

DS5110:Group-Project

Importing packages

```
library(dplyr)
library(readr)
library(ggplot2)
library(tidyr)
library(gridExtra)
library(grid)
library(stringr)
library(tidyverse)
```

Importing Data

```
d <- "Datasets"
advCourse <- read_csv(file.path(d,"AdvancedCourseCompletion.csv"))
ap_part <- read_csv(file.path(d,"ap_participation.csv"))
ap_perf <- read_csv(file.path(d,"ap_performance.csv"))
art <- read_csv(file.path(d,"artcourse.csv"))
attendance <- read_csv(file.path(d,"attendance.csv"))
attrition <- read_csv(file.path(d,"AttritionReport.csv"))

classSizeByClass <- read_csv(file.path(d,"ClassSizebyGenPopulation.csv"))
classSizeByRace <- read_csv(file.path(d,"ClassSizebyRaceEthnicity.csv"))

dropOut <- read_csv(file.path(d,"dropout.csv"))

eduAge <- read_csv(file.path(d,"EducatorsbyAgeGroupsReport.csv"))
enrollByGrade <- read_csv(file.path(d,"enrollmentbygrade.csv"))

gradeStaff <- read_csv(file.path(d,"gradestaffing.csv"))
gradRate <- read_csv(file.path(d,"gradrates.csv"))
college <- read_csv(file.path(d,"Gradsattendingcollege.csv"))
mobilityRate <- read_csv(file.path(d,"mobilityrates.csv"))

StudReten <- read_csv(file.path(d,"retention2021.csv"))

sat <- read_csv(file.path(d,"sat_performance.csv"))
selectPop <- read_csv(file.path(d,"selectedpopulations.csv"))

daysMissed <- read_csv(file.path(d,"ssdr_days_missed.csv"))
eduGen <- read_csv(file.path(d,"staffracegender.csv"))
staffReten<- read_csv(file.path(d,"staffingretention.csv"))
discipline <- read_csv(file.path(d,"StudentDisciplineDataReport.csv"))

teachData <- read_csv(file.path(d,"teacherdata.csv"))
teachProg <- read_csv(file.path(d,"Teacherprogramarea.csv"))
```

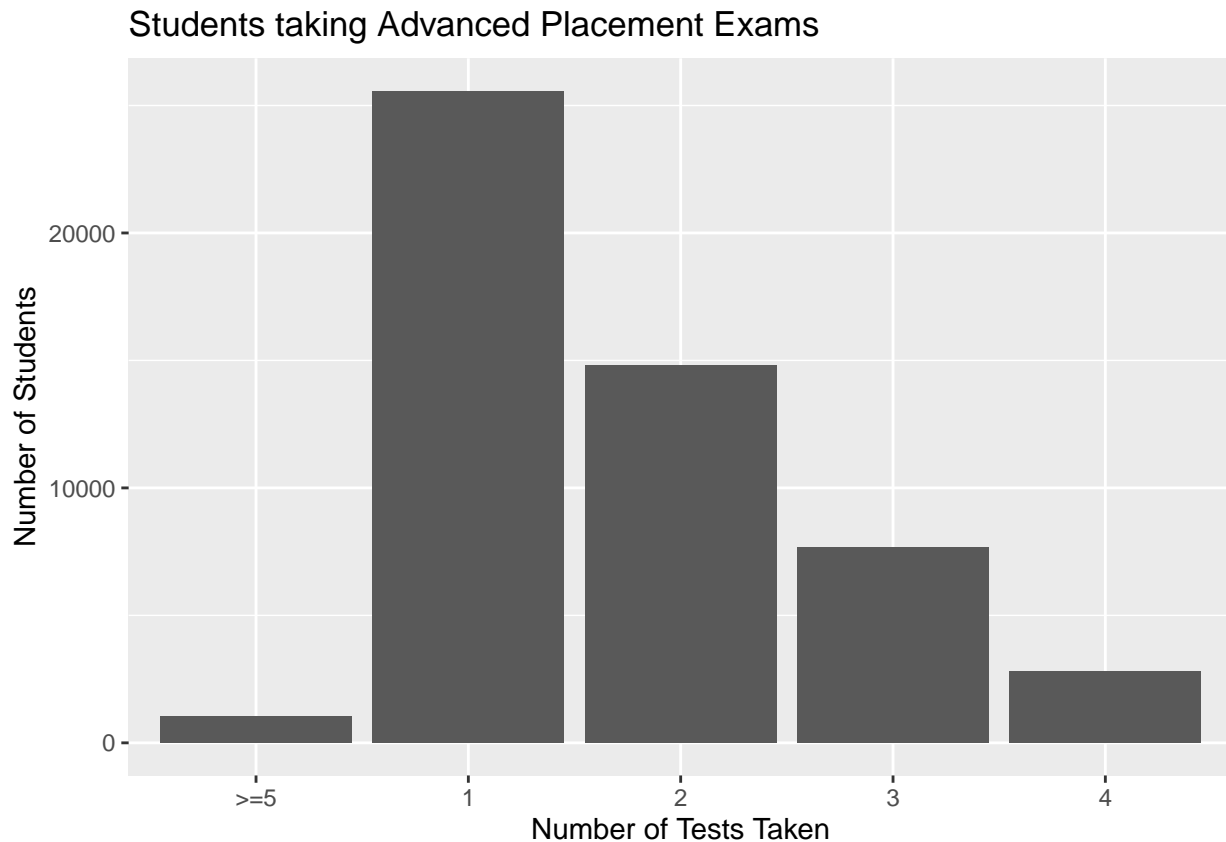
```
teacherSalary <- read_csv(file.path(d,"TeacherSalaries.csv"))
```

EDA

1. Number of students who took one or more Advanced Placement exams.

```
ap_part2 <- ap_part |>
  rename(`1`=`One Test`, `2`=`Two Tests`, `3`=`Three Tests`,
        `4`=`Four Tests`, `>=5`=`Five or More Tests`) |>
  select(!c(`Tests Taken`, `Tests Takers`)) |>
  filter(`District Code`!="00000000")

pivot_longer(ap_part2, cols=c(`1`, `2`, `3`, `4`, `>=5`), names_to = "TestsTaken", values_to = "TestTakers")
group_by(TestsTaken) |>
  summarise(TestTakers=sum(TestTakers, na.rm=TRUE)) |>
  ggplot(mapping=aes(x=`TestsTaken`, y=`TestTakers`)) +
  geom_bar(stat = "identity") +
  labs(title="Students taking Advanced Placement Exams",
       x="Number of Tests Taken", y="Number of Students")
```

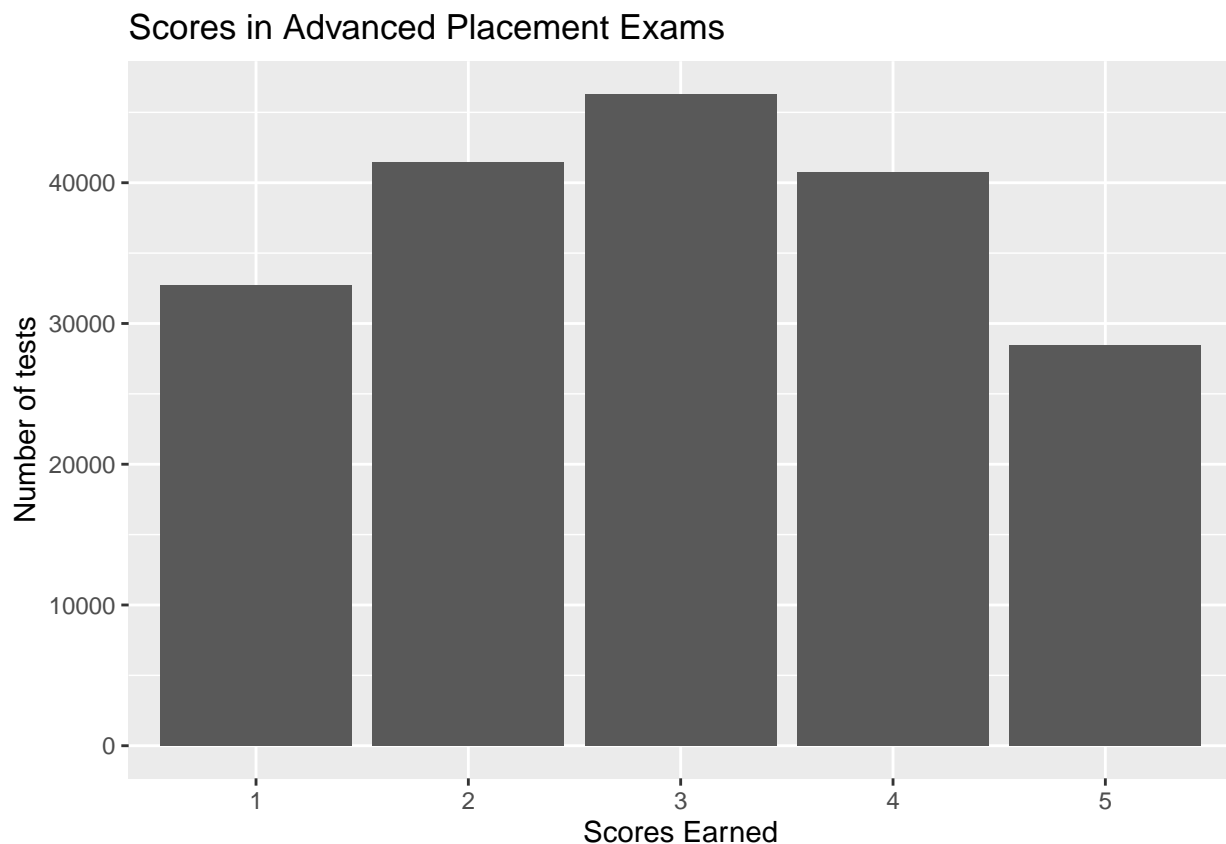


It shows that most of the students took placements exams **only once** while only less than 2500 students had to take 5 or more exams.

2. Percentage of tests taken by students with each possible score on the Advanced Placement exam.

```
ap_perf <- ap_perf |>
  select(!c(`% Score 1-2`, `% Score 3-5`)) |>
  filter(`District Code`!=0)
ap_perf <- ap_perf |> rename(`1`=`Score=1`, `2`=`Score=2`, `3`=`Score=3`,
                             `4`=`Score=4`, `5`=`Score=5`)

pivot_longer(ap_perf, cols=c(`1`, `2`, `3`, `4`, `5`),
              names_to = "Scores",
              values_to = "# of Tests") |>
  group_by(`Scores`) |>
  summarise(`Total`=sum(`# of Tests`, na.rm=TRUE)) |>
  ggplot(mapping=aes(x=`Scores`, y=`Total`)) +
  geom_bar(stat = "identity") +
  labs(title="Scores in Advanced Placement Exams",
       x="Scores Earned", y="Number of tests")
```

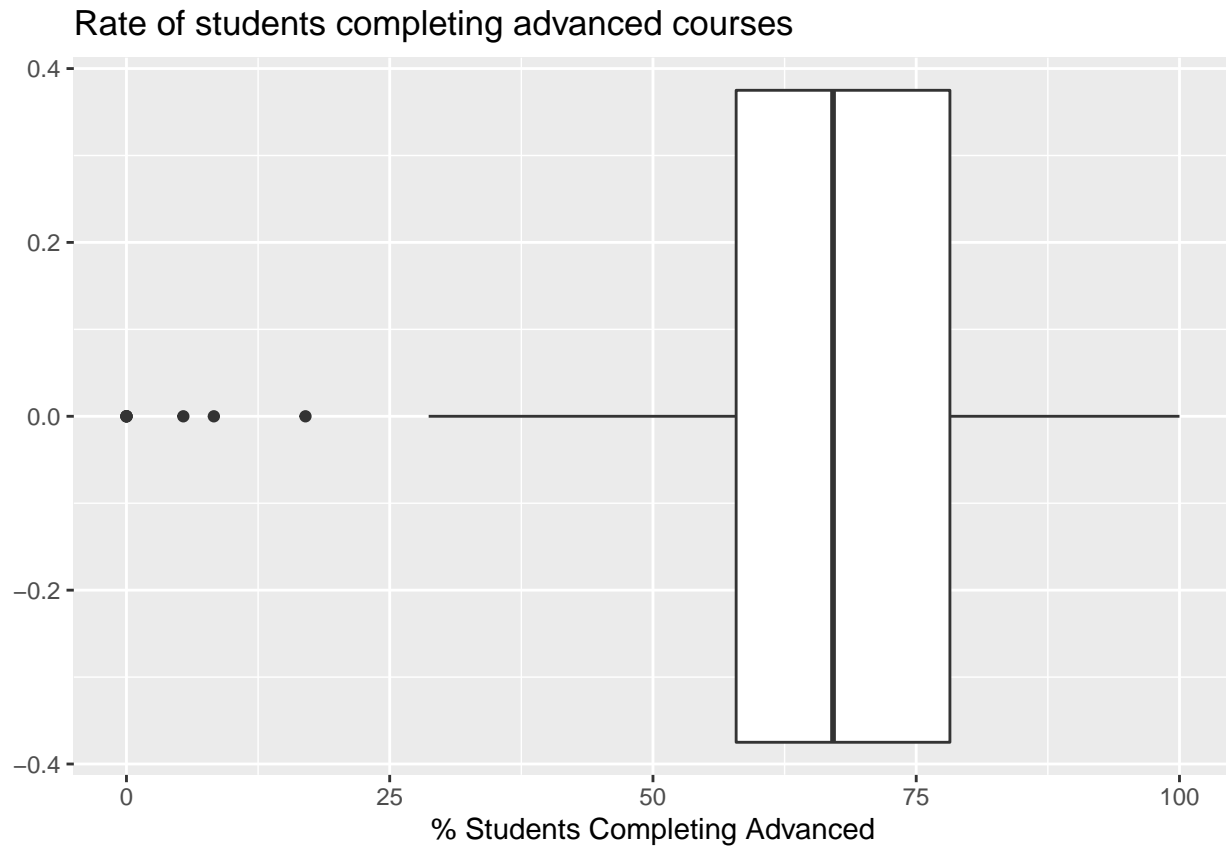


Above plot shows that most of the tests had a score of 3 while least number of tests had a score of 5. Since most of the students had taken the exam only once, it could be possible that most of them had a score of 3.

3. The rate of Grade 11 and 12 students completing advanced courses by subject area.

```
advCourse <- advCourse %>%
  select(!c(`Ch 74 Secondary Cooperative Program`, `# Students Completing Advanced`)) |>
  filter(`District Code`!="00000000")
```

```
advCourse |> ggplot( mapping=aes(`% Students Completing Advanced`)) +
  geom_boxplot() +
  labs(title="Rate of students completing advanced courses")
```



It shows that for some of the districts, all students completed the advanced courses while minimum rate was around 25% students. On an average, more than 62.5% of the students in 305 district entries were able to complete the courses.

Districts in which 100% or 0% students completed advanced courses .

```
advCourse |> select(`District Name`, `District Code`,
  `% Students Completing Advanced`,
  `# Grade 11 and 12 Students`) |>
  filter(`% Students Completing Advanced` == 100.0 |
    `% Students Completing Advanced` == 0 ) |>
  rename(`% Completion` = `% Students Completing Advanced`, `Student Count` = `# Grade 11 and 12 Students`)
```

```
## # A tibble: 10 x 4
##   `District Name`      `District Code` `% Completion` `Student Count`
##   <chr>              <chr>          <dbl>         <dbl>
## 1 Baystate Academy Charter Publ~ 35020000      100          102
## 2 Lowell Middlesex Academy Char~ 04580000       0           44
## 3 Ma Academy for Math and Scien~ 04680000      100          92
## 4 Martha's Vineyard Charter (Di~ 04660000      100          22
## 5 Phoenix Academy Public Charte~ 35180000       0           27
## 6 Phoenix Academy Public Charte~ 35080000       0           19
## 7 Phoenix Charter Academy (Dist~ 04930000       0           56
## 8 Pioneer Valley Chinese Immers~ 04970000      100          68
```

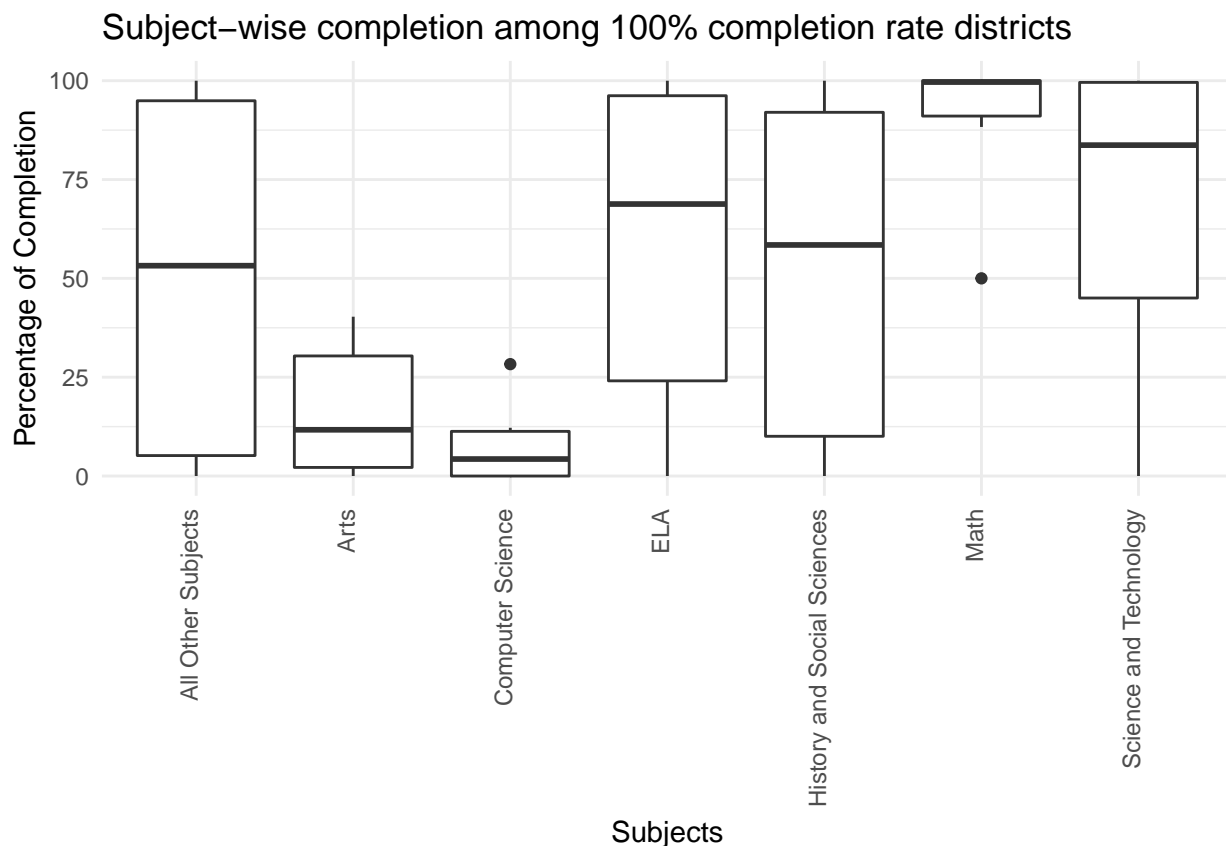
## 9 Saugus	02620000	100	343
## 10 Sturgis Charter Public (Distr~	04890000	100	407

It can be noticed that the districts with 0% completion has quite low number of students in grade 11 and 12 and except **Martha's Vineyard Charter (District)** and **Pioneer Valley Chinese Immersion Charter (District)** all other schools with 100% completion has comparatively high student count.

Plotting subject-wise Completions.

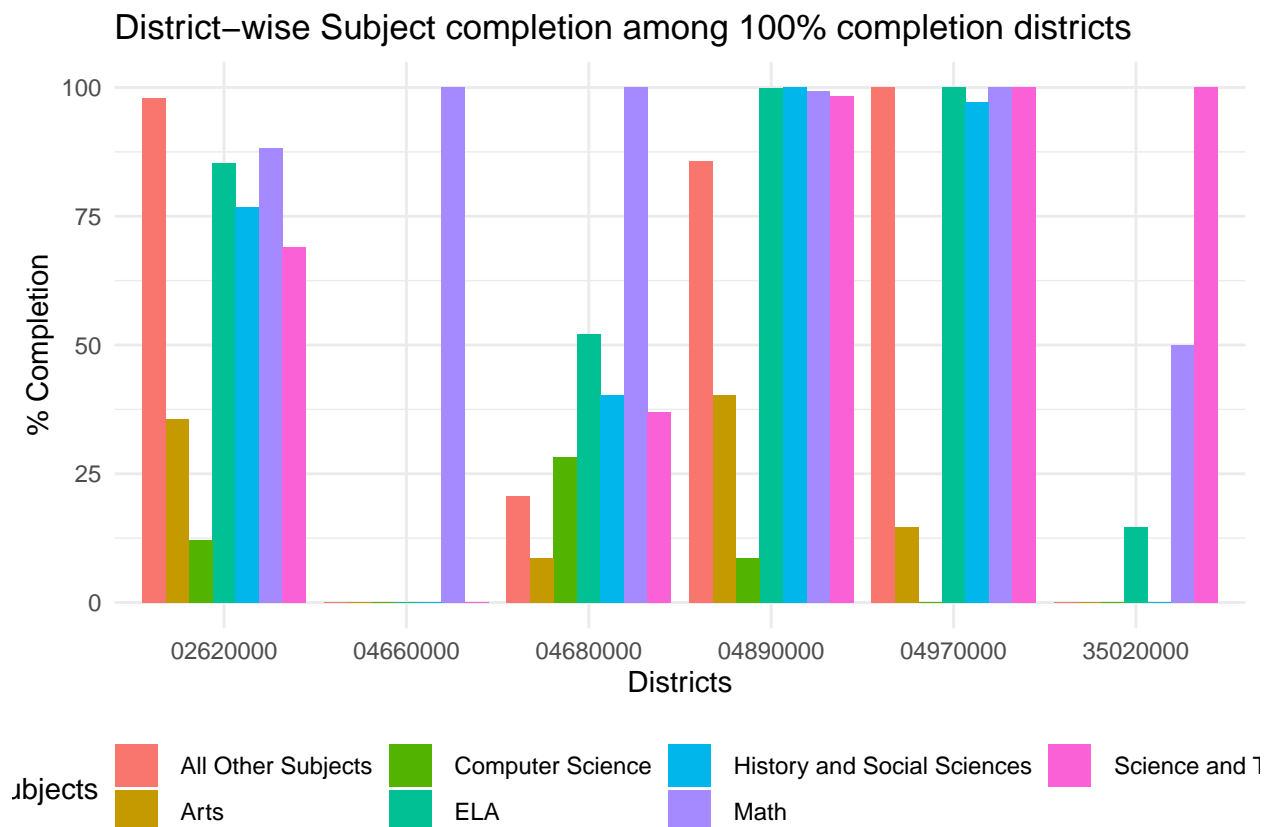
```
advCourse100 <- advCourse %>%
  rename(`% Science and Technology`=`% Science and Technology...8`,
         `% Computer Science` = `% Science and Technology...9`) %>%
  pivot_longer( cols=c(`% ELA`, `% Math`, `% Science and Technology`,
                      `% Computer Science`,
                      `% History and Social Sciences`, `% Arts`,
                      `% All Other Subjects`),
               names_to = "Subject",
               values_to = "% Completion") |>
  mutate(Subject=gsub("%","",Subject)) |>
  filter(`% Students Completing Advanced` == 100.0)

advCourse100 |>
  ggplot( mapping=aes(x=factor(`Subject`),y=`% Completion`)) +
  geom_boxplot() +
  labs(title="Subject-wise completion among 100% completion rate districts",
       x="Subjects", y="Percentage of Completion") +
  theme_minimal() +
  theme(axis.text.x = element_text(angle = 90, vjust = 0.1, hjust=1))
```



Clearly, the highest completion has been for Math while surprisingly for Computer Science, it has been the least.

```
advCourse100|>
  ggplot(mapping=aes(x=factor(`District Code`),y=`% Completion`,
                      fill = `Subject`))+
  geom_bar(position="dodge", stat="identity")+
  theme_minimal()+
  theme(legend.position = "bottom") +
  labs(title="District-wise Subject completion among 100% completion districts",
       x="Districts", y="% Completion",
       fill="Subjects")
```



For district code **4660000**, only math has been completed and which is why it seems to join the 100% completion club! Since, we noticed before, it has only 22 students which is really less compared to rest of the other schools that had 100% completion rate. District code **4970000**, has done really well as it only had 68 students as compared to district code **4890000**, that had 407 students!

4. Dropouts

```
dropOut |> rename(`# Enrolled 9-12` =`# Enrolled Grades 09 through 12`,
                  `Dropout`=`# Dropout All Grades`) |>
  select(`District Code`,`# Enrolled 9-12`,`Dropout`,`District Name`) |> drop_na() |>
  filter(`District Code`!="00000000") |>
  filter(`Dropout`== max(Dropout))
```

```
## # A tibble: 1 x 4
##   `District Code` `# Enrolled 9-12` Dropout `District Name`
```

```
##      <chr>                <dbl>   <dbl> <chr>
## 1 00350000             14342     292 Boston
```

Boston has the maximum number of dropouts!

Analyzing data with the responses.

Tran's work starts here.

```
eduGen <- eduGen %>%
  rename(
    'District Code' = 'District/School Code')

# daysMissed <- daysMissed %>%
#   rename(
#     'District_code' = 'District Code')
#
# selectPop <- selectPop %>%
#   rename(
#     'District_code' = 'District Code')
#
#
# mobilityRate <- mobilityRate %>%
#   rename(
#     'District_code' = 'District Code')
```

1. Teacher Salary vs. Graduation Rate

```
gradRate_teacherSalary <- left_join(gradRate, teacherSalary, by="District Code")

gradRate_teacherSalary <- gradRate_teacherSalary %>%
  rename(
    'percent_graduated' = '% Graduated')

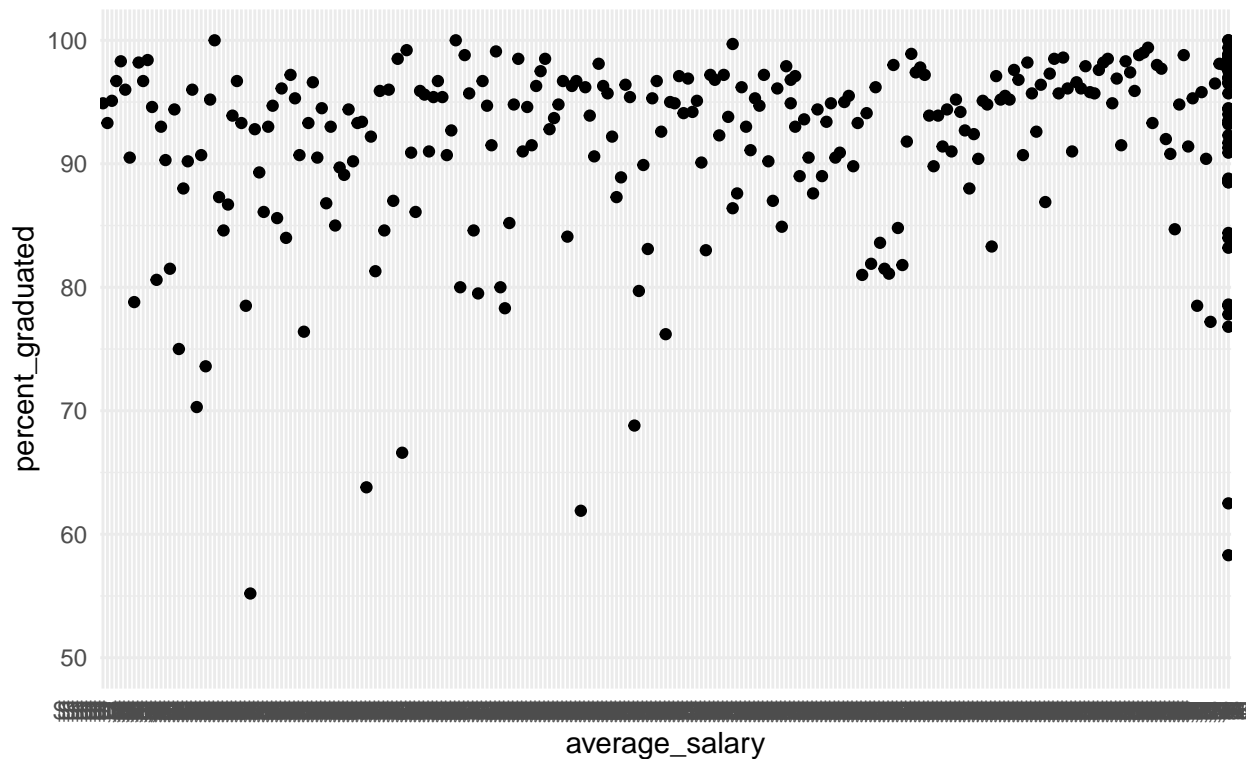
gradRate_teacherSalary <- gradRate_teacherSalary %>%
  rename(
    'average_salary' = 'Average Salary')

# print(gradRate_teacherSalary)
```

```
gradRate_teacherSalary_graph <-
  ggplot(gradRate_teacherSalary, aes(x = average_salary,
                                     y = percent_graduated )) + geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          Average teacher salary") + geom_smooth(method=lm) + ylim(50,100)

gradRate_teacherSalary_graph
```

Graduate rate percentage vs.
Average teacher salary



2. Teacher Data vs. Graduation Rate

```
gradRate_teacherData <- left_join(gradRate, teachData, by="District Code")
```

```
gradRate_teacherData <- gradRate_teacherData %>%
  rename(
    'percent_graduated' = '% Graduated')
```

```
gradRate_teacherData <- gradRate_teacherData %>%
  rename(
    'experienced_teacher_percent' = 'Percent of Experienced Teachers')
```

```
gradRate_teacherData <- gradRate_teacherData %>%
  rename(
    'student_teacher_ratio' = 'Student / Teacher Ratio')
```

```
# print(gradRate_teacherData)
```

```
gradRate_teacherData <- gradRate_teacherData %>%
  mutate_at("student_teacher_ratio", str_replace, "to 1", "")
```

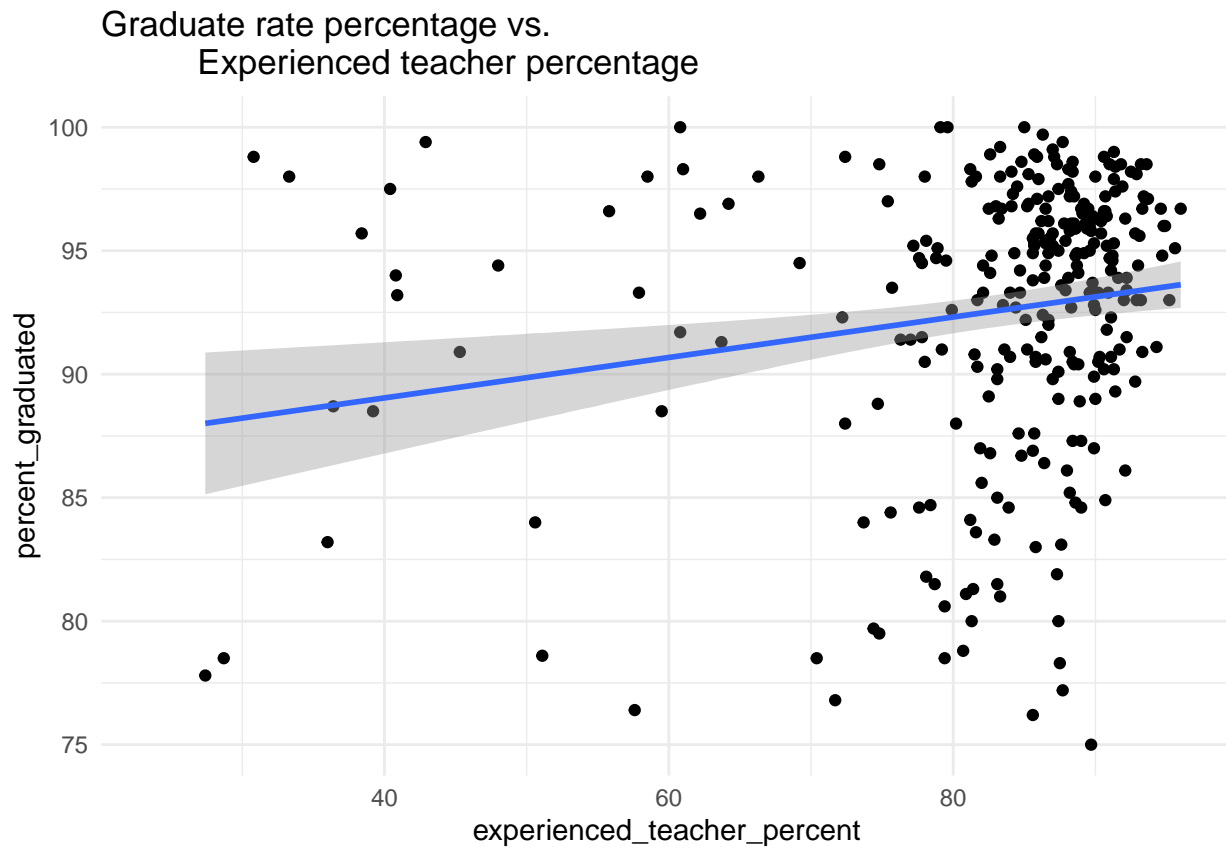
```
# print(gradRate_teacherData)
```

```
gradRate_teacherData_graph <-
  ggplot(gradRate_teacherData, aes(x = experienced_teacher_percent,
    y = percent_graduated )) + geom_point() +
```



```
theme_minimal() +
ggtitle("Graduate rate percentage vs.
        Experienced teacher percentage") + geom_smooth(method=lm) +
ylim(75, 100)
```

gradRate_teacherData_graph

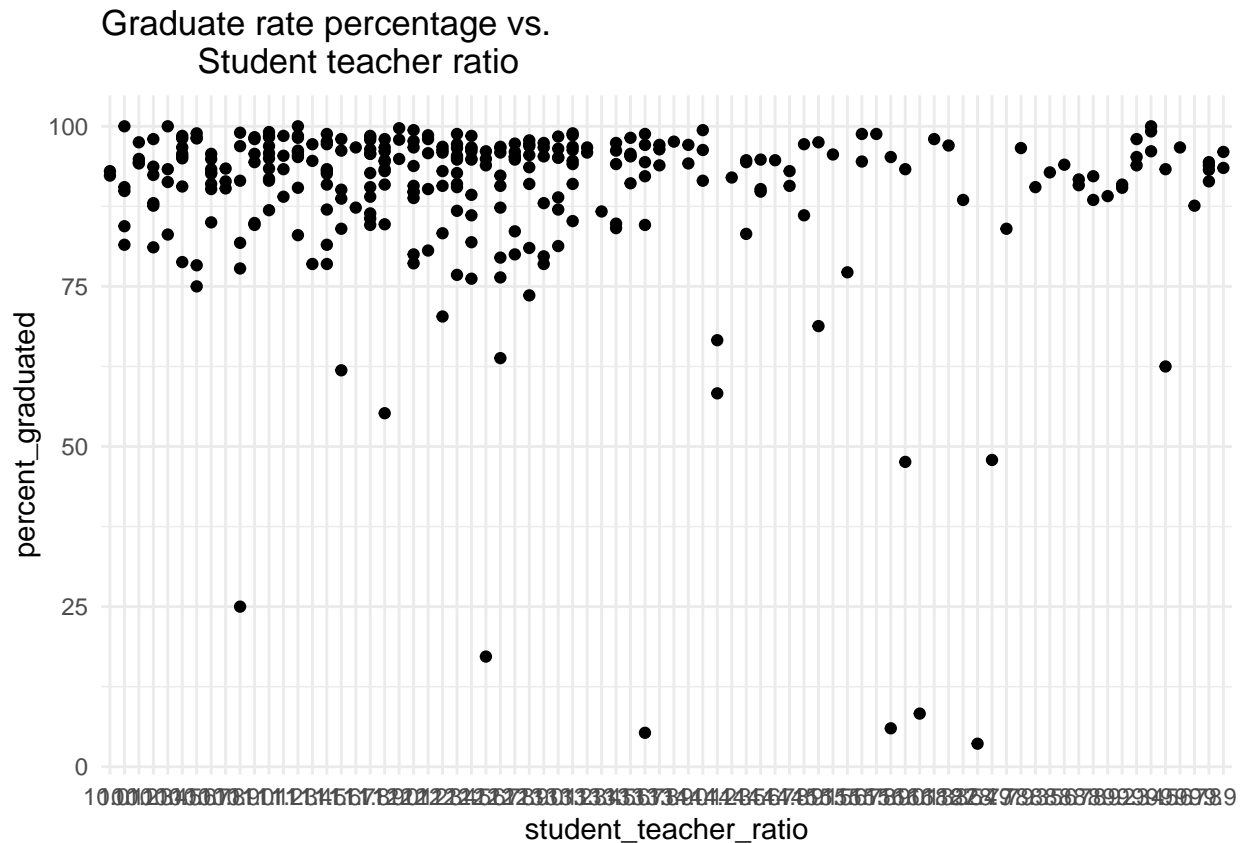


Observation: there is a correlation; the more experienced teacher, the higher graduation rate.

```
StudentTeacherRatio_graph <-
  ggplot(gradRate_teacherData, aes(x = student_teacher_ratio,
                                   y = percent_graduated )) + geom_point() +

  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          Student teacher ratio") + geom_smooth(method=lm)
```

StudentTeacherRatio_graph



3. Student Discipline vs. Graduation Rate

```
gradRate_discipline <- left_join(gradRate, discipline, by="District Code")
gradRate_discipline <- na.omit(gradRate_discipline)

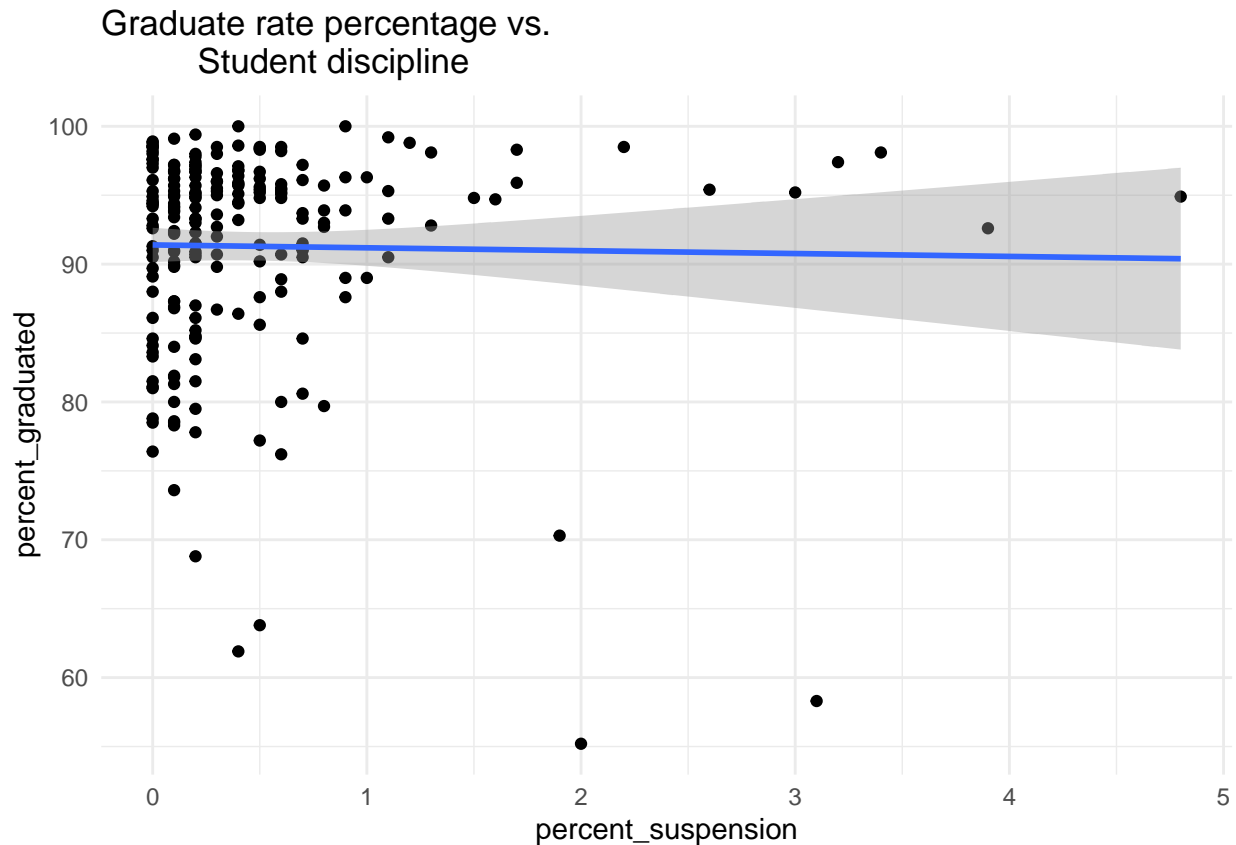
gradRate_discipline <- gradRate_discipline %>%
  rename(
    'percent_graduated' = '% Graduated')

gradRate_discipline <- gradRate_discipline %>%
  rename(
    'percent_suspension' = '% In-School Suspension')

# print(gradRate_discipline)

gradRate_discipline_graph <-
  ggplot(gradRate_discipline, aes(x = percent_suspension,
                                y = percent_graduated )) + geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          Student discipline") + geom_smooth(method=lm)

gradRate_discipline_graph
```



4. Demographic vs. Graduation Rate

```
gradRate_demographic <- left_join(gradRate, eduGen, by="District Code")
gradRate_demographic <- na.omit(gradRate_demographic)

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'percent_graduated' = '% Graduated')

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'African_American' = 'African American (#)')
gradRate_demographic <- gradRate_demographic %>%
  rename(
    'White' = 'White (#)')

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'Asian' = 'Asian (#)')

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'Hispanic' = 'Hispanic (#)')

gradRate_demographic <- gradRate_demographic %>%
```

```

rename(
  'Native_American' = 'Native American (#)')

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'Hawaiian_Pacific_Islander' = 'Native Hawaiian, Pacific Islander (#)')

gradRate_demographic <- gradRate_demographic %>%
  rename(
    'Multi_race_non_Hispanic' = 'Multi-Race,Non-Hispanic (#)')

gradRate_demographic_long <- pivot_longer(gradRate_demographic, cols=11:17,
                                           names_to = "Race",
                                           values_to = "Race_number")

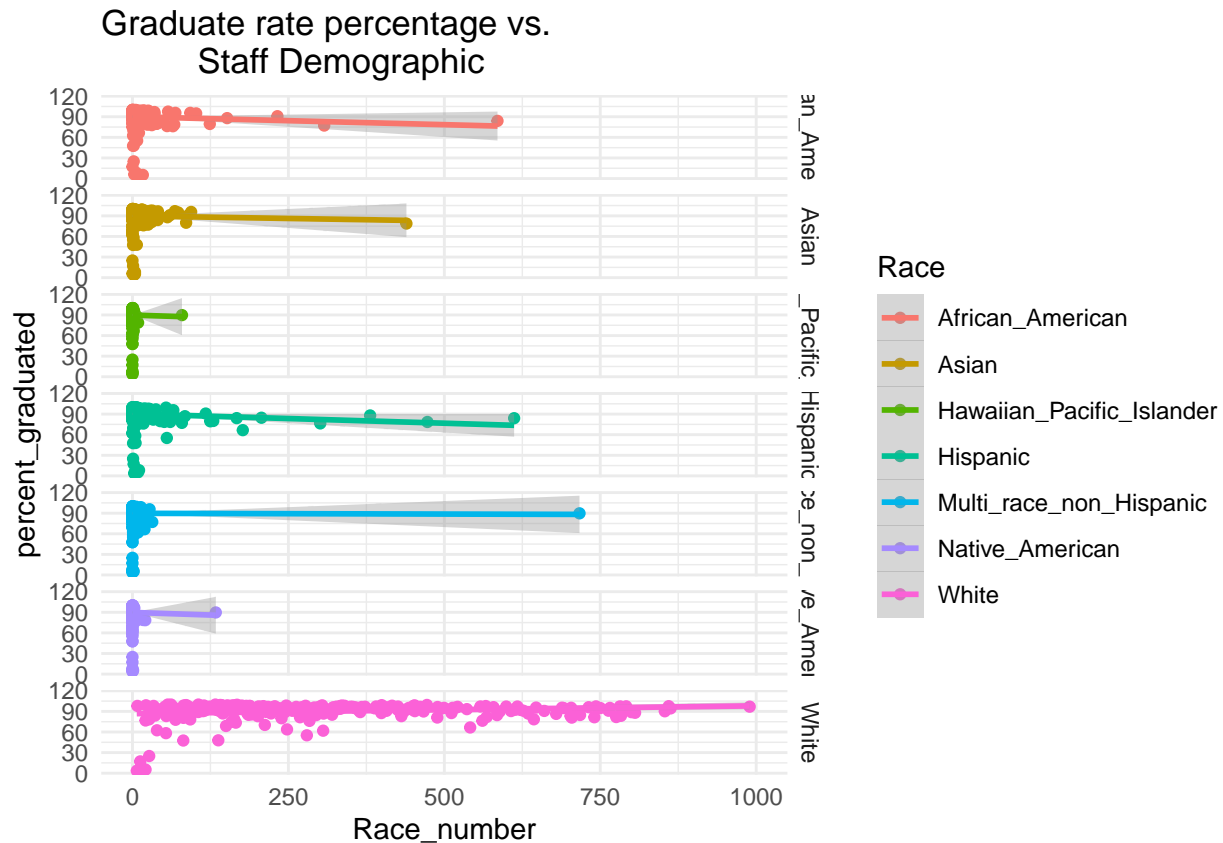
print(gradRate_demographic_long)

## # A tibble: 2,135 x 15
##   `District Name`      `District Code` `# in Cohort` percent_graduat~
##   <chr>                <chr>          <dbl>          <dbl>
## 1 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 2 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 3 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 4 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 5 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 6 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 7 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 8 Abington            00010000     163          93.3
## 9 Abington            00010000     163          93.3
## 10 Abington           00010000     163          93.3
## # ... with 2,125 more rows, and 11 more variables: % Still in School <dbl>,
## #   % Non-Grad Completers <dbl>, % H.S. Equiv. <dbl>, % Dropped Out <dbl>,
## #   % Permanently Excluded <dbl>, District/School Name <chr>,
## #   Females (#) <dbl>, Males (#) <dbl>, FTE Count <dbl>, Race <chr>,
## #   Race_number <dbl>

gradRate_demographic_graph <-
  ggplot(gradRate_demographic_long, aes(x = Race_number,
                                         y = percent_graduated, color = Race)) +
  geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          Staff Demographic") + xlim(0, 1000) + facet_grid(Race ~.) +
  geom_smooth(method=lm)

gradRate_demographic_graph

```



5. Staffing Retention vs. Graduation Rate

```
gradRate_staffingRetention <- left_join(gradRate, staffReten,
                                         by="District Code")
gradRate_staffingRetention <- na.omit(gradRate_staffingRetention)
print(gradRate_staffingRetention)
```

```
## # A tibble: 306 x 19
##   `District Name.` `District Code` `# in Cohort` `% Graduated` `% Still in Sch-`
##   <chr>           <chr>           <dbl>           <dbl>           <dbl>
## 1 Abby Kelley Fos~ 04450000           82           98.8           0
## 2 Abington         00010000          163           93.3           2.5
## 3 Academy Of the ~ 04120000           59           93.2           6.8
## 4 Acton-Boxborough 06000000          439           97.3           2.1
## 5 Advanced Math a~ 04300000          141           98.6           1.4
## 6 Agawam           00050000          286           90.9           2.1
## 7 Amesbury         00070000          161           90.1           5.6
## 8 Amherst-Pelham   06050000          232           91.8           5.2
## 9 Andover          00090000          460           97.6           1.7
## 10 Argosy Collegia~ 35090000           60           58.3           25
## # ... with 296 more rows, and 14 more variables: % Non-Grad Completers <dbl>,
## # % H.S. Equiv. <dbl>, % Dropped Out <dbl>, % Permanently Excluded <dbl>,
## # District Name.y <chr>, Superintendent Total <dbl>,
## # Superintendent # Retained <dbl>, Superintendent % Retained <dbl>,
## # Principal Total <dbl>, Principal # Retained <dbl>,
```

```
## # Principal % Retained <dbl>, Teacher Total <dbl>, Teacher # Retained <dbl>,
## # Teacher % Retained <dbl>
```

6. Graduation Rate vs. Day missed

```
daysMissed$District_code <- str_pad(daysMissed$`District Code`, 8, pad = "0")
```

```
# gradRateRename <- gradRate %>%
#   rename(
#     'District_code' = 'District Code')
```

```
print(daysMissed)
```

```
## # A tibble: 401 x 10
##   `District Name`      `District Code` Students `Students Discip~` `% 1 Day`
##   <chr>                <chr>          <dbl>         <dbl>         <dbl>
## 1 Abby Kelley Foster Char~ 04450000      1437           2           NA
## 2 Abington              00010000      2214          41           0.5
## 3 Academy Of the Pacific ~ 04120000       544           6           0.6
## 4 Acton-Boxborough       06000000     5320           8           0.1
## 5 Acushnet               00030000       940           6           0.4
## 6 Advanced Math and Scien~ 04300000       974          13           0.5
## 7 Agawam                 00050000     3624          14           0.1
## 8 Alma del Mar Charter Sc~ 04090000       808          17           1.4
## 9 Amesbury               00070000     2009           0           NA
## 10 Amherst               00080000     1103           0           NA
## # ... with 391 more rows, and 5 more variables: % 2 to 3 Days <dbl>,
## #   % 4 to 7 Days <dbl>, % 8 to 10 Days <dbl>, % > 10 Days <dbl>,
## #   District_code <chr>
```

```
gradRate_daysMissed <- left_join(gradRate, daysMissed, by="District Code")
gradRate_daysMissed <- na.omit(gradRate_daysMissed)
```

```
gradRate_daysMissed <- gradRate_daysMissed %>%
  rename(
    'percent_graduated' = '% Graduated')
```

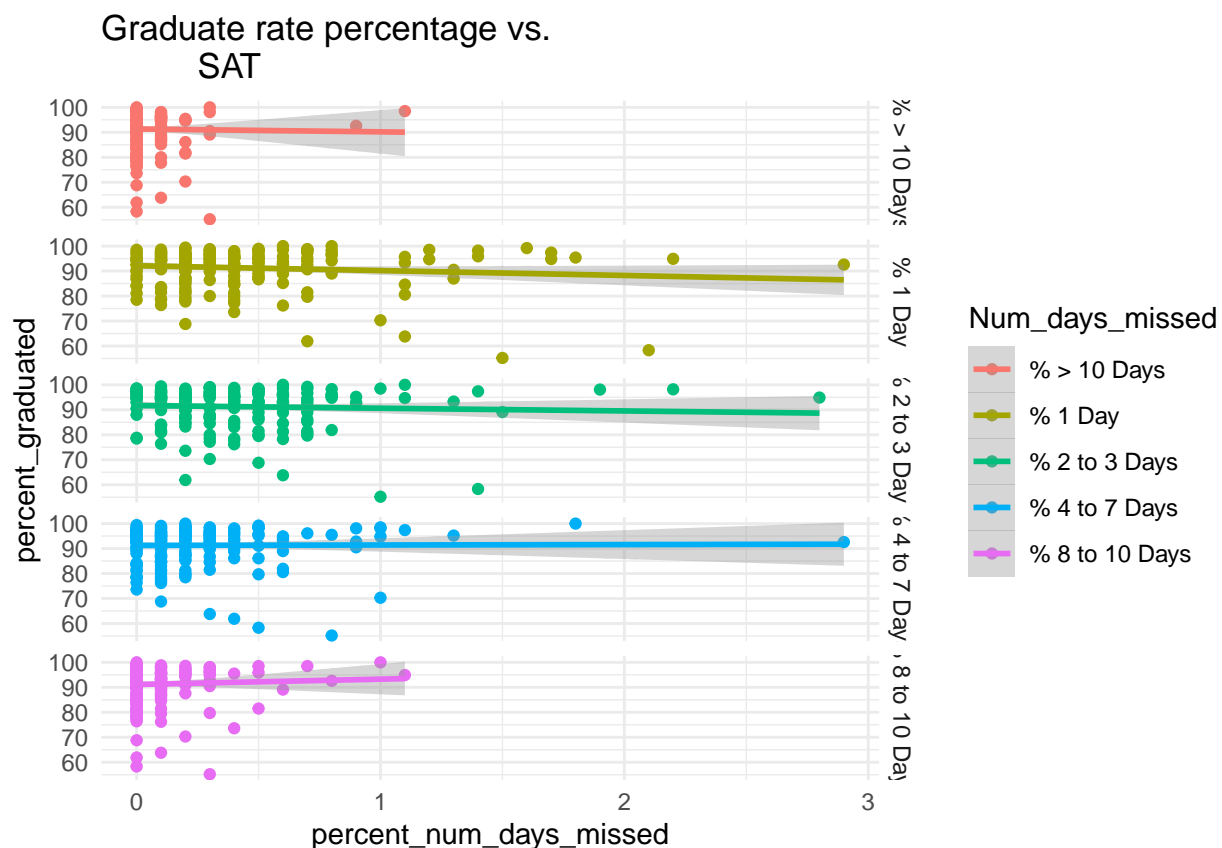
```
gradRate_daysMissed_long <- pivot_longer(gradRate_daysMissed, cols=13:17,
  names_to = "Num_days_missed",
  values_to = "percent_num_days_missed")
```

```
print(gradRate_daysMissed_long)
```

```
## # A tibble: 1,065 x 15
##   `District Name.x`      `District Code` `# in Cohort` percent_graduat~
##   <chr>                <chr>          <dbl>         <dbl>
## 1 Abington              00010000       163          93.3
## 2 Abington              00010000       163          93.3
## 3 Abington              00010000       163          93.3
## 4 Abington              00010000       163          93.3
## 5 Abington              00010000       163          93.3
## 6 Academy Of the Pacific Rim Ch~ 04120000        59          93.2
## 7 Academy Of the Pacific Rim Ch~ 04120000        59          93.2
## 8 Academy Of the Pacific Rim Ch~ 04120000        59          93.2
```

```
## 9 Academy Of the Pacific Rim Ch~ 04120000 59 93.2
## 10 Academy Of the Pacific Rim Ch~ 04120000 59 93.2
## # ... with 1,055 more rows, and 11 more variables: % Still in School <dbl>,
## # % Non-Grad Completers <dbl>, % H.S. Equiv. <dbl>, % Dropped Out <dbl>,
## # % Permanently Excluded <dbl>, District Name.y <chr>, Students <dbl>,
## # Students Disciplined <dbl>, District_code <chr>, Num_days_missed <chr>,
## # percent_num_days_missed <dbl>
```

```
gradRate_daysMissed_graph <-
  ggplot(gradRate_daysMissed_long, aes(x = percent_num_days_missed,
                                       y = percent_graduated,
                                       color = Num_days_missed)) + geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          SAT") + facet_grid(Num_days_missed ~.) + geom_smooth(method=lm)
gradRate_daysMissed_graph
```



7. SAT vs. Graduation Rate

```
gradRate_SAT <- left_join(gradRate, sat, by="District Code")

gradRate_SAT <- gradRate_SAT %>%
  rename(
    'percent_graduated' = '% Graduated')
```

```

gradRate_SAT <- gradRate_SAT %>%
  rename(
    'tests_taken' = 'Tests Taken')

gradRate_SAT_long <- pivot_longer(gradRate_SAT, cols=12:14,
                                   names_to = "SAT_test_types",
                                   values_to = "SAT_test_scores")

gradRate_SAT_long <- gradRate_SAT_long[!(is.na(gradRate_SAT_long$SAT_test_scores)), ]

print(gradRate_SAT_long)

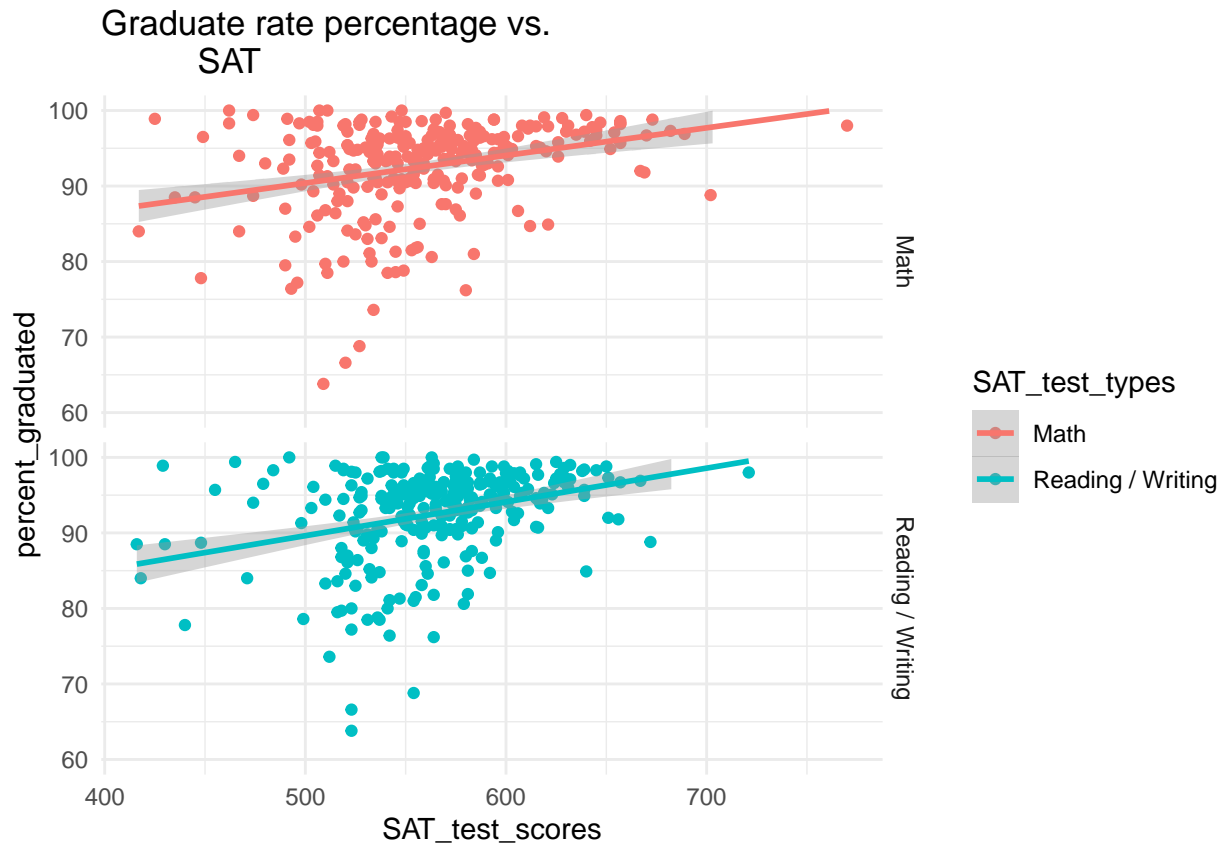
## # A tibble: 542 x 13
##   `District Name.x`      `District Code` `# in Cohort` percent_graduat~
##   <chr>                <chr>           <dbl>         <dbl>
## 1 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 2 Abby Kelley Foster Charter Pu~ 04450000      82          98.8
## 3 Abington              00010000     163          93.3
## 4 Abington              00010000     163          93.3
## 5 Acton-Boxborough       06000000     439          97.3
## 6 Acton-Boxborough       06000000     439          97.3
## 7 Advanced Math and Science Aca~ 04300000     141          98.6
## 8 Advanced Math and Science Aca~ 04300000     141          98.6
## 9 Agawam                 00050000     286          90.9
## 10 Agawam                00050000     286          90.9
## # ... with 532 more rows, and 9 more variables: % Still in School <dbl>,
## #   % Non-Grad Completers <dbl>, % H.S. Equiv. <dbl>, % Dropped Out <dbl>,
## #   % Permanently Excluded <dbl>, District Name.y <chr>, tests_taken <dbl>,
## #   SAT_test_types <chr>, SAT_test_scores <dbl>

gradRate_SAT_graph <-
  ggplot(gradRate_SAT_long, aes(x = SAT_test_scores,
                                y = percent_graduated,
                                color = SAT_test_types)) + geom_point() +

  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
          SAT") + facet_grid(SAT_test_types ~.) + geom_smooth(method=lm) + ylim(60,100)

gradRate_SAT_graph

```

8. Graduation plan Vs. Graduation rate

```
# gradRate_gradplan <- left_join(gradRate, plansforHSgrad, by="District Code")
#
# gradRate_gradplan <- gradRate_gradplan %>%
#   rename(
#     'percent_graduated' = '% Graduated')
#
# gradRate_gradplan_long <- pivot_longer(gradRate_gradplan, cols=11:20, names_to = "Plan_type", values_
#
# print(gradRate_gradplan_long)
# use cmd/ctrl + shift + c to uncomment

# gradRate_gradPlan_graph <-
#   ggplot(gradRate_gradplan_long, aes(x = Plan_percentage,
#                                       y = percent_graduated, color = Plan_type)) + geom_point() +
#   theme_minimal() +
#   ggtitle("Graduate rate percentage vs.
#           Plan after high school") + facet_grid(Plan_type ~.) + geom_smooth(method=lm)
# gradRate_gradPlan_graph
```

9. Graduation rate vs. Students Background

```
print(selectPop)
```

```
## # A tibble: 401 x 18
##   `District Name`      `District Code` `First Language No~` `First Language N~
##   <chr>                <chr>                <dbl>                <dbl>
## 1 Abby Kelley Foster Ch~ 04450000          952                66.8
## 2 Abington              00010000          298                14.1
## 3 Academy Of the Pacifi~ 04120000          173                32
## 4 Acton-Boxborough      06000000        1117                21.5
## 5 Acushnet              00030000           10                 1.1
## 6 Advanced Math and Sci~ 04300000          238                24.6
## 7 Agawam                00050000          438                12.5
## 8 Alma del Mar Charter ~ 04090000          349                43.8
## 9 Amesbury              00070000           74                 4
## 10 Amherst              00080000          300                29.2
```

```
## # ... with 391 more rows, and 14 more variables:
```

```
## #   English Language Learner # <dbl>, English Language Learner % <dbl>,
## #   Students With Disabilities # <dbl>, Students With Disabilities % <dbl>,
## #   Low Income # <lgl>, Low Income % <lgl>, Free Lunch # <lgl>,
## #   Free Lunch % <lgl>, Reduced Lunch # <lgl>, Reduced Lunch % <lgl>,
## #   High Needs #...15 <dbl>, High Needs #...16 <dbl>,
## #   Economically Disadvantaged # <dbl>, Economically Disadvantaged % <dbl>
```

```
# gradRateRename1 <- gradRate %>%
#   rename(
#     'District_code' = 'District Code')
```

```
selectPop$District_code <- str_pad(selectPop$`District Code`, 8, pad = "0")
```

```
print(selectPop)
```

```
## # A tibble: 401 x 19
##   `District Name`      `District Code` `First Language No~` `First Language N~
##   <chr>                <chr>                <dbl>                <dbl>
## 1 Abby Kelley Foster Ch~ 04450000          952                66.8
## 2 Abington              00010000          298                14.1
## 3 Academy Of the Pacifi~ 04120000          173                32
## 4 Acton-Boxborough      06000000        1117                21.5
## 5 Acushnet              00030000           10                 1.1
## 6 Advanced Math and Sci~ 04300000          238                24.6
## 7 Agawam                00050000          438                12.5
## 8 Alma del Mar Charter ~ 04090000          349                43.8
## 9 Amesbury              00070000           74                 4
## 10 Amherst              00080000          300                29.2
```

```
## # ... with 391 more rows, and 15 more variables:
```

```
## #   English Language Learner # <dbl>, English Language Learner % <dbl>,
## #   Students With Disabilities # <dbl>, Students With Disabilities % <dbl>,
## #   Low Income # <lgl>, Low Income % <lgl>, Free Lunch # <lgl>,
## #   Free Lunch % <lgl>, Reduced Lunch # <lgl>, Reduced Lunch % <lgl>,
## #   High Needs #...15 <dbl>, High Needs #...16 <dbl>,
## #   Economically Disadvantaged # <dbl>, Economically Disadvantaged % <dbl>, ...
```

```
gradRate_selectPop <- left_join(gradRate, selectPop, by="District Code")
```

```
gradRate_selectPop <- gradRate_selectPop %>%
  rename(
    'percent_graduated' = '% Graduated')
```

```

gradRate_selectPop <- gradRate_selectPop %>%
  rename(
    'economically_disadvantaged' = 'Economically Disadvantaged %')

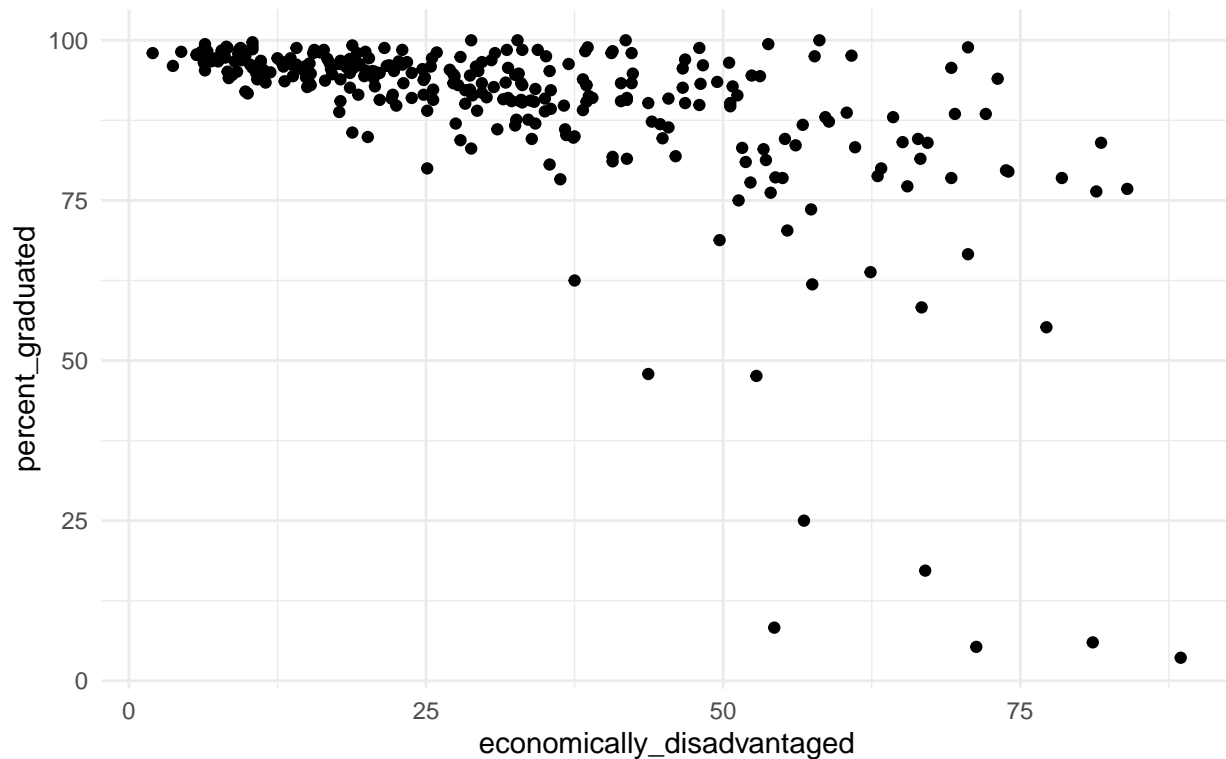
print(gradRate_selectPop)

## # A tibble: 305 x 27
##   `District Name.x`      `District Code` `# in Cohort` percent_graduat~
##   <chr>                  <chr>          <dbl>          <dbl>
## 1 Abby Kelley Foster Charter Pu~ 04450000      82           98.8
## 2 Abington                00010000     163           93.3
## 3 Academy Of the Pacific Rim Ch~ 04120000      59           93.2
## 4 Acton-Boxborough         06000000     439           97.3
## 5 Advanced Math and Science Aca~ 04300000     141           98.6
## 6 Agawam                   00050000     286           90.9
## 7 Amesbury                 00070000     161           90.1
## 8 Amherst-Pelham           06050000     232           91.8
## 9 Andover                  00090000     460           97.6
## 10 Argosy Collegiate Charter Sch~ 35090000      60           58.3
## # ... with 295 more rows, and 23 more variables: % Still in School <dbl>,
## #   % Non-Grad Completers <dbl>, % H.S. Equiv. <dbl>, % Dropped Out <dbl>,
## #   % Permanently Excluded <dbl>, District Name.y <chr>,
## #   First Language Not English # <dbl>, First Language Not English % <dbl>,
## #   English Language Learner # <dbl>, English Language Learner % <dbl>,
## #   Students With Disabilities # <dbl>, Students With Disabilities % <dbl>,
## #   Low Income # <lgl>, Low Income % <lgl>, Free Lunch # <lgl>, ...

gradRate_selectPop_graph <-
  ggplot(gradRate_selectPop, aes(x = economically_disadvantaged,
                                y = percent_graduated)) + geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
    Economically Disadvantaged % Students")
gradRate_selectPop_graph

```

Graduate rate percentage vs.
Economically Disadvantaged % Students



```
print(mobilityRate)
```

```
## # A tibble: 400 x 7
##   `District Name`      `District Code` `Churn/Intake E~` `% Churn` `% Intake`
##   <chr>                <chr>           <dbl>      <dbl>      <dbl>
## 1 Abby Kelley Foster Cha~ 04450000      1437        3.2        2.2
## 2 Abington              00010000      2215        8.1        4.7
## 3 Academy Of the Pacific~ 04120000       544        4.2        2.9
## 4 Acton-Boxborough      06000000     5322        3.7        2.3
## 5 Acushnet              00030000       942        6.8        3.8
## 6 Advanced Math and Scie~ 04300000       974        2.8        1.3
## 7 Agawam                00050000     3626        9.8        5.2
## 8 Alma del Mar Charter S~ 04090000       809        3.5        1.5
## 9 Amesbury              00070000     2010       13.7       7.6
## 10 Amherst               00080000     1104       15.8       8.6
## # ... with 390 more rows, and 2 more variables: Stability Enroll <dbl>,
## #   % Stability <dbl>
```

```
# gradRateRename2 <- gradRate %>%
#   rename(
#     'District_code' = 'District Code')
```

```
mobilityRate$District_code <- str_pad(mobilityRate$`District Code`, 8, pad = "0")
```

```
print(mobilityRate)
```

```
## # A tibble: 400 x 8
##   `District Name`      `District Code` `Churn/Intake E~` `% Churn` `% Intake`
```

```
##      <chr>                <chr>                <dbl>      <dbl>      <dbl>
## 1 Abby Kelley Foster Cha~ 04450000          1437        3.2        2.2
## 2 Abington                00010000          2215        8.1        4.7
## 3 Academy Of the Pacific~ 04120000           544        4.2        2.9
## 4 Acton-Boxborough        06000000          5322        3.7        2.3
## 5 Acushnet                00030000           942        6.8        3.8
## 6 Advanced Math and Scie~ 04300000           974        2.8        1.3
## 7 Agawam                  00050000          3626        9.8        5.2
## 8 Alma del Mar Charter S~ 04090000           809        3.5        1.5
## 9 Amesbury                00070000          2010       13.7        7.6
## 10 Amherst                00080000          1104       15.8        8.6
## # ... with 390 more rows, and 3 more variables: Stability Enroll <dbl>,
## #   % Stability <dbl>, District_code <chr>
```

```
gradRate_mobilityRate <- left_join(gradRate, mobilityRate, by="District Code")
```

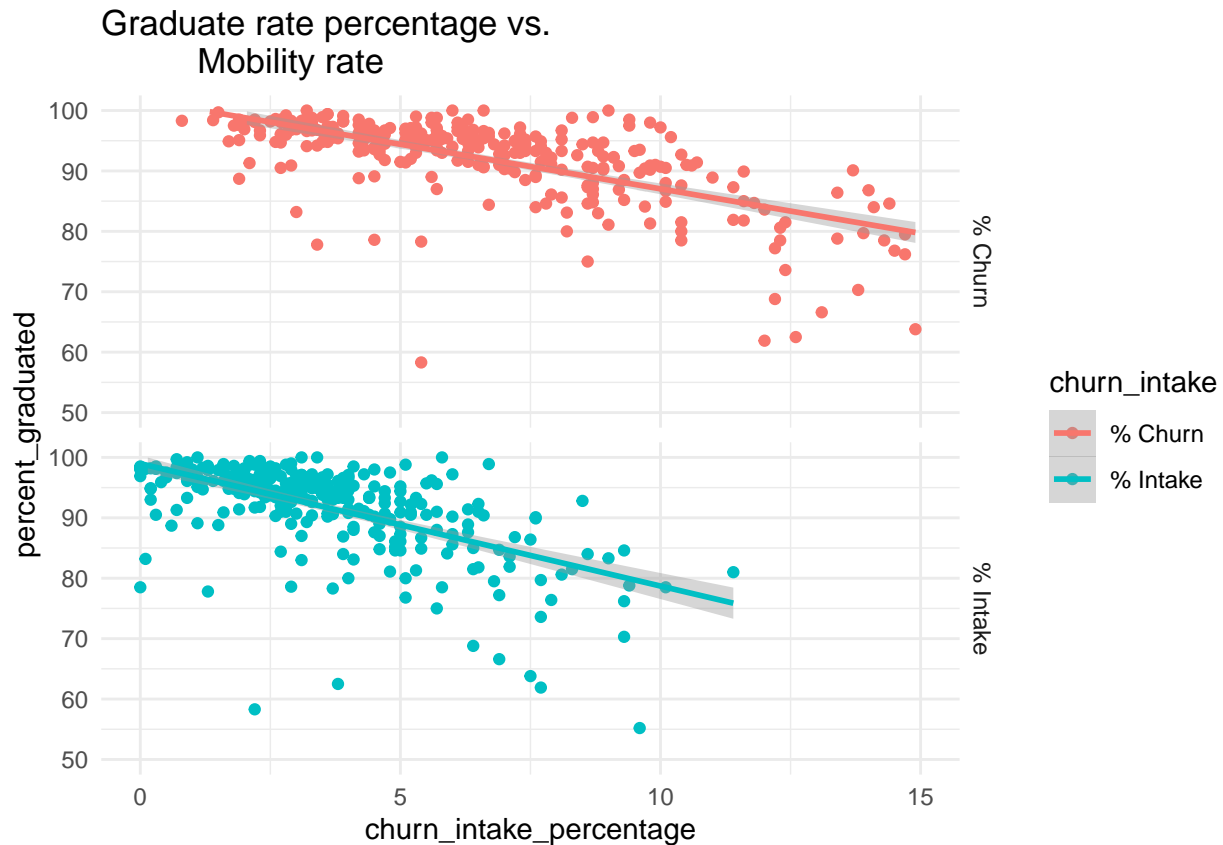
```
gradRate_mobilityRate <- gradRate_mobilityRate %>%
  rename(
    'percent_graduated' = '% Graduated')
```

```
gradRate_mobilityRate_long <- pivot_longer(gradRate_mobilityRate, cols=12:13,
                                             names_to = "churn_intake",
                                             values_to = "churn_intake_percentage")
```

```
print(gradRate_mobilityRate_long)
```

```
## # A tibble: 610 x 16
##   `District Name.x`      `District Code` `# in Cohort` percent_graduat~
##   <chr>                <chr>                <dbl>      <dbl>
## 1 Abby Kelley Foster Charter Pu~ 04450000           82       98.8
## 2 Abby Kelley Foster Charter Pu~ 04450000           82       98.8
## 3 Abington                00010000          163       93.3
## 4 Abington                00010000          163       93.3
## 5 Academy Of the Pacific Rim Ch~ 04120000           59       93.2
## 6 Academy Of the Pacific Rim Ch~ 04120000           59       93.2
## 7 Acton-Boxborough        06000000          439       97.3
## 8 Acton-Boxborough        06000000          439       97.3
## 9 Advanced Math and Science Aca~ 04300000          141       98.6
## 10 Advanced Math and Science Aca~ 04300000          141       98.6
## # ... with 600 more rows, and 12 more variables: % Still in School <dbl>,
## #   % Non-Grad Completers <dbl>, % H.S. Equiv. <dbl>, % Dropped Out <dbl>,
## #   % Permanently Excluded <dbl>, District Name.y <chr>,
## #   Churn/Intake Enroll <dbl>, Stability Enroll <dbl>, % Stability <dbl>,
## #   District_code <chr>, churn_intake <chr>, churn_intake_percentage <dbl>
```

```
gradRate_mobility_graph <-
  ggplot(gradRate_mobilityRate_long, aes(x = churn_intake_percentage,
                                           y = percent_graduated,
                                           color = churn_intake)) + geom_point() +
  theme_minimal() +
  ggtitle("Graduate rate percentage vs.
           Mobility rate") + facet_grid(churn_intake ~.) + xlim(0, 15) +
  ylim(50, 100) + geom_smooth(method=lm)
gradRate_mobility_graph
```



Tran's work end here

Cleaning Data

```
sat <- sat %>% mutate(`Total Score` = `Reading / Writing` + Math) %>%
  select(!Writing)

enrollByGrade <- enrollByGrade %>%
  mutate(`HS Enrollment` = `9` + `10` + `11` + `12`) %>%
  select(`District Code`, `HS Enrollment`, Total) %>%
  rename(Enrollment = Total)

ap_part <- ap_part %>% select(`District Code`, `Tests Takers`)

staffReten <- staffReten %>% select(`District Code`, `Teacher % Retained`) %>%
  rename(`Teacher Retention Rate` = `Teacher % Retained`)

classSize <- inner_join(classSizeByClass, classSizeByRace) %>%
  select(!c(`Number of Students`, `Total # of Classes`,
            `District Name`, `English Language Learner %`,
            `Students with Disabilities %`, `Economically Disadvantaged %`
  ))

college <- college %>%
  rename(`Percent Going to College` = `Attending Coll./Univ. (%)`) %>%
  select(`District Code`, `Percent Going to College`)
```

```

attendance <- attendance %>% select(`District Code`, `Attendance Rate`,
                                   `Average # of Absences`)
attrition <- attrition %>% select(`District Code`, ALL) %>%
  rename(Attrition = ALL)

advCourse <- advCourse %>%
  select(`District Code`, `Students Completing Advanced`, `Math`,
        `ELA`) %>% rename(`Adv Course % Math` = `Math`,
                          `Adv Course % ELA` = `ELA`)

dropOut <- dropOut |> select(`District Code`, `Dropout All Grades`)

gradRate <- gradRate %>% select(`District Code`, `Graduated`, `Dropped Out`)

art <- art %>%
  mutate(`in an Art Course` = `All Grades` / `Total Students` * 100) %>%
  select(`District Code`, `in an Art Course`)

eduAge <- eduAge %>%
  mutate(`of Teachers <40` = (`<26 yrs (#)` + `26-32 yrs (#)` +
                              `33-40 yrs (#)`) / `FTE Count` * 100) %>%
  select(`District Code`, `of Teachers <40`)

discipline <- discipline %>%
  mutate(`Disciplined` = `Students Disciplined` / `Students` * 100) %>%
  select(`District Code`, `Disciplined`)

convertPerc <- function(x, na.rm = TRUE) format(round((x / eduGen$`FTE Count`
                                                    * 100, 3), nsmall = 3))

eduGen <- eduGen %>% mutate_at(c("Females (#)", "African American (#)",
                                "Asian (#)", "Hispanic (#)", "White (#)",
                                "Native American (#)",
                                "Native Hawaiian, Pacific Islander (#)",
                                "Multi-Race,Non-Hispanic (#)", "Males (#)"),
                              convertPerc) %>%
  rename(`Female Teachers`="Females (#)", `African American Teachers`=
    "African American (#)", `Asian Teachers`="Asian (#)",
    `Hispanic Teachers`="Hispanic (#)", `White Teachers`="White (#)",
    `Native American Teachers`="Native American (#)",
    `Native Hawaiian, Pacific Islander Teachers`=
    "Native Hawaiian, Pacific Islander (#)",
    `Multi-Race,Non-Hispanic Teachers`="Multi-Race,Non-Hispanic (#)",
    `Male Teachers`="Males (#)") %>%
  select(!c(`District/School Name`, `FTE Count`))

mobilityRate <- mobilityRate %>% select(!c(`District Name`,
                                           `Churn/Intake Enroll`,
                                           `Stability Enroll`))

teachData <- teachData %>% select(!`District Name`)
teachData$`Student / Teacher Ratio` <- substr(
  teachData$`Student / Teacher Ratio`, 1,
  nchar(teachData$`Student / Teacher Ratio`)-5) %>% parse_number()

```

```
selectPop <- selectPop %>% rename(`High Needs` = `High Needs #...16`) %>%
  select(`District Code`, `First Language Not English`,
        `English Language Learner`, `Students With Disabilities`,
        `High Needs`, `Economically Disadvantaged`)
```

Joining all tables

```
eduData <- inner_join(sat, enrollByGrade, by = "District Code") %>%
  inner_join(ap_part, by = "District Code") %>%
  inner_join(staffReten, by = "District Code") %>%
  inner_join(classSize, by = "District Code") %>%
  inner_join(college, by = "District Code") %>%
  inner_join(attendance, by = "District Code") %>%
  inner_join(attrition, by = "District Code") %>%
  inner_join(advCourse, by = "District Code") %>%
  inner_join(gradRate, by = "District Code") %>%
  inner_join(art, by = "District Code") %>%
  inner_join(eduAge, by = "District Code") %>%
  inner_join(discipline, by = "District Code") %>%
  inner_join(eduGen, by = "District Code") %>%
  inner_join(teachData, by = "District Code") %>%
  inner_join(dropOut, by = "District Code") %>%
  inner_join(mobilityRate, by = "District Code") %>%
  inner_join(selectPop, by = "District Code") %>%
  mutate(`Percent of HS in AP` = `Tests Takers` / `HS Enrollment` * 100) %>%
  mutate(`Adjusted Score` = `Total Score` * `% Graduated` / 100) %>% drop_na()
```

```
summary(eduData)
```

```
## District Name      District Code      Tests Taken      Reading / Writing
## Length:264        Length:264        Min.   : 10.0    Min.   :416.0
## Class :character   Class :character   1st Qu.: 50.0    1st Qu.:538.8
## Mode  :character   Mode  :character   Median : 100.0   Median :564.5
##                                     Mean  : 162.3    Mean  :564.8
##                                     3rd Qu.: 208.8   3rd Qu.:588.0
##                                     Max.   :2299.0   Max.   :721.0
##      Math          Total Score      HS Enrollment      Enrollment
## Min.   :417.0      Min.   : 835      Min.   : 98.0      Min.   : 98
## 1st Qu.:527.0      1st Qu.:1064      1st Qu.: 447.8      1st Qu.: 1228
## Median :555.0      Median :1124      Median : 765.0      Median : 2140
## Mean   :558.4      Mean   :1123      Mean   : 1039.4      Mean   : 3160
## 3rd Qu.:584.0      3rd Qu.:1171      3rd Qu.: 1261.5      3rd Qu.: 3709
## Max.   :770.0      Max.   :1491      Max.   :14342.0      Max.   :48112
## Tests Takers      Teacher Retention Rate Average Class Size      Female %
## Min.   : 1.00      Min.   : 55.60      Min.   : 8.20      Min.   :32.70
## 1st Qu.: 73.75      1st Qu.: 87.20      1st Qu.:13.78      1st Qu.:47.70
## Median : 147.00      Median : 89.50      Median :16.00      Median :48.80
## Mean   : 192.44      Mean   : 88.30      Mean   :15.77      Mean   :48.77
## 3rd Qu.: 248.50      3rd Qu.: 91.53      3rd Qu.:17.52      3rd Qu.:49.80
## Max.   :3161.00      Max.   :100.00      Max.   :45.80      Max.   :74.10
##      Male %      African American %      Asian %      Hispanic %
## Min.   :25.70      Min.   : 0.000      Min.   : 0.000      Min.   : 0.00
## 1st Qu.:50.10      1st Qu.: 1.600      1st Qu.: 1.200      1st Qu.: 5.30
```


## Median	:51.20	Median	: 3.000	Median	: 2.300	Median	: 7.90
## Mean	:51.13	Mean	: 6.987	Mean	: 5.502	Mean	:14.59
## 3rd Qu.	:52.20	3rd Qu.	: 6.350	3rd Qu.	: 6.200	3rd Qu.	:16.43
## Max.	:67.40	Max.	:77.600	Max.	:63.600	Max.	:93.80
## White %		Native American %		Native Hawaiian,		Pacific Islander %	
## Min.	: 0.30	Min.	:0.0000	Min.	:0.00000		
## 1st Qu.	:60.38	1st Qu.	:0.1000	1st Qu.	:0.00000		
## Median	:77.40	Median	:0.1000	Median	:0.10000		
## Mean	:68.69	Mean	:0.2481	Mean	:0.09545		
## 3rd Qu.	:85.80	3rd Qu.	:0.3000	3rd Qu.	:0.10000		
## Max.	:96.50	Max.	:5.6000	Max.	:2.40000		
## Multi-Race, Non-Hispanic %		Percent Going to College		Attendance Rate			
## Min.	: 0.400	Min.	:15.20	Min.	:79.90		
## 1st Qu.	: 2.600	1st Qu.	:58.70	1st Qu.	:92.60		
## Median	: 3.700	Median	:70.90	Median	:94.65		
## Mean	: 3.927	Mean	:68.09	Mean	:94.18		
## 3rd Qu.	: 4.825	3rd Qu.	:79.92	3rd Qu.	:96.10		
## Max.	:11.000	Max.	:91.70	Max.	:99.60		
## Average # of Absences		Attrition		% Students Completing Advanced			
## Min.	: 0.60	Min.	: 1.400	Min.	: 17.00		
## 1st Qu.	: 6.50	1st Qu.	: 5.000	1st Qu.	: 58.90		
## Median	: 8.90	Median	: 6.750	Median	: 68.05		
## Mean	: 9.65	Mean	: 7.078	Mean	: 68.15		
## 3rd Qu.	:12.15	3rd Qu.	: 8.500	3rd Qu.	: 78.20		
## Max.	:33.60	Max.	:31.000	Max.	:100.00		
## Adv Course % Math		Adv Course % ELA		% Graduated		% Dropped Out	
## Min.	: 8.10	Min.	: 0.00	Min.	: 47.90	Min.	: 0.000
## 1st Qu.	: 45.58	1st Qu.	:10.18	1st Qu.	: 90.47	1st Qu.	: 0.975
## Median	: 57.10	Median	:15.95	Median	: 94.40	Median	: 2.100
## Mean	: 57.47	Mean	:18.73	Mean	: 92.31	Mean	: 3.477
## 3rd Qu.	: 68.45	3rd Qu.	:24.73	3rd Qu.	: 96.70	3rd Qu.	: 4.900
## Max.	:100.00	Max.	:94.30	Max.	:100.00	Max.	:35.000
## % in an Art Course		% of Teachers <40		% Disciplined			
## Min.	: 0.00	Min.	:11.11	Min.	:0.0000		
## 1st Qu.	:67.73	1st Qu.	:32.94	1st Qu.	:0.2416		
## Median	:81.82	Median	:37.42	Median	:0.5889		
## Mean	:72.48	Mean	:39.82	Mean	:0.8471		
## 3rd Qu.	:86.88	3rd Qu.	:42.93	3rd Qu.	:1.2195		
## Max.	:99.50	Max.	:94.24	Max.	:6.8006		
## % African American Teachers		% Asian Teachers		% Hispanic Teachers			
## Length:264		Length:264		Length:264			
## Class :character		Class :character		Class :character			
## Mode :character		Mode :character		Mode :character			
##							
##							
##							
## % White Teachers		% Native American Teachers					
## Length:264		Length:264					
## Class :character		Class :character					
## Mode :character		Mode :character					
##							
##							
##							
## % Native Hawaiian, Pacific Islander Teachers							

```

## Length:264
## Class :character
## Mode :character
##
##
##
## % Multi-Race,Non-Hispanic Teachers % Female Teachers % Male Teachers
## Length:264 Length:264 Length:264
## Class :character Class :character Class :character
## Mode :character Mode :character Mode :character
##
##
##
## Total # of Teachers (FTE) % of Teachers Licensed Student / Teacher Ratio
## Min. : 6.0 Min. : 56.60 Min. : 7.70
## 1st Qu.: 102.0 1st Qu.: 98.50 1st Qu.:11.07
## Median : 168.4 Median : 99.40 Median :12.05
## Mean : 259.5 Mean : 97.04 Mean :12.10
## 3rd Qu.: 299.4 3rd Qu.:100.00 3rd Qu.:13.00
## Max. :4595.5 Max. :100.00 Max. :28.90
## Percent of Experienced Teachers
## Min. :33.30
## 1st Qu.:82.60
## Median :86.70
## Mean :83.97
## 3rd Qu.:89.90
## Max. :96.00
## Percent of Teachers without Waiver or Provisional License
## Min. : 69.10
## 1st Qu.: 91.88
## Median : 94.70
## Mean : 93.02
## 3rd Qu.: 96.50
## Max. :100.00
## Percent Teaching In-Field % Dropout All Grades % Churn
## Min. : 36.40 Min. : 0.000 Min. : 0.800
## 1st Qu.: 93.30 1st Qu.: 0.300 1st Qu.: 4.300
## Median : 96.00 Median : 0.700 Median : 6.400
## Mean : 92.77 Mean : 1.166 Mean : 6.866
## 3rd Qu.: 97.50 3rd Qu.: 1.425 3rd Qu.: 8.900
## Max. :100.00 Max. :15.600 Max. :28.600
## % Intake % Stability District_code
## Min. : 0.000 Min. :81.20 Length:264
## 1st Qu.: 2.175 1st Qu.:94.60 Class :character
## Median : 3.300 Median :96.30 Mode :character
## Mean : 3.651 Mean :95.89
## 3rd Qu.: 4.825 3rd Qu.:97.42
## Max. :16.800 Max. :99.20
## First Language Not English % English Language Learner %
## Min. : 0.000 Min. : 0.000
## 1st Qu.: 2.975 1st Qu.: 1.100
## Median : 7.800 Median : 2.700
## Mean :14.479 Mean : 5.569
## 3rd Qu.:20.725 3rd Qu.: 6.700

```

##	Max.	:	83.400	Max.	:	35.700
##	Students With Disabilities %		High Needs %			Economically Disadvantaged %
##	Min.	:	0.00	Min.	:	3.10
##	1st Qu.	:	16.00	1st Qu.	:	29.88
##	Median	:	18.00	Median	:	39.95
##	Mean	:	18.44	Mean	:	43.37
##	3rd Qu.	:	20.32	3rd Qu.	:	52.90
##	Max.	:	44.10	Max.	:	89.00
##	Percent of HS in AP		Adjusted Score			
##	Min.	:	0.07645	Min.	:	546.1
##	1st Qu.	:	13.03754	1st Qu.	:	965.3
##	Median	:	19.62341	Median	:	1044.4
##	Mean	:	20.32260	Mean	:	1038.4
##	3rd Qu.	:	26.61466	3rd Qu.	:	1111.5
##	Max.	:	60.03086	Max.	:	1461.2

Inference from summary: 1) Neither Reading/Writing, nor Math has a perfect score in SAT, same goes for the total score.

- 2) Among races, at least one district had Hispanic and White students in domination, even though the third quartile of Hispanic students is at 16.43%.
- 3) Even though on average Male % students is more than Female % among districts, the minimum and maximum of gender % is higher for Females.
- 4) At least one district/school has 100% graduate rate and 0% drop rate and yet maximum percentage of students going to College is only 91.70.
- 5) At least one district/school has % Students Completing Advanced as 100% and none has 100% attendance rate.
- 6) The school/district with minimum % of Teachers Licensed, has almost half of the teachers unlicensed.
- 7) None of the school/district has **only** experienced teachers, and in at least one school, 67% teachers are not experienced.
- 8) The data is taken for the COVID time-period(2020-21), yet at least one school had Percent Teaching In-Field as 100%.
- 9) Even though the schools are in a country where English is the most-commonly spoken language, at least one school has 83.400% students whose first Language is not English.
- 10) None of the schools has 0% of High Needs or Economically Disadvantaged students.

To see if genders had a relation with Total SAT score.

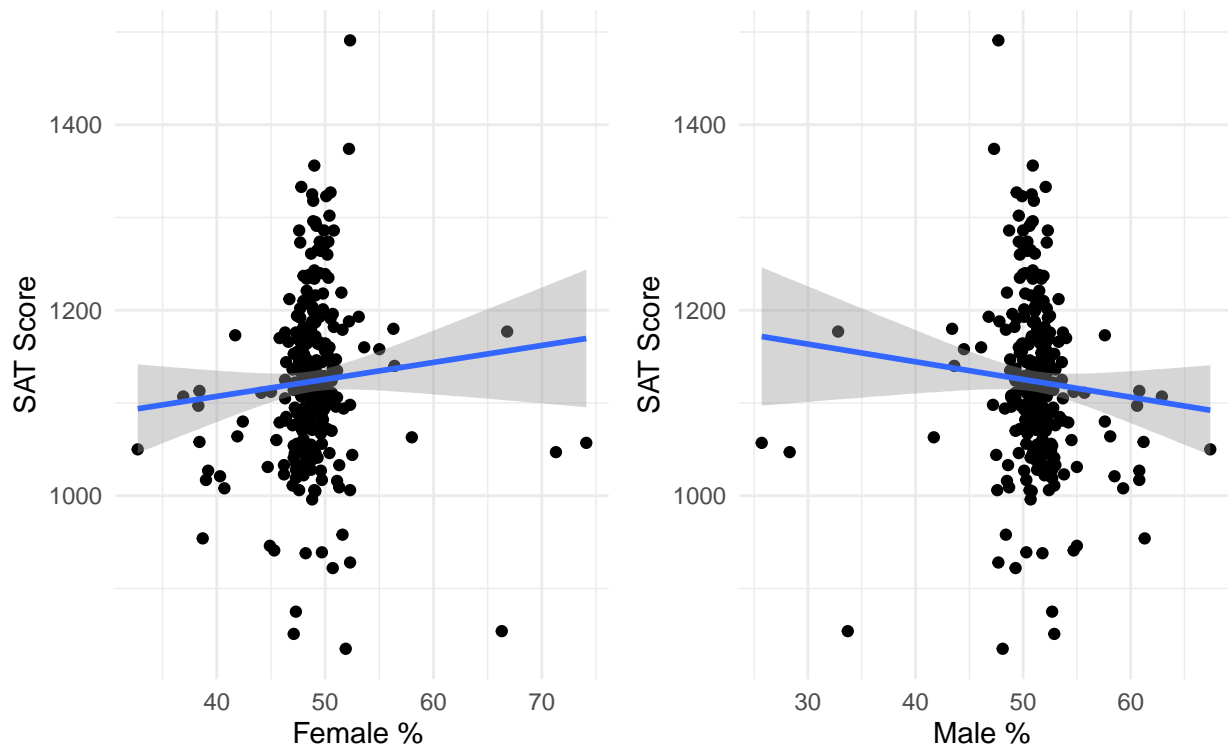
```
g1 <- eduData %>% ggplot( mapping=aes(x=`Female %`,y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  labs(title="Positive Relationship:Female% vs SAT",
        x="Female % ", y="SAT Score") +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`Male %`,y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  labs(title="Negative Relationship:Male% vs SAT ",
        x="Male % ", y="SAT Score") +
  theme_minimal()
```

```
gridExtra::grid.arrange(
  g1, g2, nrow=1, top = textGrob("Relationship of SAT score with gender",
    gp=gpar(fontsize=15,font=3)))
```

Relationship of SAT score with gender

Positive Relationship:Female% vs SAT Negative Relationship:Male% vs SAT



Average Class Size vs SAT, Graduate Rate, drop rate and Enrollment in college

```
g1 <- eduData %>% ggplot( mapping=aes(x=`Average Class Size`,y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`Average Class Size`,
  y=`Percent Going to College`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`Average Class Size`,
  y=`% Dropped Out`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

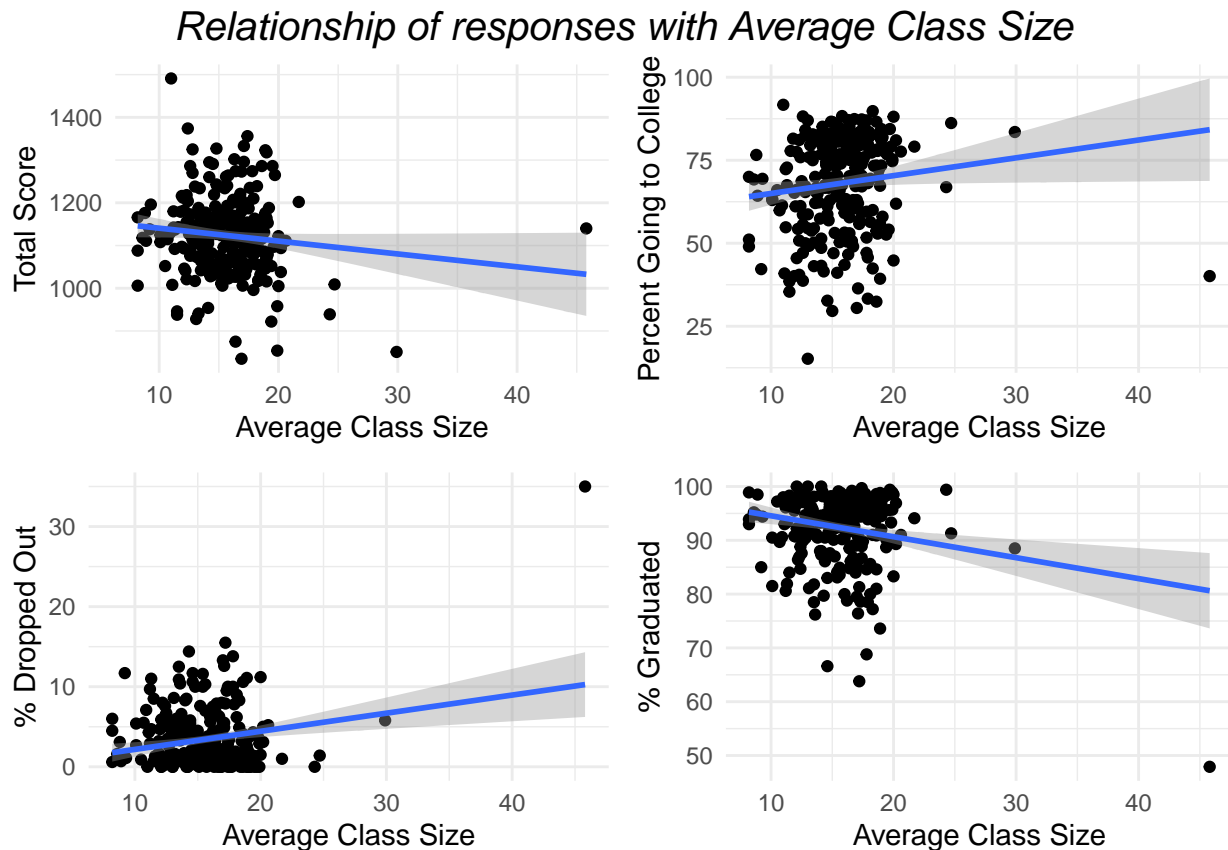
g4 <- eduData %>% ggplot( mapping=aes(x=`Average Class Size`,y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
```

```

theme_minimal()

gridExtra::grid.arrange(
  g1, g2, g3, g4 ,
  top = textGrob("Relationship of responses with Average Class Size",
    gp=gpar(fontsize=15,font=3)))

```



There happens to be an outlier, which is in fact a correctly reported value (~45), so we won't remove it. Average Class Size has negative relationship with SAT score and % graduated, while it has a positive relationship with % going to college and %dropped out.

```

g1 <- eduData %>% ggplot( mapping=aes(x=`% Students Completing Advanced`,
  y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`% Students Completing Advanced`,
  y=`Percent Going to College`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`% Students Completing Advanced`,
  y=`% Dropped Out`))+
  geom_point() +
  geom_smooth(method=lm) +

```

```

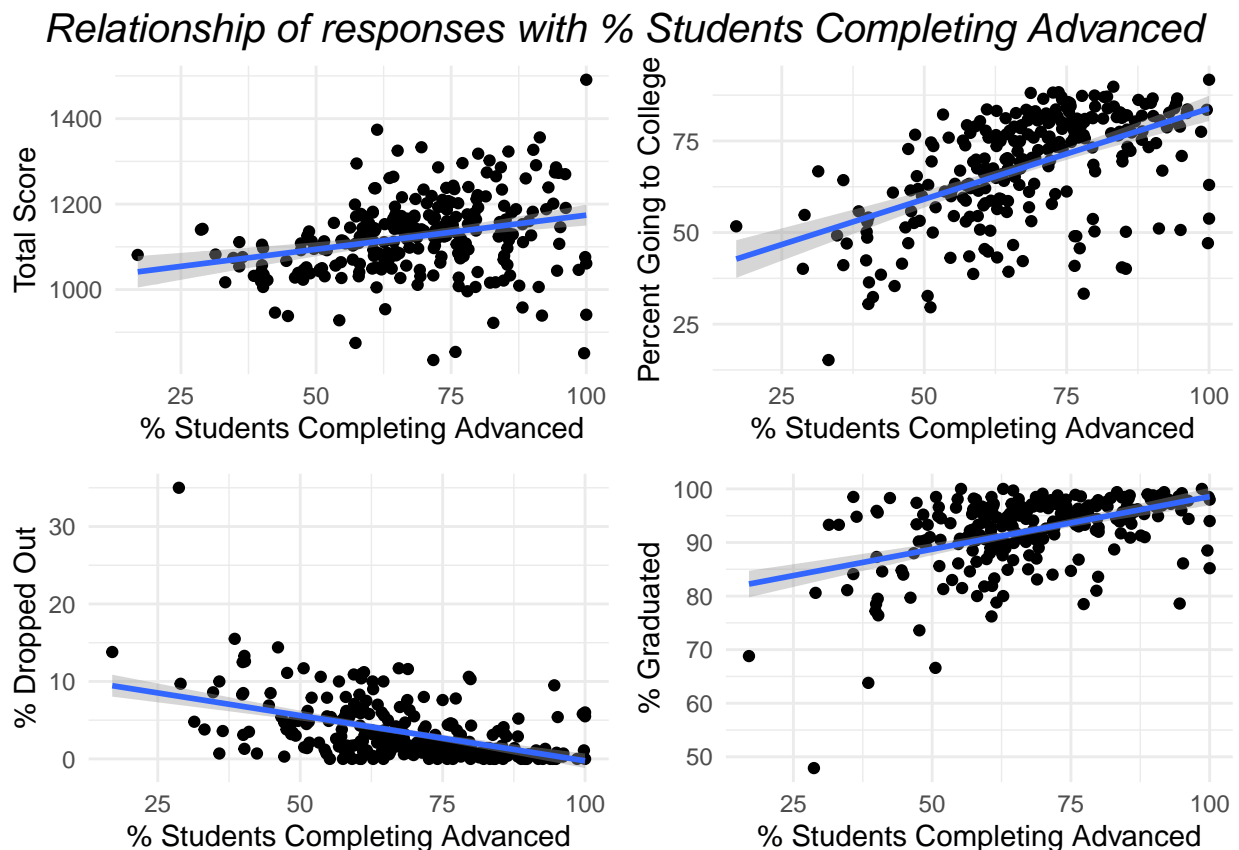
theme_minimal()

g4 <- eduData %>% ggplot( mapping=aes(x=`% Students Completing Advanced`,
                                     y=`% Graduated`))+

  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1, g2,g3,g4 ,
  top = textGrob("Relationship of responses with % Students Completing Advanced",
                 gp=gpar(fontsize=15,font=3)))

```



All responses had positive relationship with % Students Completing Advanced except %dropped out, which is expected since it's inverse of %graduated so, here onwards we will consider only one of them.

Attendance Rate vs Responses

```

g1 <- eduData %>% ggplot( mapping=aes(x=`Attendance Rate`,
                                     y=`Total Score`))+

  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`Attendance Rate`,
                                     y=`Percent Going to College`))+

  geom_point() +

```

```

geom_smooth(method=lm) +
theme_minimal()

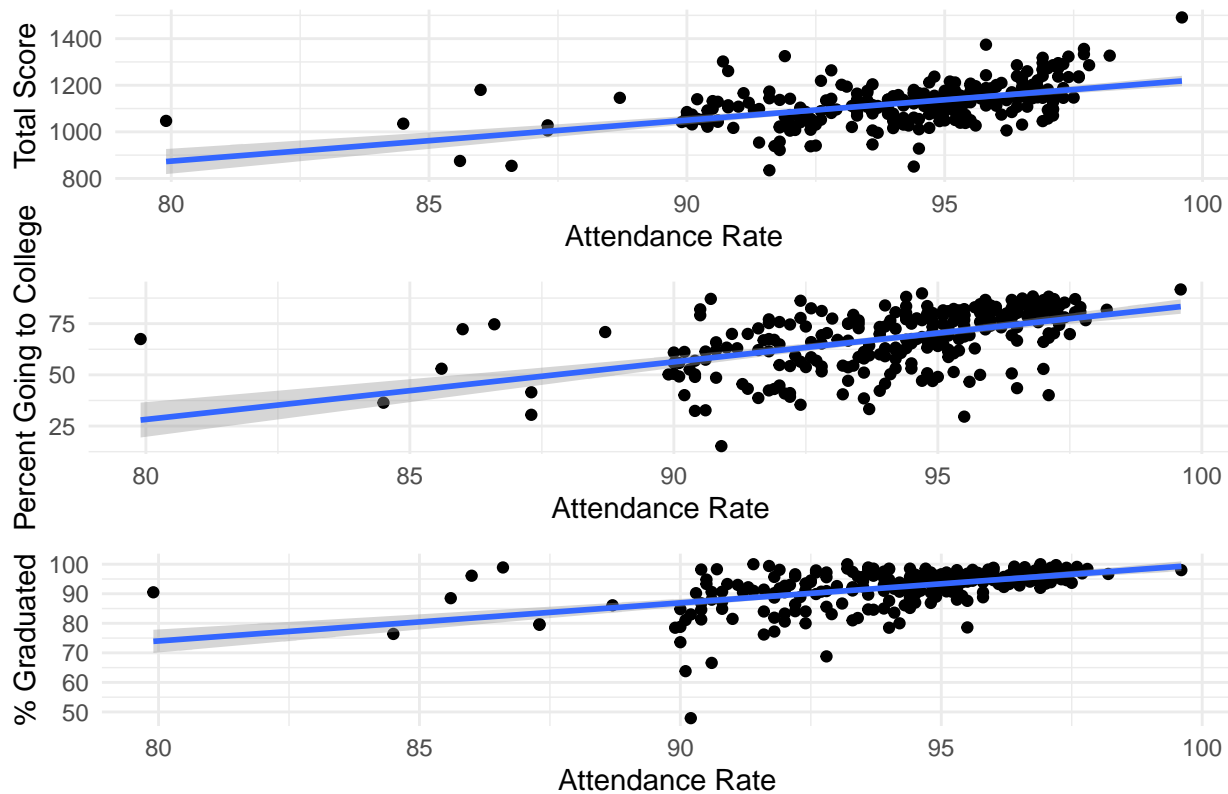
g3 <- eduData %>% ggplot( mapping=aes(x=`Attendance Rate`,
                                     y=`% Graduated`))+

  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Relationship of responses with Attendance Rate",
                 gp=gpar(fontsize=15,font=3)))

```

Relationship of responses with Attendance Rate



```

g1 <- eduData %>% ggplot( mapping=aes(x=`Average # of Absences`,
                                     y=`Total Score`))+

  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`Average # of Absences`,
                                     y=`Percent Going to College`))+

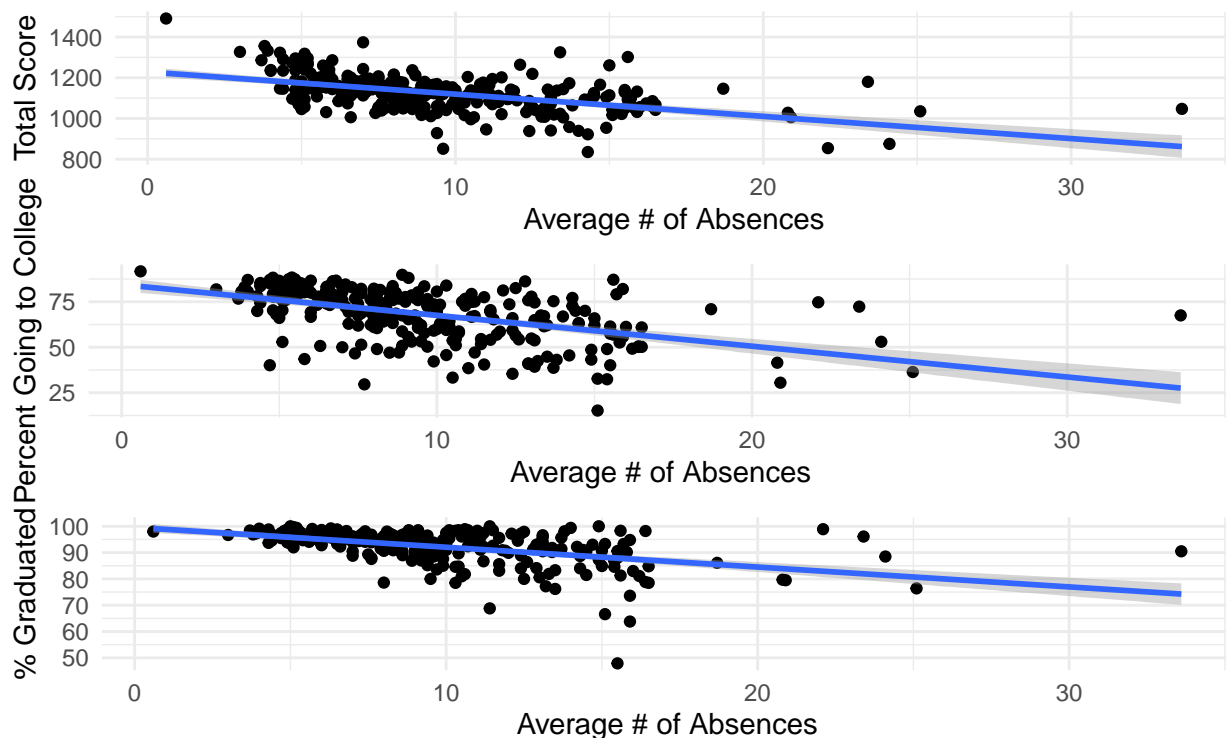
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

```

```
g3 <- eduData %>% ggplot( mapping=aes(x=`Average # of Absences`,
                                         y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Negative Relationship of responses with Average
                  Number of Absences", gp=gpar(fontsize=15,font=3)))
```

Negative Relationship of responses with Average Number of Absences



```
g1 <- eduData %>% ggplot( mapping=aes(x=`Attrition`,
                                         y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

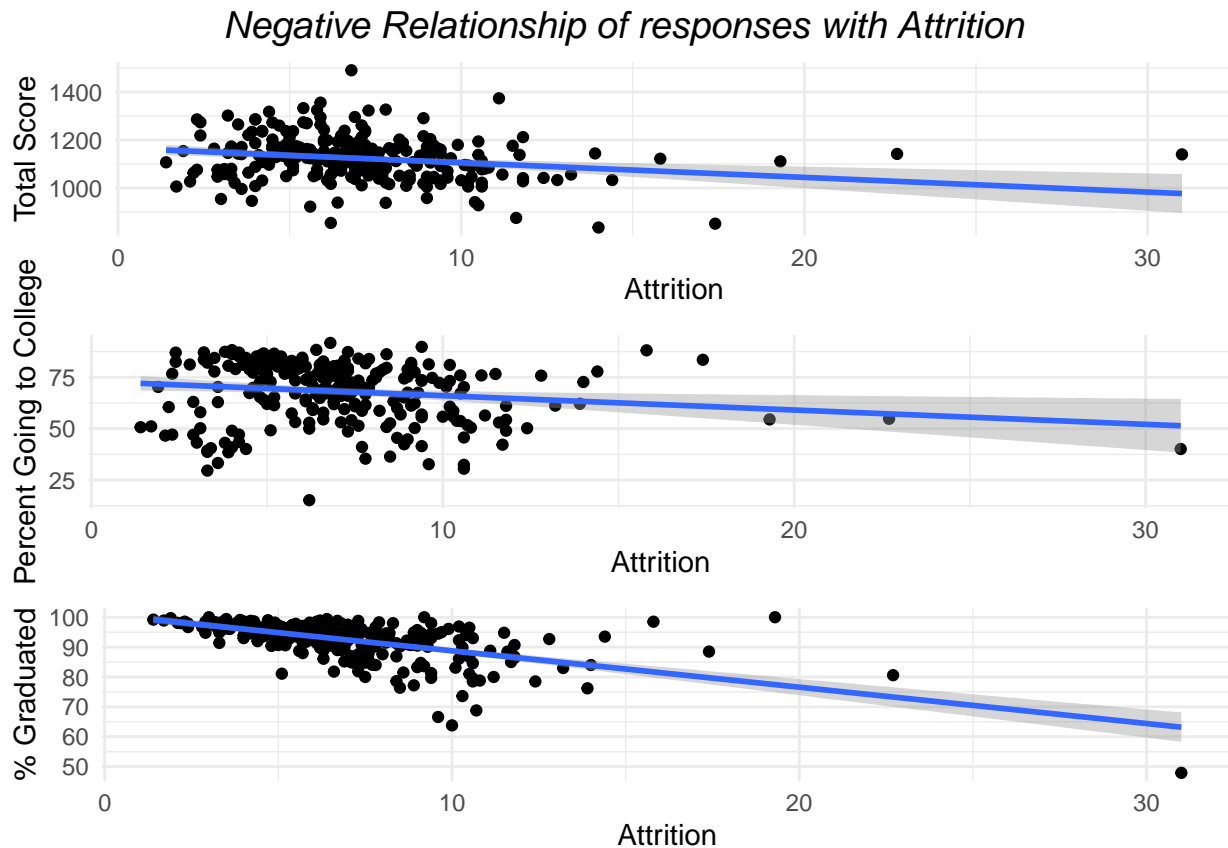
g2 <- eduData %>% ggplot( mapping=aes(x=`Attrition`,
                                         y=`Percent Going to College`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`Attrition`,
                                         y=`% Graduated`))+
  geom_point() +
```



```
geom_smooth(method=lm) +
theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Negative Relationship of responses with Attrition",
    gp=gpar(fontsize=14,font=3)))
```



Even though, all of them has negative relationship, the slopes are different i.e., graduation rate drops with larger difference as compared to other responses.

Student Background vs Graduation Rate

```
g1 <- eduData %>% ggplot( mapping=aes(x=`African American %`,
  y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()#-

g2 <- eduData %>% ggplot( mapping=aes(x=`Asian %`,
  y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`Hispanic %`,
  y=`% Graduated`))+
```

```

geom_point() +
geom_smooth(method=lm) +
theme_minimal()#-

g4 <- eduData %>% ggplot( mapping=aes(x=`White %`,
                                     y=`% Graduated`))+

geom_point() +
geom_smooth(method=lm) +
theme_minimal()

g5 <- eduData %>% ggplot( mapping=aes(x=`Native American %`,
                                     y=`% Graduated`))+

geom_point() +
geom_smooth(method=lm) +
theme_minimal()

g6 <- eduData %>% ggplot( mapping=aes(x=`Native Hawaiian, Pacific Islander %`,
                                     y=`% Graduated`))+

geom_point() +
geom_smooth(method=lm) +
theme_minimal()#-

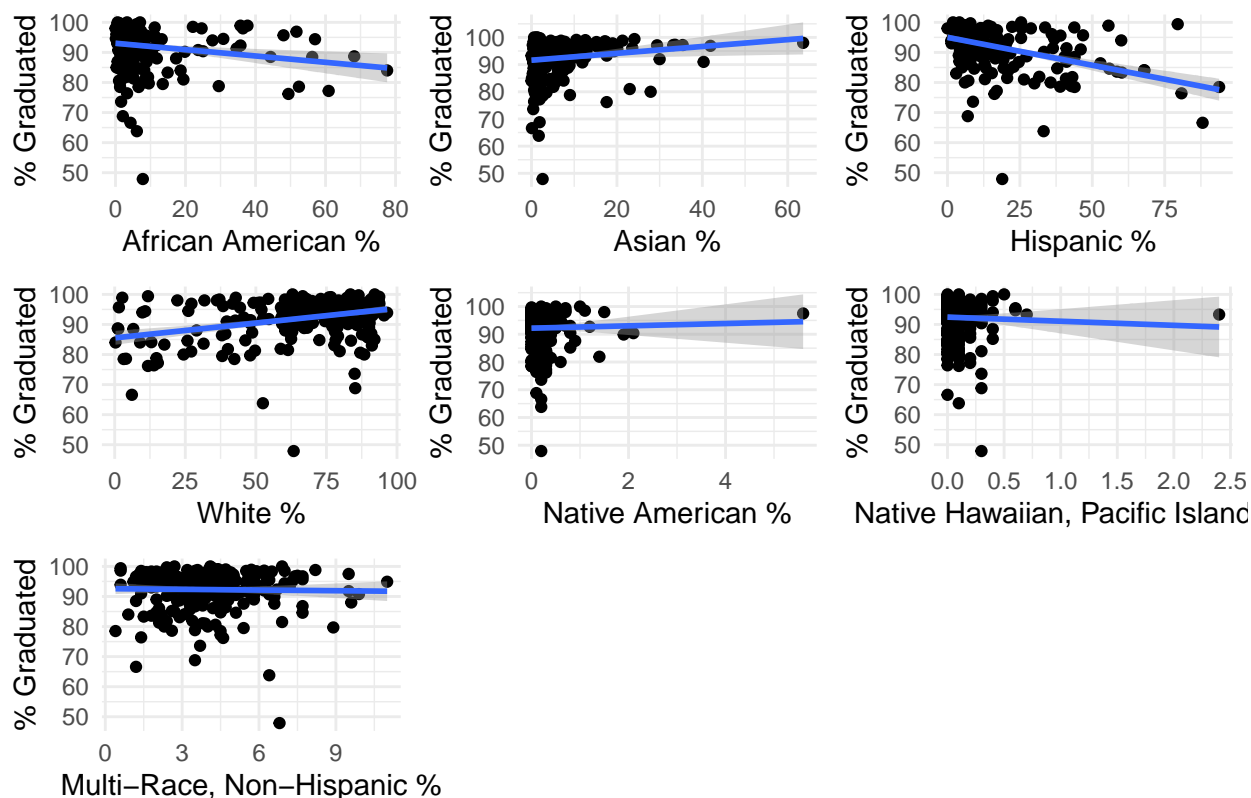
g7 <- eduData %>% ggplot( mapping=aes(x=`Multi-Race, Non-Hispanic %`,
                                     y=`% Graduated`))+

geom_point() +
geom_smooth(method=lm) +
theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,g4,g5,g6,g7,
  top = textGrob("Relationship of responses with % Graduated",
                 gp=gpar(fontsize=15,font=3)))

```

Relationship of responses with % Graduated



While “African American”, “Hispanic” and “Native Hawaiian, Pacific Islander” students have negative relationship with graduation rate, “Multi-Race, Non-Hispanic” students have somewhat constant graduation rate. Something else to notice is that population of “white” with higher graduation rate is closer to 100% while for others, higher graduation rate is closer to 0%.

```
g1 <- eduData %>% ggplot( mapping=aes(x=`African American %`,
                                       y=`Percent Going to College`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
  labs(y="Going College(%)") +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`Asian %`,
                                       y=`Percent Going to College`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
  labs(y="Going College(%)") +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`Hispanic %`,
                                       y=`Percent Going to College`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
  labs(y="Going College(%)") +
  theme_minimal() #-

g4 <- eduData %>% ggplot( mapping=aes(x=`White %`,
                                       y=`Percent Going to College`))+
```

```

geom_point(alpha=0.1) +
geom_smooth(method=lm) +
labs(y="Going College(%)" ) +
theme_minimal()

g5 <- eduData %>% ggplot( mapping=aes(x=`Native American %`,
                                     y=`Percent Going to College`))+

geom_point(alpha=0.1) +
geom_smooth(method=lm) +
labs(y="Going College(%)" ) +
theme_minimal()#-

g6 <- eduData %>% ggplot( mapping=aes(x=`Native Hawaiian, Pacific Islander %`,
                                     y=`Percent Going to College`))+

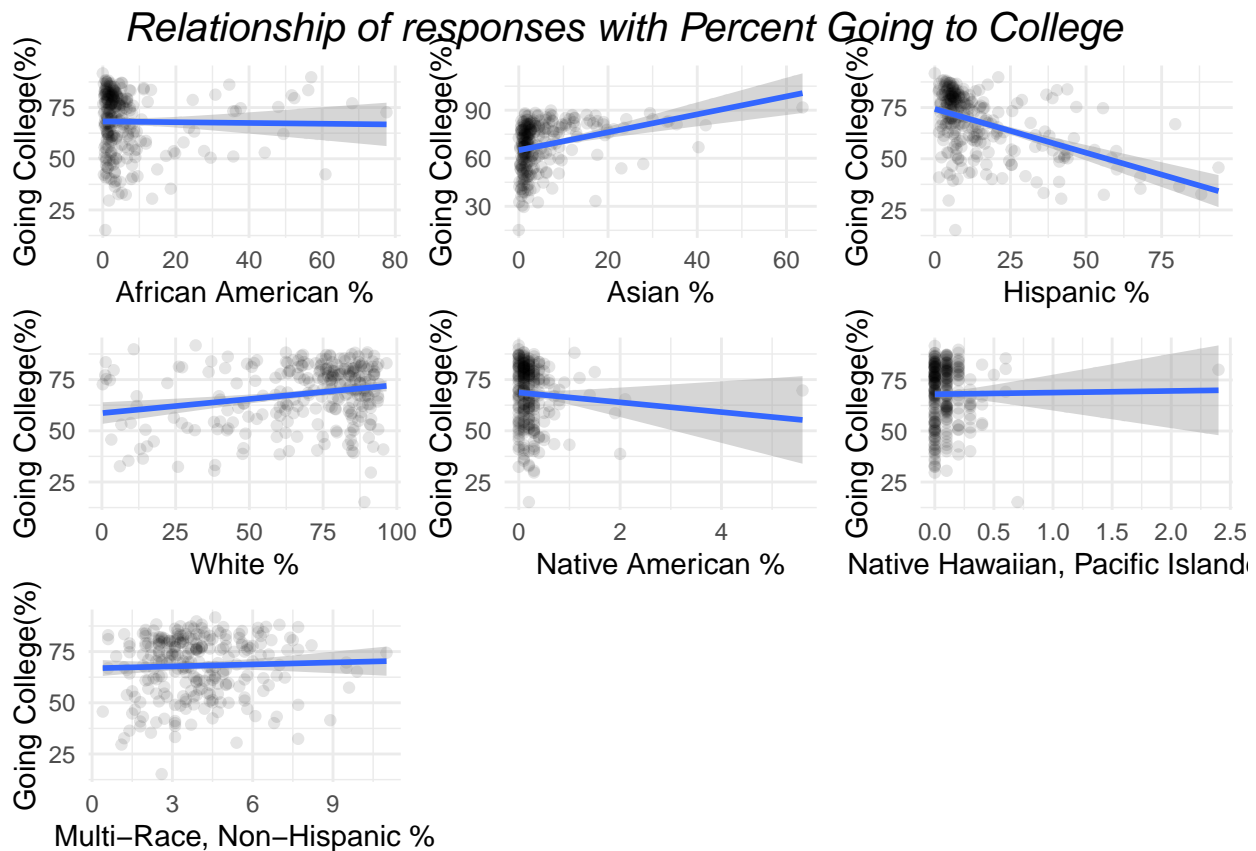
geom_point(alpha=0.1) +
geom_smooth(method=lm) +
labs(y="Going College(%)" ) +
theme_minimal()

g7 <- eduData %>% ggplot( mapping=aes(x=`Multi-Race, Non-Hispanic %`,
                                     y=`Percent Going to College`))+

geom_point(alpha=0.1) +
geom_smooth(method=lm) +
labs(y="Going College(%)" ) +
theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,g4,g5,g6,g7,
  top = textGrob("Relationship of responses with Percent Going to College",
                 gp=gpar(fontsize=15,font=3)))

```



When plotted against “Going to College(%)”, the only differences were that “African American” showed no significant change, and “Native American” had a negative relationship, while “Multi-Race, Non-Hispanic” and “Native Hawaiian, Pacific Islander” students have slightly positive relationship.

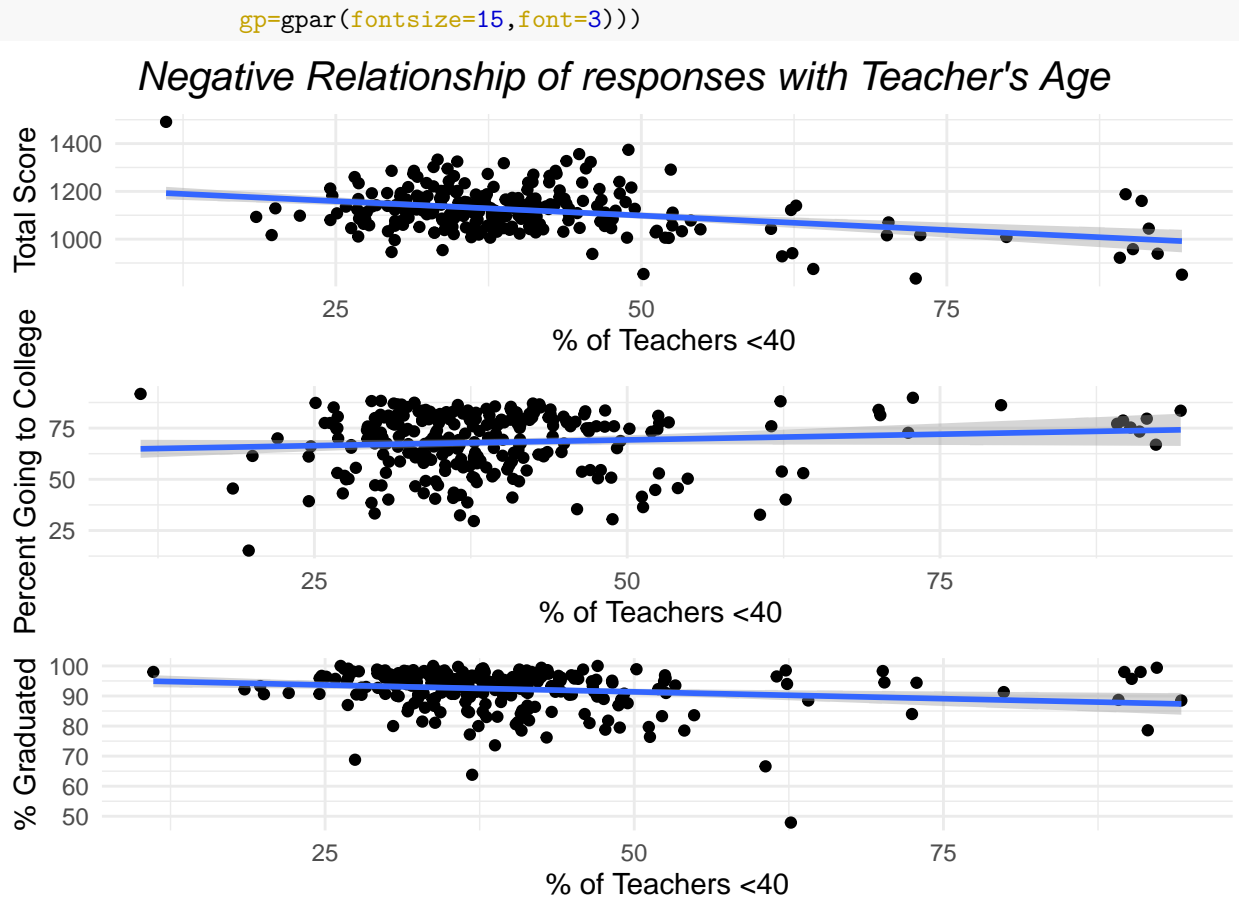
% of Teachers <40 and responses

```
g1 <- eduData %>% ggplot( mapping=aes(x=`% of Teachers <40`,
                                     y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`% of Teachers <40`,
                                     y=`Percent Going to College`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`% of Teachers <40`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Negative Relationship of responses with Teacher's Age",
```



Schools with more % of teachers's age less than 40, had a negative affect on Total SAT score and graduation rate while a positive affect on percentage of students going to college.

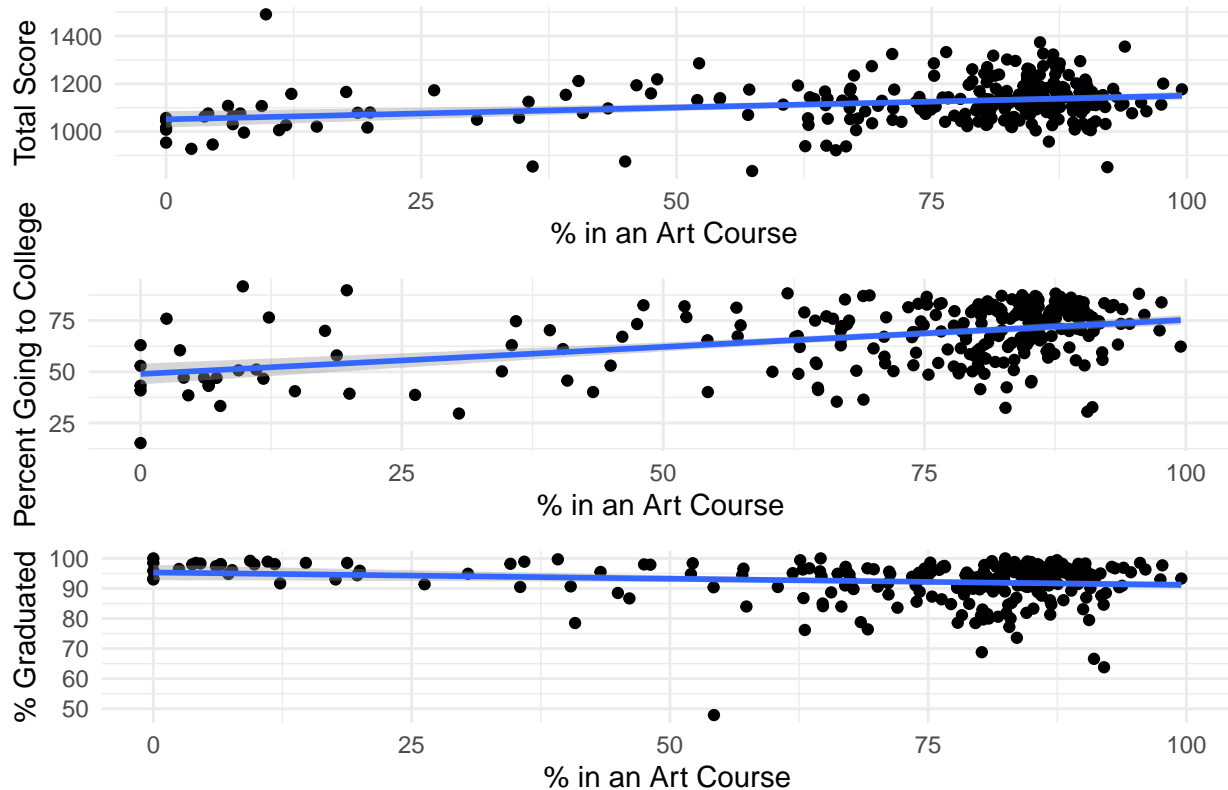
```
g1 <- eduData %>% ggplot( mapping=aes(x=`% in an Art Course`,
                                     y=`Total Score`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`% in an Art Course`,
                                     y=`Percent Going to College`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`% in an Art Course`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Relationship of responses with % in an Art Course",
                 gp=gpar(fontsize=15,font=3)))
```

Relationship of responses with % in an Art Course



```
g1 <- eduData %>% ggplot( mapping=aes(x=`First Language Not English %`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g2 <- eduData %>% ggplot( mapping=aes(x=`English Language Learner %`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

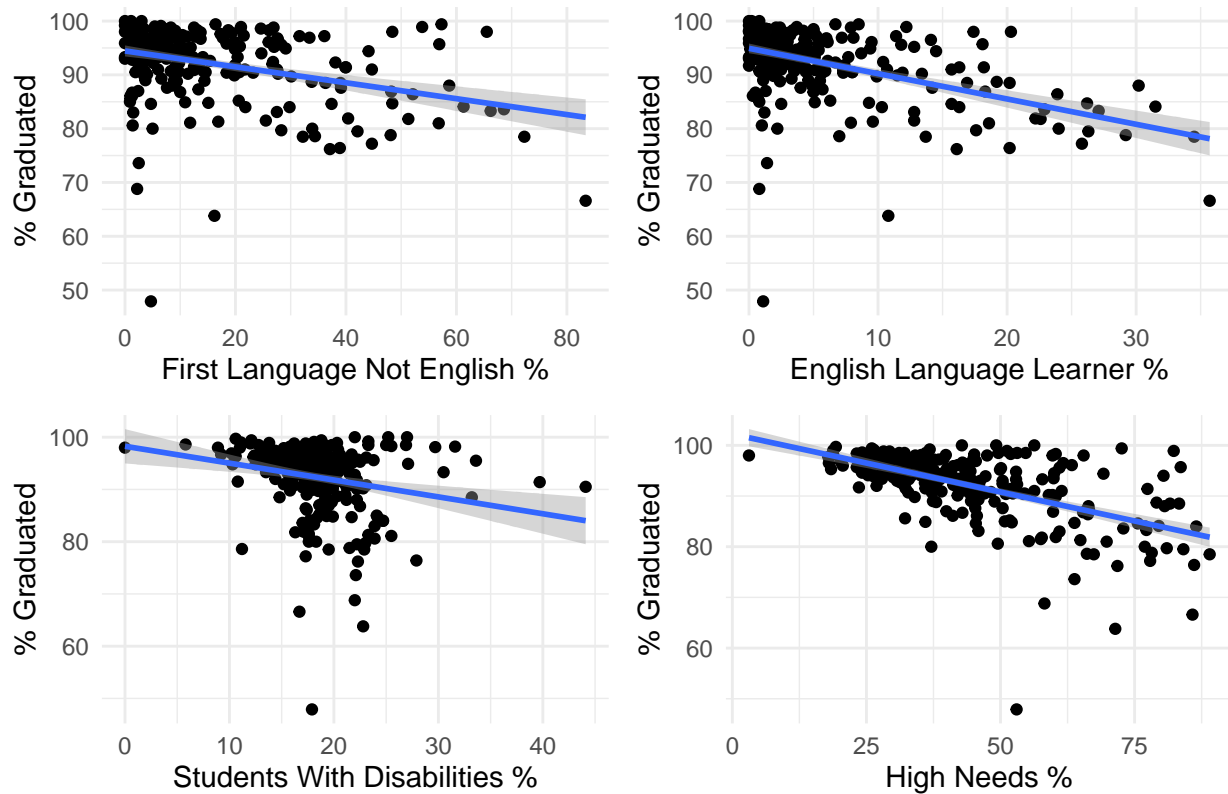
g3 <- eduData %>% ggplot( mapping=aes(x=`Students With Disabilities %`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

g4 <- eduData %>% ggplot( mapping=aes(x=`High Needs %`,
                                     y=`% Graduated`))+
  geom_point() +
  geom_smooth(method=lm) +
  theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,g4,
  top = textGrob("Negative Relationship of % Graduated with different classes",
```

```
gp=gpar(fontsize=15,font=3))
```

Negative Relationship of % Graduated with different classes%



```
# English Language Learner %
# Students With Disabilities %
# High Needs %
# First Language Not English %
```

Percent Teaching In-Field vs 3 responses

```
# Percent Teaching In-Field
g1 <- eduData %>% ggplot( mapping=aes(x=`Percent Teaching In-Field`,
                                     y=`Total Score`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
  theme_minimal()

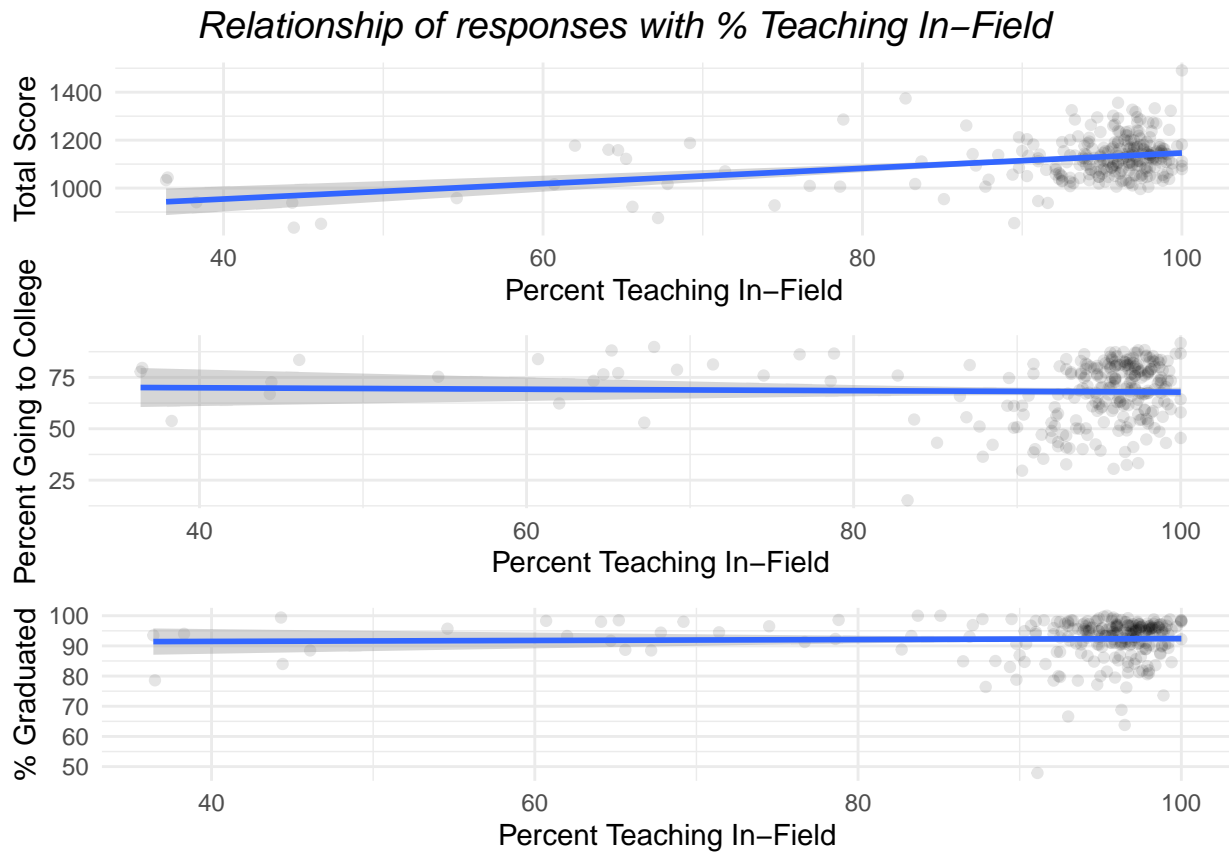
g2 <- eduData %>% ggplot( mapping=aes(x=`Percent Teaching In-Field`,
                                     y=`Percent Going to College`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
  theme_minimal()

g3 <- eduData %>% ggplot( mapping=aes(x=`Percent Teaching In-Field`,
                                     y=`% Graduated`))+
  geom_point(alpha=0.1) +
  geom_smooth(method=lm) +
```



```
theme_minimal()

gridExtra::grid.arrange(
  g1,g2,g3,
  top = textGrob("Relationship of responses with % Teaching In-Field",
    gp=gpar(fontsize=14,font=3)))
```



Percentage going to college has significantly small negative relationship.