Regression

Tyler Bontrager, Ganesh Singh

2022-11-18

```
library(tidyverse)
## -- Attaching packages ------ tidyverse 1.3.2 --
## v ggplot2 3.3.6 v purrr 0.3.4
## v tibble 3.1.8
                    v dplyr 1.0.10
## v tidyr 1.2.1 v stringr 1.4.1
## v readr 2.1.2 v forcats 0.5.2
## -- Conflicts ----- tidyverse_conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                 masks stats::lag()
library(ggplot2)
?ggplot2
# IMPORTING DATASETS
tuition_cost <- readr::read_csv('https://raw.githubusercontent.com/rfordatascience/tidytuesday/master/d
## Rows: 2973 Columns: 10
## -- Column specification ------
## Delimiter: ","
## chr (5): name, state, state_code, type, degree_length
## dbl (5): room_and_board, in_state_tuition, in_state_total, out_of_state_tuit...
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
tc = tuition cost
tuition_income <- readr::read_csv('https://raw.githubusercontent.com/rfordatascience/tidytuesday/master
## Rows: 209012 Columns: 7
## -- Column specification -----
## Delimiter: ","
## chr (4): name, state, campus, income_lvl
## dbl (3): total_price, year, net_cost
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
ti = tuition_income
salary_potential <- readr::read_csv('https://raw.githubusercontent.com/rfordatascience/tidytuesday/mast
## Rows: 935 Columns: 7
## -- Column specification --------
```

```
## Delimiter: ","
## chr (2): name, state_name
## dbl (5): rank, early_career_pay, mid_career_pay, make_world_better_percent, ...
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
sp = salary_potential
historical tuition <- readr::read csv('https://raw.githubusercontent.com/rfordatascience/tidytuesday/ma
## Rows: 270 Columns: 4
## -- Column specification ------
## Delimiter: ","
## chr (3): type, year, tuition_type
## dbl (1): tuition_cost
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
ht = historical_tuition
diversity_school <- readr::read_csv('https://raw.githubusercontent.com/rfordatascience/tidytuesday/mast
## Rows: 50655 Columns: 5
## -- Column specification -------
## Delimiter: ","
## chr (3): name, state, category
## dbl (2): total_enrollment, enrollment
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
ds = diversity_school
str(tc)
## spec_tbl_df [2,973 x 10] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
                        : chr [1:2973] "Aaniiih Nakoda College" "Abilene Christian University" "Abrah
## $ name
## $ state
                        : chr [1:2973] "Montana" "Texas" "Georgia" "Minnesota" ...
## $ state_code
                       : chr [1:2973] "MT" "TX" "GA" "MN" ...
## $ type
                       : chr [1:2973] "Public" "Private" "Public" "For Profit" ...
                       : chr [1:2973] "2 Year" "4 Year" "2 Year" "2 Year" ...
## $ degree_length
## $ room_and_board
                        : num [1:2973] NA 10350 8474 NA 16648 ...
## $ in_state_tuition : num [1:2973] 2380 34850 4128 17661 27810 ...
                       : num [1:2973] 2380 45200 12602 17661 44458 ...
## $ in_state_total
## $ out_of_state_tuition: num [1:2973] 2380 34850 12550 17661 27810 ...
## $ out_of_state_total : num [1:2973] 2380 45200 21024 17661 44458 ...
## - attr(*, "spec")=
##
    .. cols(
##
    .. name = col_character(),
##
    .. state = col_character(),
##
    .. state code = col character(),
##
    .. type = col_character(),
##
    .. degree_length = col_character(),
    .. room_and_board = col_double(),
##
##
    .. in_state_tuition = col_double(),
```

```
.. out_of_state_tuition = col_double(),
    .. out_of_state_total = col_double()
    ..)
##
## - attr(*, "problems")=<externalptr>
str(ti)
## spec_tbl_df [209,012 x 7] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
## $ name : chr [1:209012] "Piedmont International University" "Piedmont International Universit
               : chr [1:209012] "NC" "NC" "NC" "NC" ...
## $ total_price: num [1:209012] 20174 20174 20174 20174 20514 ...
## $ year : num [1:209012] 2016 2016 2016 2016 2017 ...
                : chr [1:209012] "On Campus" "On Campus" "On Campus" "On Campus" ...
## $ net_cost : num [1:209012] 11475 11451 16229 15592 11668 ...
   $ income_lvl : chr [1:209012] "0 to 30,000" "30,001 to 48,000" "48_001 to 75,000" "75,001 to 110,00
  - attr(*, "spec")=
##
##
    .. cols(
##
         name = col_character(),
##
    .. state = col_character(),
    .. total_price = col_double(),
##
##
     .. year = col_double(),
        campus = col character(),
##
    . .
    .. net_cost = col_double(),
##
##
    .. income_lvl = col_character()
##
    ..)
## - attr(*, "problems")=<externalptr>
## spec_tbl_df [935 x 7] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
                              : num [1:935] 1 2 3 4 5 6 7 8 9 10 ...
                              : chr [1:935] "Auburn University" "University of Alabama in Huntsville"
## $ name
                              : chr [1:935] "Alabama" "Alabama" "Alabama" "Alabama" ...
## $ state_name
                              : num [1:935] 54400 57500 52300 54500 48400 46600 49100 48600 47700 4870
## $ early_career_pay
                              : num [1:935] 104500 103900 97400 93500 90500 ...
## $ mid_career_pay
## $ make_world_better_percent: num [1:935] 51 59 50 61 52 53 48 57 56 58 ...
                             : num [1:935] 31 45 15 30 3 12 27 17 17 20 ...
## $ stem_percent
## - attr(*, "spec")=
##
    .. cols(
##
         rank = col_double(),
##
    .. name = col_character(),
##
     .. state_name = col_character(),
       early_career_pay = col_double(),
##
    .. mid_career_pay = col_double(),
##
##
    .. make_world_better_percent = col_double(),
##
    .. stem_percent = col_double()
    ..)
##
## - attr(*, "problems")=<externalptr>
str(ht)
## spec_tbl_df [270 x 4] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
              : chr [1:270] "All Institutions" "All Institutions" "All Institutions" "All Instituti
                : chr [1:270] "1985-86" "1985-86" "1985-86" "1985-86" ...
## $ year
## $ tuition_type: chr [1:270] "All Constant" "4 Year Constant" "2 Year Constant" "All Current" ...
```

##

.. in_state_total = col_double(),

```
## $ tuition cost: num [1:270] 10893 12274 7508 4885 5504 ...
## - attr(*, "spec")=
##
    .. cols(
##
         type = col_character(),
##
       year = col_character(),
##
    .. tuition_type = col_character(),
    .. tuition cost = col double()
##
    ..)
##
   - attr(*, "problems")=<externalptr>
str(ds)
## spec_tbl_df [50,655 x 5] (S3: spec_tbl_df/tbl_df/tbl/data.frame)
                    : chr [1:50655] "University of Phoenix-Arizona" "University of Phoenix-Arizona" "
## $ total_enrollment: num [1:50655] 195059 195059 195059 195059 ...
                  : chr [1:50655] "Arizona" "Arizona" "Arizona" "Arizona" ...
## $ state
## $ category
                   : chr [1:50655] "Women" "American Indian / Alaska Native" "Asian" "Black" ...
                   : num [1:50655] 134722 876 1959 31455 13984 ...
## $ enrollment
##
   - attr(*, "spec")=
##
    .. cols(
##
    .. name = col_character(),
##
    .. total enrollment = col double(),
##
    . .
       state = col character(),
    .. category = col_character(),
##
##
    .. enrollment = col_double()
##
    ..)
## - attr(*, "problems")=<externalptr>
tcFactored = tc %>%
 mutate(degFactor = as.factor(degree_length))
tcFactored
## # A tibble: 2,973 x 11
##
              state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7
##
     <chr>
              <chr> <chr> <chr> <chr>
                                          <dbl> <dbl>
                                                          <dbl>
                                                                  <dbl>
                                                                          <dbl>
## 1 Aaniiih ~ Mont~ MT
                           Publ~ 2 Year
                                                    2380
                                                           2380
                                                                   2380
                                                                          2380
                                             NA
## 2 Abilene ~ Texas TX
                          Priv~ 4 Year 10350
                                                   34850 45200 34850
                                                                          45200
## 3 Abraham ~ Geor~ GA
                           Publ~ 2 Year
                                           8474
                                                   4128 12602 12550
                                                                          21024
                           For ~ 2 Year
## 4 Academy ~ Minn~ MN
                                            NA
                                                   17661
                                                          17661
                                                                  17661
                                                                          17661
## 5 Academy ~ Cali~ CA
                           For ~ 4 Year 16648 27810 44458 27810 44458
## 6 Adams St~ Colo~ CO
                                          8782
                           Publ~ 4 Year
                                                  9440 18222
                                                                  20456
                                                                          29238
                                         16030
## 7 Adelphi ~ New ~ NY
                            Priv~ 4 Year
                                                   38660 54690
                                                                  38660
                                                                          54690
## 8 Adironda~ New ~ NY
                            Publ~ 2 Year 11660
                                                   5375
                                                         17035
                                                                   9935
                                                                          21595
## 9 Adrian C~ Mich~ MI
                            Priv~ 4 Year 11318
                                                   37087
                                                          48405 37087
                                                                          48405
                                                          13680
## 10 Advanced~ Virg~ VA
                           For ~ 2 Year
                                              NA
                                                   13680
                                                                  13680
                                                                          13680
## # ... with 2,963 more rows, 1 more variable: degFactor <fct>, and abbreviated
      variable names 1: state_code, 2: degree_length, 3: room_and_board,
      4: in_state_tuition, 5: in_state_total, 6: out_of_state_tuition,
      7: out_of_state_total
tcFacJoinSp = tcFactored %>%
  inner_join(sp, by=c("name"="name"))
tcFacJoinSp
## # A tibble: 728 x 17
```

state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7

```
##
      <chr>
                <chr> <chr>
                              <chr> <chr>
                                               <dbl>
                                                       <dbl>
                                                               <dbl>
                                                                        <dbl>
                                                                                <dbl>
##
   1 Adams St~ Colo~ CO
                              Publ~ 4 Year
                                                8782
                                                        9440
                                                               18222
                                                                        20456
                                                                                29238
   2 Adventis~ Flor~ FL
                              Priv~ 4 Year
                                                4200
                                                       15150
                                                               19350
                                                                        15150
                                                                                19350
##
   3 Agnes Sc~ Geor~ GA
                              Priv~ 4 Year
                                               12330
                                                       41160
                                                               53490
                                                                        41160
                                                                                53490
   4 Alabama ~ Alab~ AL
                              Publ~ 4 Year
                                                5422
                                                       11068
                                                               16490
                                                                        19396
                                                                                24818
##
   5 Alaska P~ Alas~ AK
                              Priv~ 4 Year
                                                7300
                                                       20830
                                                               28130
                                                                        20830
                                                                                28130
   6 Albany C~ New ~ NY
                              Priv~ 4 Year
                                               10920
                                                               46025
                                                                                46025
                                                       35105
                                                                        35105
## 7 Albertus~ Conn~ CT
                              Priv~ 4 Year
                                                               45260
                                                                                45260
                                               13200
                                                       32060
                                                                        32060
   8 Albion C~ Mich~ MI
                              Priv~ 4 Year
                                               12380
                                                       45775
                                                               58155
                                                                        45775
                                                                                58155
## 9 Alcorn S~ Miss~ MS
                              Publ~ 4 Year
                                                9608
                                                        7144
                                                               16752
                                                                        7144
                                                                                16752
## 10 Allen Co~ Iowa IA
                              Priv~ 4 Year
                                                7282
                                                       19970
                                                               27252
                                                                        19970
                                                                                27252
## # ... with 718 more rows, 7 more variables: degFactor <fct>, rank <dbl>,
       state_name <chr>, early_career_pay <dbl>, mid_career_pay <dbl>,
       make world better percent <dbl>, stem percent <dbl>, and abbreviated
       variable names 1: state_code, 2: degree_length, 3: room_and_board,
## #
       4: in_state_tuition, 5: in_state_total, 6: out_of_state_tuition,
       7: out_of_state_total
tcFactored
## # A tibble: 2,973 x 11
##
      name
                state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7
##
                                               <dbl>
                                                       <dbl>
      <chr>
                <chr> <chr>
                              <chr> <chr>
                                                               <dbl>
                                                                        <dbl>
                              Publ~ 2 Year
   1 Aaniiih ~ Mont~ MT
                                                  NA
                                                                2380
                                                                         2380
                                                                                 2380
##
                                                        2380
                                                               45200
                                                                                45200
   2 Abilene ~ Texas TX
                              Priv~ 4 Year
                                               10350
                                                       34850
                                                                        34850
   3 Abraham ~ Geor~ GA
                              Publ~ 2 Year
                                                8474
                                                        4128
                                                               12602
                                                                        12550
                                                                                21024
## 4 Academy ~ Minn~ MN
                              For ~ 2 Year
                                                  NA
                                                       17661
                                                               17661
                                                                        17661
                                                                                17661
## 5 Academy ~ Cali~ CA
                              For ~ 4 Year
                                               16648
                                                       27810
                                                               44458
                                                                        27810
                                                                                44458
   6 Adams St~ Colo~ CO
                              Publ~ 4 Year
                                                8782
                                                        9440
                                                               18222
                                                                        20456
                                                                                29238
## 7 Adelphi ~ New ~ NY
                                                               54690
                                                                                54690
                              Priv~ 4 Year
                                               16030
                                                       38660
                                                                        38660
## 8 Adironda~ New ~ NY
                              Publ~ 2 Year
                                               11660
                                                        5375
                                                               17035
                                                                        9935
                                                                                21595
   9 Adrian C~ Mich~ MI
                              Priv~ 4 Year
                                               11318
                                                       37087
                                                               48405
                                                                        37087
                                                                                48405
## 10 Advanced~ Virg~ VA
                              For ~ 2 Year
                                                  NΑ
                                                       13680
                                                               13680
                                                                        13680
                                                                                13680
## # ... with 2,963 more rows, 1 more variable: degFactor <fct>, and abbreviated
       variable names 1: state_code, 2: degree_length, 3: room_and_board,
       4: in state tuition, 5: in state total, 6: out of state tuition,
## #
       7: out_of_state_total
sp
## # A tibble: 935 x 7
##
                                             state~1 early~2 mid_c~3 make_~4 stem_~5
       rank name
##
      <dbl> <chr>
                                             <chr>
                                                       <dbl>
                                                               <dbl>
                                                                        <dbl>
                                                                                <dbl>
##
   1
          1 Auburn University
                                             Alabama
                                                       54400
                                                              104500
                                                                           51
                                                                                   31
##
   2
          2 University of Alabama in Hunts~ Alabama
                                                       57500
                                                              103900
                                                                           59
                                                                                   45
##
   3
          3 The University of Alabama
                                                       52300
                                                               97400
                                                                           50
                                                                                   15
                                             Alabama
##
   4
          4 Tuskegee University
                                                       54500
                                                               93500
                                                                           61
                                                                                   30
                                             Alabama
##
   5
          5 Samford University
                                             Alabama
                                                       48400
                                                               90500
                                                                           52
                                                                                    3
##
  6
                                                                           53
                                                                                   12
          6 Spring Hill College
                                             Alabama
                                                       46600
                                                               89100
##
   7
          7 Birmingham Southern College
                                             Alabama
                                                       49100
                                                               88300
                                                                           48
                                                                                   27
                                                                                   17
## 8
          8 University of Alabama at Birmi~ Alabama
                                                       48600
                                                               87200
                                                                           57
                                                                                   17
##
          9 University of South Alabama
                                             Alabama
                                                       47700
                                                               86400
                                                                           56
                                                       48700
                                                                                   20
## 10
         10 Alabama A&M University
                                             Alabama
                                                               83500
                                                                           58
## # ... with 925 more rows, and abbreviated variable names 1: state name,
       2: early_career_pay, 3: mid_career_pay, 4: make_world_better_percent,
```

#

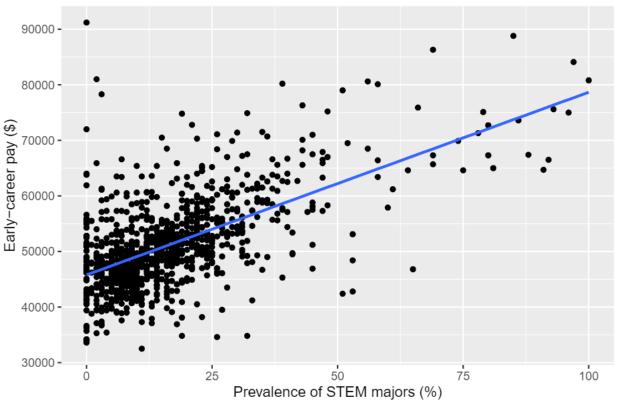
5: stem_percent

tcFacJoinSp

```
## # A tibble: 728 x 17
##
              state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7
      name
##
      <chr>
                <chr> <chr>
                              <chr> <chr>
                                              <dbl>
                                                      <dbl>
                                                              <dbl>
                                                                      <dbl>
                                                                              <dbl>
                                                              18222
                                                                              29238
## 1 Adams St~ Colo~ CO
                             Publ~ 4 Year
                                               8782
                                                       9440
                                                                      20456
   2 Adventis~ Flor~ FL
                             Priv~ 4 Year
                                               4200
                                                      15150
                                                              19350
                                                                      15150
                                                                              19350
## 3 Agnes Sc~ Geor~ GA
                             Priv~ 4 Year
                                              12330
                                                      41160
                                                              53490
                                                                              53490
                                                                      41160
## 4 Alabama ~ Alab~ AL
                             Publ~ 4 Year
                                                                              24818
                                              5422
                                                      11068
                                                              16490
                                                                      19396
## 5 Alaska P~ Alas~ AK
                              Priv~ 4 Year
                                               7300
                                                      20830
                                                              28130
                                                                      20830
                                                                              28130
                             Priv~ 4 Year
## 6 Albany C~ New ~ NY
                                              10920
                                                      35105
                                                              46025
                                                                      35105
                                                                              46025
## 7 Albertus~ Conn~ CT
                              Priv~ 4 Year
                                              13200
                                                      32060
                                                              45260
                                                                      32060
                                                                              45260
## 8 Albion C~ Mich~ MI
                             Priv~ 4 Year
                                              12380
                                                      45775
                                                              58155
                                                                      45775
                                                                              58155
## 9 Alcorn S~ Miss~ MS
                              Publ~ 4 Year
                                               9608
                                                       7144
                                                              16752
                                                                       7144
                                                                              16752
## 10 Allen Co~ Iowa IA
                             Priv~ 4 Year
                                               7282
                                                      19970
                                                              27252
                                                                              27252
                                                                      19970
## # ... with 718 more rows, 7 more variables: degFactor <fct>, rank <dbl>,
       state_name <chr>, early_career_pay <dbl>, mid_career_pay <dbl>,
## #
      make_world_better_percent <dbl>, stem_percent <dbl>, and abbreviated
## #
      variable names 1: state_code, 2: degree_length, 3: room_and_board,
       4: in_state_tuition, 5: in_state_total, 6: out_of_state_tuition,
## #
      7: out_of_state_total
ggplot(sp, aes(stem_percent,early_career_pay)) + geom_point() +
  geom_smooth(method="lm", se=FALSE)+
  ggtitle("Early career pay against prevalence of STEM majors in a school")+
  xlab("Prevalence of STEM majors (%)")+
 ylab("Early-career pay ($)")
```

`geom_smooth()` using formula 'y ~ x'

Early career pay against prevalence of STEM majors in a school



ECSPmodel = lm(early_career_pay~stem_percent,data=tcFacJoinSp)
summary(ECSPmodel)

```
##
## Call:
## lm(formula = early_career_pay ~ stem_percent, data = tcFacJoinSp)
##
## Residuals:
##
     Min
             1Q Median
                           ЗQ
                                 Max
## -21130 -4042
                 -636
                         3052
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 45584.50
                            353.63 128.91 <2e-16 ***
                 323.30
                            15.45
                                    20.93
                                             <2e-16 ***
## stem_percent
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 6533 on 726 degrees of freedom
## Multiple R-squared: 0.3763, Adjusted R-squared: 0.3754
## F-statistic:
                438 on 1 and 726 DF, p-value: < 2.2e-16
Slope: 323.30 Y-intercept: 45584.50
cor(x=sp$stem_percent,y=sp$early_career_pay)
```

[1] 0.6050609

```
cor(x=sp$stem_percent,y=sp$mid_career_pay)
```

[1] 0.6212143

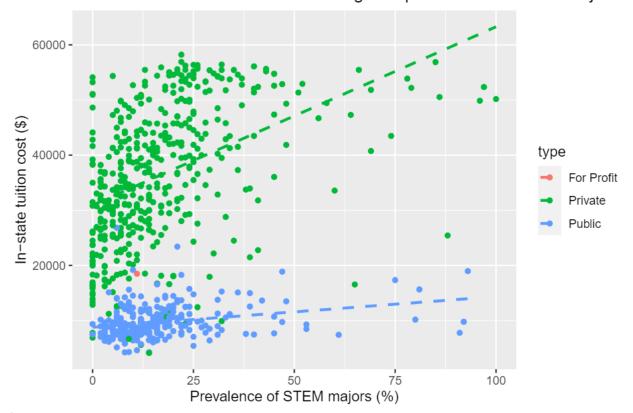
Moderately strong positive association between prevalence of STEM majors at a school and general alumni early-career earnings.

Boring. STEM jobs tend to pay really well. Let's do something fun. Hear me out...

```
ggplot(tcFacJoinSp, aes(x=stem_percent,y=in_state_tuition,color=type)) +
  geom_point() +
  geom_smooth(method="lm",se=FALSE,lty=2) +
  ggtitle("Cost of tuition for in-state students against prevalence of STEM majors")+
  xlab("Prevalence of STEM majors (%)")+
  ylab("In-state tuition cost ($)")
```

`geom_smooth()` using formula 'y ~ x'

Cost of tuition for in-state students against prevalence of STEM majors

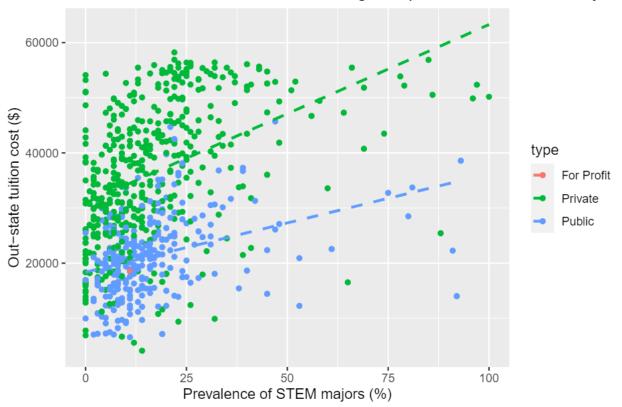


(This graph doesn't show what was seen first for your convenience, but I will be sure to remove the color for the presentation)

```
ggplot(tcFacJoinSp, aes(x=stem_percent,y=out_of_state_tuition,color=type)) +
  geom_point() +
  geom_smooth(method="lm",se=FALSE,lty=2) +
  ggtitle("Cost of tuition for out-state students against prevalence of STEM majors")+
  xlab("Prevalence of STEM majors (%)")+
  ylab("Out-state tuition cost ($)")
```

'geom_smooth()' using formula 'y ~ x'

Cost of tuition for out-state students against prevalence of STEM majors



```
ISSPmodel=lm(in_state_tuition~stem_percent,data=tcFacJoinSp)
OSSPmodel=lm(out_of_state_tuition~stem_percent,data=tcFacJoinSp)
summary(ISSPmodel)
```

```
##
## Call:
## lm(formula = in_state_tuition ~ stem_percent, data = tcFacJoinSp)
## Residuals:
             1Q Median
##
     Min
                           3Q
                                 Max
## -37716 -15270
                 1182 13232 32159
##
## Coefficients:
               Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 21958.94
                           854.44 25.700 < 2e-16 ***
                 258.53
                             37.33 6.926 9.54e-12 ***
## stem percent
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 15790 on 726 degrees of freedom
## Multiple R-squared: 0.06198,
                                   Adjusted R-squared: 0.06069
## F-statistic: 47.97 on 1 and 726 DF, p-value: 9.539e-12
summary(OSSPmodel)
```

Call:

```
## lm(formula = out_of_state_tuition ~ stem_percent, data = tcFacJoinSp)
##
## Residuals:
##
      Min
              1Q Median
                             ЗQ
                                   Max
## -38402 -8987 -1332
                          9183
                                 28283
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
## (Intercept) 25835.03
                              656.62
                                       39.34
                                               <2e-16 ***
## stem_percent
                  289.00
                              28.69
                                       10.07
                                               <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 12130 on 726 degrees of freedom
## Multiple R-squared: 0.1227, Adjusted R-squared: 0.1215
## F-statistic: 101.5 on 1 and 726 DF, p-value: < 2.2e-16
In-state Slope: 258.53 Y-intercept: 21958.94
Out-of-state Slope: 289.00 Y-intercept: 25835.03
Notes for story-telling:
```

Hypothesis: stem_percent high => stem equipment high; cost++?

room and board not considered because r&b charged by a non-academic department, and stem is academic in-state plot revealed cluster out-of-state students do not generally enjoy benefits of tuition discounts at public universities

Hypothesis: public => less burden on student due to public/instate status => generally less tuition, but still guessing stem equipment drives up cost.

```
cor(tcFacJoinSp$in_state_total,tcFacJoinSp$stem_percent)
```

[1] 0.2781892

```
#duh, cor doesn't care about the clusters.

tcFacJoinSpPUB = tcFacJoinSp %>%
  filter(type=="Public")
tcFacJoinSpPUB
```

```
## # A tibble: 276 x 17
##
      name
                state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7
##
                <chr> <chr>
                              <chr> <chr>
                                               <dbl>
      <chr>>
                                                       <dbl>
                                                               <dbl>
                                                                        <dbl>
                                                                                <dbl>
##
   1 Adams St~ Colo~ CO
                              Publ~ 4 Year
                                                8782
                                                        9440
                                                               18222
                                                                       20456
                                                                                29238
##
   2 Alabama ~ Alab~ AL
                              Publ~ 4 Year
                                                5422
                                                       11068
                                                               16490
                                                                       19396
                                                                               24818
  3 Alcorn S~ Miss~ MS
                              Publ~ 4 Year
                                                9608
                                                        7144
                                                               16752
                                                                        7144
                                                                               16752
## 4 Appalach~ Nort~ NC
                              Publ~ 4 Year
                                                8304
                                                        7214
                                                               15518
                                                                       22021
                                                                               30325
                                               7870
                                                        9068
##
   5 Arkansas~ Arka~ AR
                              Publ~ 4 Year
                                                               16938
                                                                       15848
                                                                               23718
## 6 Armstron~ Geor~ GA
                              Publ~ 4 Year
                                               11385
                                                        6384
                                                               17769
                                                                       19866
                                                                               31251
## 7 Athens S~ Alab~ AL
                              Publ~ 4 Year
                                                  NA
                                                        6810
                                                                6810
                                                                       12870
                                                                               12870
## 8 Auburn U~ Alab~ AL
                              Publ~ 4 Year
                                                                               43856
                                               13332
                                                       11276
                                                               24608
                                                                       30524
                                                6980
   9 Auburn U~ Alab~ AL
                              Publ~ 4 Year
                                                       10288
                                                               17268
                                                                       22048
                                                                               29028
## 10 Augusta ~ Geor~ GA
                              Publ~ 4 Year
                                                9640
                                                       10758
                                                               20398
                                                                       29796
                                                                               39436
## # ... with 266 more rows, 7 more variables: degFactor <fct>, rank <dbl>,
## #
       state_name <chr>, early_career_pay <dbl>, mid_career_pay <dbl>,
## #
       make_world_better_percent <dbl>, stem_percent <dbl>, and abbreviated
## #
       variable names 1: state_code, 2: degree_length, 3: room_and_board,
```

```
4: in_state_tuition, 5: in_state_total, 6: out_of_state_tuition,
## #
       7: out_of_state_total
tcFacJoinSpPRIV = tcFacJoinSp %>%
  filter(type=="Private")
tcFacJoinSpPRIV
## # A tibble: 451 x 17
##
      name
                state state~1 type degre~2 room_~3 in_st~4 in_st~5 out_o~6 out_o~7
##
                              <chr> <chr>
                                              <dbl>
      <chr>
                <chr> <chr>
                                                      <dbl>
                                                              <dbl>
                                                                       <dbl>
                                                                               <dbl>
## 1 Adventis~ Flor~ FL
                              Priv~ 4 Year
                                               4200
                                                      15150
                                                              19350
                                                                      15150
                                                                               19350
## 2 Agnes Sc~ Geor~ GA
                              Priv~ 4 Year
                                              12330
                                                      41160
                                                              53490
                                                                      41160
                                                                              53490
## 3 Alaska P~ Alas~ AK
                              Priv~ 4 Year
                                               7300
                                                      20830
                                                              28130
                                                                      20830
                                                                              28130
## 4 Albany C~ New ~ NY
                              Priv~ 4 Year
                                              10920
                                                              46025
                                                                      35105
                                                                              46025
                                                      35105
## 5 Albertus~ Conn~ CT
                              Priv~ 4 Year
                                              13200
                                                      32060
                                                              45260
                                                                      32060
                                                                              45260
## 6 Albion C~ Mich~ MI
                                                              58155
                                                                              58155
                              Priv~ 4 Year
                                              12380
                                                      45775
                                                                      45775
## 7 Allen Co~ Iowa IA
                              Priv~ 4 Year
                                              7282
                                                      19970
                                                              27252
                                                                      19970
                                                                              27252
## 8 Alma Col~ Mich~ MI
                              Priv~ 4 Year
                                              10998
                                                      40258
                                                              51256
                                                                      40258
                                                                              51256
## 9 Amberton~ Texas TX
                              Priv~ 4 Year
                                                 NA
                                                      12840
                                                              12840
                                                                      12840
                                                                              12840
## 10 Amherst ~ Mass~ MA
                              Priv~ 4 Year
                                              14740
                                                              71166
                                                                              71166
                                                      56426
                                                                      56426
## # ... with 441 more rows, 7 more variables: degFactor <fct>, rank <dbl>,
       state_name <chr>, early_career_pay <dbl>, mid_career_pay <dbl>,
## #
       make_world_better_percent <dbl>, stem_percent <dbl>, and abbreviated
## #
       variable names 1: state_code, 2: degree_length, 3: room_and_board,
## #
       4: in_state_tuition, 5: in_state_total, 6: out_of_state_tuition,
       7: out_of_state_total
## #
cor(tcFacJoinSpPRIV$in_state_tuition,tcFacJoinSpPRIV$stem_percent)
## [1] 0.4328422
cor(tcFacJoinSpPUB$in_state_tuition,tcFacJoinSpPUB$stem_percent)
## [1] 0.2654226
cor(tcFacJoinSpPRIV$out_of_state_tuition,tcFacJoinSpPRIV$stem_percent)
## [1] 0.4328422
```

cor(tcFacJoinSpPUB\$out of state tuition,tcFacJoinSpPUB\$stem percent)

[1] 0.3564587

Moderately weak positive association between tuition cost and prevalence of stem majors at a school. But only MODERATELY! There still is some good correlation here. Other ideas?

Observation notes:

Correlations for both seem to be generally higher than that of the one taken before splitting.

Question: what is a stronger explanation for expensive schools? Are there other factors beyond funding STEM departments?

This dataset does not contain readily-usable data on ivy-league status or reputation. What if schools use their alumni's early career salary as a selling point to justify higher prices?