.Weapons & Homicide] | 0.4408 | 0.018 | 24.199 | 0.000 | 0.405 | 0.477 |
| Number_Arrest | 0.1956 | 0.001 | 152.262 | 0.000 | 0.193 | 0.198 |
| Omnibus: | 25894.269 | Durbin-Watson: | 2.017 | | | |
| Prob(Omnibus): | 0.000 | Jarque-Bera (JB): | 1951470.314 | | | |
| Skew: | 2.643 | Prob(JB): | 0.00 | | | |
| Kurtosis: | 38.072 | Cond. No. | 77.1 | | | |

Notes:
[1] Standard Errors assume that the covariance matrix of the errors is correctly specified.

Chi-Square Test Result

Perceived Race & StripSearch

```

observed frequencies:
  StripSearch          0      1
Perceived_Race
Black                15053  2299
East/Southeast Asian  4061   327
Indigenous           1620   287
Latino               1626   125
Middle-Eastern       2999   214
South Asian          3346   248
Unknown or Legacy    4506   493
White                24064  3338

Chi-squared statistic: 356.12485254652904
p-value: 6.017709683374717e-73
Degrees of freedom: 7
Expected frequencies:
[[15383.0263443  1968.9736557 ]
 [ 3890.08296443  497.91703557]
 [ 1690.60807046  216.39192954]
 [ 1552.30976999  198.69023001]
 [ 2848.41307309  364.58692691]
 [ 3186.18007615  407.81992385]
 [ 4431.75130793  567.24869207]
 [24292.62839365 3109.37160635]]

```

Perceived Race & Occurrence_Category

```

observed frequencies:
  Occurrence_Category  Assault  Assault & Other crimes against persons \
Perceived_Race
Black                2127                                1962
East/Southeast Asian  648                                595
Indigenous           186                                220
Latino               284                                235
Middle-Eastern       475                                378
South Asian          490                                452
Unknown or Legacy    598                                578
White                2916                                2758

Occurrence_Category  Break & Enter  Crimes against Children  Drug Related \
Perceived_Race
Black                280                                9              942
East/Southeast Asian  81                                9              209
Indigenous           68                                1              57
Latino               36                                2              29
Middle-Eastern       41                                2              82
South Asian          40                                6              114
Unknown or Legacy    100                               13             224
White                1069                               27            1076

Occurrence_Category  FTA/FTC, Compliance Check & Parollee \
Perceived_Race
Black                1009
East/Southeast Asian  197
Indigenous           130
Latino               89
Middle-Eastern       176
South Asian          189
Unknown or Legacy    288
White                1670

```

| | | | |
|----------------------|-----------------------------------|-------|---|
| Occurrence_Category | FTA/FTC/Compliance Check/Parollee | Fraud | \ |
| Perceived_Race | | | |
| Black | 1122 | 118 | |
| East/Southeast Asian | 225 | 57 | |
| Indigenous | 162 | 2 | |
| Latino | 113 | 14 | |
| Middle-Eastern | 193 | 21 | |
| South Asian | 210 | 35 | |
| Unknown or Legacy | 247 | 70 | |
| White | 1968 | 156 | |

| | | | | |
|----------------------|--------------------------|------------------------|-----|---|
| Occurrence_Category | Harassment & Threatening | Harassment/Threatening | ... | \ |
| Perceived_Race | | | ... | |
| Black | 328 | 338 | ... | |
| East/Southeast Asian | 63 | 102 | ... | |
| Indigenous | 22 | 29 | ... | |
| Latino | 41 | 43 | ... | |
| Middle-Eastern | 84 | 105 | ... | |
| South Asian | 90 | 71 | ... | |
| Unknown or Legacy | 106 | 122 | ... | |
| White | 522 | 534 | ... | |

| | | | |
|----------------------|----------------------------|-----------------|---|
| Occurrence_Category | Police Category - Incident | Robbery & Theft | \ |
| Perceived_Race | | | |
| Black | 144 | 1064 | |
| East/Southeast Asian | 54 | 280 | |
| Indigenous | 14 | 149 | |
| Latino | 15 | 87 | |
| Middle-Eastern | 33 | 204 | |
| South Asian | 24 | 255 | |
| Unknown or Legacy | 42 | 341 | |
| White | 235 | 2110 | |

| | | | |
|----------------------|---------------|----------------------|---|
| Occurrence_Category | Robbery/Theft | Sexual Related Crime | \ |
| Perceived_Race | | | |
| Black | 916 | 240 | |
| East/Southeast Asian | 238 | 68 | |
| Indigenous | 126 | 8 | |
| Latino | 78 | 42 | |
| Middle-Eastern | 167 | 75 | |
| South Asian | 177 | 62 | |
| Unknown or Legacy | 282 | 100 | |
| White | 1763 | 244 | |

| | | |
|----------------------|---|-----|
| Occurrence_Category | Sexual Related Crimes & Crimes Against Children | \ |
| Perceived_Race | | |
| Black | | 200 |
| East/Southeast Asian | | 59 |
| Indigenous | | 9 |
| Latino | | 26 |
| Middle-Eastern | | 51 |
| South Asian | | 66 |
| Unknown or Legacy | | 103 |
| White | | 269 |

| | | | |
|----------------------|-----------------|---------------------------------|---|
| Occurrence_Category | Vehicle Related | Vehicle Related (inc. Impaired) | \ |
| Perceived_Race | | | |
| Black | 221 | 500 | |
| East/Southeast Asian | 80 | 174 | |
| Indigenous | 4 | 8 | |
| Latino | 31 | 65 | |
| Middle-Eastern | 62 | 125 | |
| South Asian | 72 | 212 | |
| Unknown or Legacy | 65 | 214 | |
| White | 233 | 679 | |

| | | | |
|----------------------|---------|---------|--------------------|
| Occurrence_Category | Warrant | Weapons | Weapons & Homicide |
| Perceived_Race | | | |
| Black | 1235 | 495 | 492 |
| East/Southeast Asian | 200 | 51 | 50 |
| Indigenous | 170 | 25 | 23 |
| Latino | 99 | 27 | 25 |
| Middle-Eastern | 159 | 55 | 63 |
| South Asian | 140 | 70 | 31 |
| Unknown or Legacy | 273 | 82 | 84 |
| White | 2083 | 300 | 315 |

Chi-squared statistic: 2751.6587949730747

p-value: 0.0

Degrees of freedom: 203

Expected frequencies:

```
[ [2.07452633e+03 1.92788063e+03 4.60617899e+02 1.85321487e+01
 7.34034238e+02 1.00664483e+03 1.13878711e+03 1.27039222e+02
 3.37338823e+02 3.60974027e+02 1.93378943e+01 3.65808501e+02
 1.57388973e+02 6.41910658e+01 3.54528062e+02 4.59812154e+02
 5.26420456e+02 2.53541281e+02 6.26870074e+02 1.04344055e+03
 1.50674427e+02 1.20593258e+03 1.00637625e+03 2.25340185e+02
 2.10299601e+02 2.06270873e+02 5.30986348e+02 1.17074835e+03
 2.96782961e+02 2.90874160e+02 ]
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 1.85623688e+02 2.54561867e+02 2.87978206e+02 3.21258707e+01
 8.53067517e+01 9.12836579e+01 4.89019596e+00 9.25062069e+01
 3.98007615e+01 1.62327338e+01 8.96535925e+01 1.16277993e+02
 1.33122001e+02 6.41159025e+01 1.58523852e+02 2.63866824e+02
 3.81027768e+01 3.04958053e+02 2.54493948e+02 5.69843668e+01
 5.31808810e+01 5.21620902e+01 1.34276631e+02 2.96060614e+02
 7.50509241e+01 7.35566975e+01 ]
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 1.65592515e+01 1.32533046e+02 1.10601631e+02 2.47650837e+01
 2.31121103e+01 2.26693496e+01 5.83558648e+01 1.28666269e+02
 3.26167074e+01 3.19673250e+01 ]
[ 2.09341609e+02 1.94543510e+02 4.64812092e+01 1.87008947e+00
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 3.40410488e+01 3.64260905e+01 1.95139770e+00 3.69139399e+01
 1.58822091e+01 6.47755626e+00 3.57756246e+01 4.63999009e+01
 5.31213819e+01 2.55849921e+01 6.32578089e+01 1.05294168e+02
 1.52046404e+01 1.21691329e+02 1.01553989e+02 2.27392038e+01
 2.12214500e+01 2.08149088e+01 5.35821286e+01 1.18140869e+02
 2.99485342e+01 2.93522738e+01 ]
[ 3.84131691e+02 3.56977897e+02 8.52907625e+01 3.43152339e+00
 1.35918165e+02 1.86396372e+02 2.10864626e+02 2.35233415e+01
 6.24636721e+01 6.68401077e+01 3.58072006e+00 6.77352877e+01
 2.91430827e+01 1.18860013e+01 6.56465344e+01 8.51415658e+01
 9.74751571e+01 4.69472185e+01 1.16075009e+02 1.93209686e+02
 2.78997771e+01 2.23297681e+02 1.86346640e+02 4.17253351e+01
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 5.49541064e+01 5.38599975e+01 ]

[ 4.29682321e+02 3.99308609e+02 9.54046064e+01 3.83843606e+00
 1.52035446e+02 2.08499396e+02 2.35869114e+02 2.63127573e+01
 6.98706622e+01 7.47660589e+01 4.00532458e+00 7.57673900e+01
 3.25988917e+01 1.32954524e+01 7.34309507e+01 9.52377179e+01
 1.09033836e+02 5.25142556e+01 1.29839272e+02 2.16120639e+02
 3.12081540e+01 2.49776491e+02 2.08443767e+02 4.66731573e+01
 4.35579048e+01 4.27234622e+01 1.09979538e+02 2.42489026e+02
 6.14706064e+01 6.02467573e+01 ]
[ 5.97657741e+02 5.55410055e+02 1.32701065e+02 5.33899328e+00
 2.11470560e+02 2.90007925e+02 3.28077268e+02 3.65991858e+01
 9.71851531e+01 1.03994304e+02 5.57112343e+00 1.05387085e+02
 4.53427545e+01 1.84930347e+01 1.02137263e+02 1.32468935e+02
 1.51658360e+02 7.30436182e+01 1.80597251e+02 3.00608535e+02
 4.34083367e+01 3.47421447e+02 2.89930548e+02 6.49190632e+01
 6.05859672e+01 5.94253165e+01 1.52973764e+02 3.37285097e+02
 8.55012692e+01 8.37989815e+01 ]
[ 3.27605869e+03 3.04447816e+03 7.27400396e+02 2.92656719e+01
 1.15917509e+03 1.58967737e+03 1.79835433e+03 2.00618302e+02
 5.32720057e+02 5.70044392e+02 3.05380924e+01 5.77678915e+02
 2.48546141e+02 1.01369501e+02 5.59865028e+02 7.26127976e+02
 8.31314739e+02 4.00388323e+02 9.89943163e+02 1.64778457e+03
 2.37942637e+02 1.90438938e+03 1.58925323e+03 3.55853605e+02
 3.32101755e+02 3.25739653e+02 8.38525122e+02 1.84882701e+03
 4.68674891e+02 4.59343807e+02 ] ]
```


Occurrence_Category & StripSearch

observed frequencies:

| Occurrence_Category | Assault | Assault & Other crimes against persons | \ |
|---------------------|---------|--|---|
| StripSearch | | | |

| | | | |
|---|------|------|--|
| 0 | 7620 | 5807 | |
|---|------|------|--|

| | | | |
|---|-----|------|--|
| 1 | 104 | 1371 | |
|---|-----|------|--|

| Occurrence_Category | Break & Enter | Crimes against Children | Drug Related | \ |
|---------------------|---------------|-------------------------|--------------|---|
| StripSearch | | | | |

| | | | | |
|---|------|----|------|--|
| 0 | 1323 | 69 | 1674 | |
|---|------|----|------|--|

| | | | | |
|---|-----|---|------|--|
| 1 | 392 | 0 | 1059 | |
|---|-----|---|------|--|

| Occurrence_Category | FTA/FTC, Compliance Check & Parollee | \ |
|---------------------|--------------------------------------|---|
| StripSearch | | |

| | | |
|---|------|--|
| 0 | 2636 | |
|---|------|--|

| | | |
|---|------|--|
| 1 | 1112 | |
|---|------|--|

| Occurrence_Category | FTA/FTC/Compliance Check/Parollee | Fraud | \ |
|---------------------|-----------------------------------|-------|---|
| StripSearch | | | |

| | | | |
|---|------|-----|--|
| 0 | 4154 | 473 | |
|---|------|-----|--|

| | | | |
|---|----|---|--|
| 1 | 86 | 0 | |
|---|----|---|--|

| Occurrence_Category | Harassment & Threatening | Harassment/Threatening | ... | \ |
|---------------------|--------------------------|------------------------|-----|---|
| StripSearch | | | | |

| | | | |
|---|------|------|-----|
| 0 | 1007 | 1337 | ... |
|---|------|------|-----|

| | | | |
|---|-----|---|-----|
| 1 | 249 | 7 | ... |
|---|-----|---|-----|

| Occurrence_Category | Police Category - Incident | Robbery & Theft | \ |
|---------------------|----------------------------|-----------------|---|
| StripSearch | | | |

| | | |
|---|-----|------|
| 0 | 560 | 3768 |
|---|-----|------|

| | | |
|---|---|-----|
| 1 | 1 | 722 |
|---|---|-----|

| Occurrence_Category | Robbery/Theft | Sexual Related Crime | \ |
|---------------------|---------------|----------------------|---|
| StripSearch | | | |

| | | |
|---|------|-----|
| 0 | 3685 | 831 |
|---|------|-----|

| | | |
|---|----|---|
| 1 | 62 | 8 |
|---|----|---|

| Occurrence_Category | Sexual Related Crimes & Crimes Against Children | \ |
|---------------------|---|---|
| StripSearch | | |

| | |
|---|-----|
| 0 | 699 |
|---|-----|

| | |
|---|----|
| 1 | 84 |
|---|----|

| Occurrence_Category | Vehicle Related | Vehicle Related (inc. Impaired) | \ |
|---------------------|-----------------|---------------------------------|---|
| StripSearch | | | |

| | | |
|---|-----|------|
| 0 | 763 | 1879 |
|---|-----|------|

| | | |
|---|---|----|
| 1 | 5 | 98 |
|---|---|----|

| Occurrence_Category | Warrant | Weapons | Weapons & Homicide |
|---------------------|---------|---------|--------------------|
| StripSearch | | | |

| | | | |
|---|------|------|-----|
| 0 | 3493 | 1042 | 644 |
|---|------|------|-----|

| | | | |
|---|-----|----|-----|
| 1 | 866 | 63 | 439 |
|---|-----|----|-----|

Chi-squared statistic: 8547.072981535563

p-value: 0.0

Degrees of freedom: 29

Expected frequencies:

```
[[6847.53892827 6363.49487664 1520.39477757 61.17040213 2422.87984088
 3322.70532149 3758.8768845 419.32753924 1113.47862428 1191.49305018
 63.82998483 1207.45054639 519.50515432 211.88008854 1170.21638857
 1517.73519487 1737.59403151 836.88202334 2069.15534161 3444.15959818
 497.34196514 3980.50877627 3321.81879392 743.7966288 694.15108504
 680.85317153 1752.66500015 3864.37366498 979.61296164 960.10935517]
[ 876.46107173 814.50512336 194.60522243 7.82959787 310.12015912
 425.29467851 481.1231155 53.67246076 142.52137572 152.50694982
 8.17001517 154.54945361 66.49484568 27.11991146 149.78361143
 194.26480513 222.40596849 107.11797666 264.84465839 440.84040182
 63.65803486 509.49122373 425.18120608 95.2033712 88.84891496
 87.14682847 224.33499985 494.62633502 125.38703836 122.89064483]]
```