Procedure

Data was collected from three sources: The Federal Election Commission, MIT Election Lab, and CQ Voting and Elections Center. The data from the MIT Election lab, which contained the results of all of the senate races from 1976 to 2018, was filtered down to include only regular general elections. Write in candidates were removed. The state po column was renamed to match the FEC and unnecessary columns were removed.

```
RS <<- read.csv("./Data/Results/1976-2018-senate.csv")
RS <<- RS%>% filter(candidate!="") %>%
  filter(special=="FALSE") %>%
  filter(stage=="gen")%>%
  filter(writein=="FALSE")
RS <<- RS[ -c(2,4,5,6,8,7,9,10,14,17,18)]
RS <<- RS%>%
  mutate(state=state_po)
RS <<- RS[ -c(2)]
RS <<- RS[,c(1,7,3,2,4,5,6)]
```

FEC Data was then imported. A function was created to replace state names with abbreviations in order to match this data with MIT data.

```
# Import FEC Data
F90S <-- readxl::read_xlsx("./Data/Fundraising/1990_Senate.xlsx", skip=3)
F92S <-- readxl::read_xlsx("./Data/Fundraising/1992_Senate.xlsx", skip=3)
F94S <-- readxl::read_xlsx("./Data/Fundraising/1994_Senate.xlsx", skip=3)
F96S <- readxl::read_xlsx("./Data/Fundraising/1996_Senate.xlsx", skip=3)
F98S <<- readxl::read_xlsx("./Data/Fundraising/1998_Senate.xlsx", skip=3)
FOOS <-- readxl::read_xlsx("./Data/Fundraising/2000_Senate.xlsx", skip=3)
F02S <-- readxl::read_xlsx("./Data/Fundraising/2002_Senate.xlsx", skip=3)
F04S <<- readxl::read_xlsx("./Data/Fundraising/2004_Senate.xlsx", skip=3)
F06S <<- readxl::read_xlsx("./Data/Fundraising/2006_Senate.xlsx", skip=3)
FO8S <- readx1::read xlsx("./Data/Fundraising/2008 Senate.xlsx", skip=3)
F10S <<- readxl::read_xlsx("./Data/Fundraising/2010_Senate.xlsx", skip=3)
# Correct Row Names
janitor::row_to_names(F90S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(F90S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row to names().
## # A tibble: 169 x 14
```

```
## 9 NA
           Alaska STEVENS, TED
                                    Republican Party Incumbent
           Alaska STEVENS, TED
                                                                  1990
## 10 NA
                                    Republican Party Incumbent
## # ... with 159 more rows, and 8 more variables: `112850` <dbl>,
      `111850` <dbl>, `1000` <dbl>, `0` <dbl>, `0` <dbl>, `11798` <dbl>,
     `101052` <dbl>, `0` <dbl>
janitor::row_to_names(F92S,1, remove_row = TRUE)
## # A tibble: 277 x 14
##
           Alabama `MCNAIR, J CHRI~ `Democratic Par~ Challenger `1992`
##
                   <chr>
                                    <chr>>
                                                     <chr>
                                                                 <dbl>
           Alabama MILLER, BOBBY W~ Democratic Party Challenger
                                                                  1992
## 2 NA
           Alabama SELLERS, RICHAR~ Republican Party Challenger
                                                                  1992
## 3 NA
         Alabama SHELBY, RICHARD~ Democratic Party Incumbent
                                                                  1988
## 4 NA Alabama SHELBY, RICHARD~ Democratic Party Incumbent
                                                                  1990
## 5 NA Alabama SHELBY, RICHARD~ Democratic Party Incumbent
                                                                  1992
           Alabama STEWART, FRANK ~ Democratic Party Challenger
## 6 NA
                                                                  1992
           Alaska BEASLEY, MICHAEL Democratic Party Challenger
## 7 NA
                                                                  1992
## 8 NA
         Alaska HENSLEY, WILLIA~ Democratic Party Challenger
           Alaska JORDAN, MARY E
## 9 NA
                                    Unknown
                                                     Challenger
                                                                  1992
## 10 NA
           Alaska MURKOWSKI, FRAN~ Republican Party Incumbent
                                                                  1988
## # ... with 267 more rows, and 8 more variables: `105512` <dbl>,
     `74782` <dbl>, `27550` <dbl>, `32` <dbl>, `0` <dbl>, `103389` <dbl>,
     `2123` <dbl>, `15000` <dbl>
## #
janitor::row_to_names(F94S,1, remove_row = TRUE)
## # A tibble: 280 x 14
           Arizona `COPPERSMITH, S~ `Democratic Par~ Open `1994` `1583359`
##
                                    <chr>
      <lgl> <chr>
                  <chr>
                                                     <chr>
                                                            <dbl>
                                                                      <dbl>
##
  1 NA
           Arizona EDEN, CATHERINE Democratic Party Open
                                                             1994
                                                                      88400
## 2 NA
           Arizona GRAINGER, SCOTT Libertarian Par~ Open
                                                             1994
                                                                      43767
## 3 NA
           Arizona KYL, JON L
                                    Republican Party Open
                                                             1994
                                                                    4314138
           Arizona MAHONEY, RICHAR~ Democratic Party Open
## 4 NA
                                                             1994
                                                                     516690
## 5 NA
          Arizona MOSS, DAVID R
                                    Democratic Party Open
                                                             1994
                                                                      15693
## 6 NA
           Arizona RESNICK, CINDY
                                    Democratic Party Open
                                                             1994
                                                                      94554
## 7 NA
           Califo~ ANDROMIDAS, TED~ Democratic Party Chal~
                                                             1994
                                                                      14166
## 8 NA
           Califo~ BARRON, ELIZABE~ Unknown
                                                     Chal~
                                                             1994
                                                                         50
## 9 NA
           Califo~ BLONG, BARBARA
                                                                       3568
                                                     Chal~
                                                             1994
           Califo~ CARROLL, JERRY ~ Unknown
## 10 NA
                                                     Chal~
                                                             1994
                                                                        150
## # ... with 270 more rows, and 7 more variables: `1070857` <dbl>,
     `292843` <dbl>, `70000` <dbl>, `126515` <dbl>, `1582320` <dbl>,
     `1037` <dbl>, `73188` <dbl>
janitor::row_to_names(F96S,1, remove_row = TRUE)
## # A tibble: 276 x 14
           Alabama `BEDFORD, ROGER~ `Democratic Par~ Open `1996` `3216772`
##
     NΑ
##
      <lgl> <chr>
                                    <chr>
                                                            <dbl>
                                                                      <dbl>
                                                     <chr>>
           Alabama BLAKE, JAMES (J~ Republican Party Open
## 1 NA
                                                             1996
                                                                     148854
## 2 NA
           Alabama BROMBERG, MARIL~ Democratic Party Open
                                                             1996
                                                                       8971
         Alabama BROWDER, JOHN G~ Democratic Party Open 1996
## 3 NA
                                                                     756298
```

```
## 4 NA
            Alabama CLARK, WALTER D Republican Party Open
                                                              1996
                                                                      757944
## 5 NA
            Alabama DAVIS, NATALIE M Democratic Party Open
                                                              1996
                                                                      752364
## 6 NA
            Alabama HEFLIN, HOWELL ~ Democratic Party Chal~
                                                              1992
                                                                      194133
            Alabama HEFLIN, HOWELL ~ Democratic Party Chal~
## 7 NA
                                                              1994
                                                                      222716
## 8 NA
            Alabama LIPSCOMB, ALBER~ Republican Party Open
                                                              1996
                                                                       26348
## 9 NA
            Alabama LUPER, GARY
                                     Independent
                                                              1996
                                                                         177
            Alabama MCDONALD, SIDNE~ Republican Party Open
                                                              1996
                                                                     2289431
## # ... with 266 more rows, and 7 more variables: `1800551` <dbl>,
       `459653` <dbl>, `903275` <dbl>, `0` <dbl>, `3088324` <dbl>,
      `128828` <dbl>, `130626` <dbl>
janitor::row_to_names(F98S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(F98S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row_to_names().
## # A tibble: 223 x 14
            Alabama `MCDONALD, SIDN~ `Republican Par~ Challenger `1998`
##
##
      <lgl> <chr>
                    <chr>>
                                     <chr>>
                                                      <chr>>
                                                                   <dbl>
            Alabama SHELBY, RICHARD Republican Party Incumbent
## 1 NA
                                                                    1994
## 2 NA
            Alabama SHELBY, RICHARD Republican Party Incumbent
                                                                    1996
## 3 NA
           Alabama SHELBY, RICHARD Republican Party Incumbent
                                                                    1998
           Alabama SUDDITH, CLAYTON Democratic Party Challenger
## 4 NA
                                                                   1998
## 5 NA
           Alaska MURKOWSKI, FRAN~ Republican Party Incumbent
                                                                    1994
## 6 NA
           Alaska MURKOWSKI, FRAN~ Republican Party Incumbent
                                                                   1996
## 7 NA
           Alaska MURKOWSKI, FRAN~ Republican Party Incumbent
                                                                    1998
## 8 NA
            Alaska SONNEMAN, JOSEP~ Democratic Party Challenger
                                                                    1998
## 9 NA
            Alaska VONDERSAAR, FRA~ Democratic Party Challenger
                                                                    1998
            Arizona MCCAIN, JOHN S
## 10 NA
                                     Republican Party Incumbent
                                                                    1994
## # ... with 213 more rows, and 8 more variables: `50000` <dbl>, `0` <dbl>,
       '0' <dbl>, '50000' <dbl>, '0' <dbl>, '50000' <dbl>, '0' <dbl>,
      `0` <dbl>
janitor::row_to_names(FOOS,1, remove_row = TRUE)
## Warning in janitor::row_to_names(FOOS, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean names() after
## row_to_names().
## # A tibble: 253 x 14
##
            Arizona `KYL, JON L` `Republican Par~ Incumbent `1996` `116300`
      NA
##
      <lgl> <chr>
                    <chr>>
                                 <chr>
                                                  <chr>
                                                              <dbl>
                                                                       <dbl>
            Arizona KYL, JON L
##
                                                              1998
                                                                     517542
  1 NA
                                 Republican Party Incumbent
## 2 NA
            Arizona KYL, JON L
                                 Republican Party Incumbent
                                                              2000
                                                                    2985612
## 3 NA
            Arizona TOEL, WILLI~ Independent
                                                              2000
                                                  Challeng~
                                                                      21542
## 4 NA
            Califo~ BENJAMIN, M~ Green Party
                                                              2000
                                                                     269287
                                                  Challeng~
            Califo~ CAMPBELL, T~ Republican Party Challeng~
## 5 NA
                                                              2000
                                                                    4733507
## 6 NA
           Califo~ COX, CHRIST~ Republican Party Challeng~
                                                              1998
                                                                     907406
## 7 NA
           Califo~ COX, CHRIST~ Republican Party Challeng~
                                                              2000
                                                                       2162
```

2000 10464194

141244

2000

Califo~ FEINSTEIN, ~ Democratic Party Incumbent

Califo~ GOUGH, JAME~ Republican Party Challeng~

8 NA

9 NA

```
Califo~ HAYNES, RAY~ Republican Party Challeng~
## # ... with 243 more rows, and 7 more variables: `41574` <dbl>,
      `6847` <dbl>, `0` <dbl>, `2259` <dbl>, `138605` <dbl>, `153631` <dbl>,
## #
      `0` <dbl>
janitor::row_to_names(F02S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(FO2S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row_to_names().
## # A tibble: 204 x 14
            Alabama `JONES, DOUG` `Democratic Par~ Challenger `2002` `161239`
##
##
                                                   <chr>
      <lgl> <chr>
                   <chr>
                                  <chr>>
                                                               <dbl>
                                                                        <dbl>
  1 NA
           Alabama MCPHILLIPS, ~ Democratic Party Challenger
                                                                2002 2297836
## 2 NA
            Alabama PARKER, SUSA~ Democratic Party Challenger
                                                                2002 1191848
## 3 NA
           Alabama SESSIONS, JE~ Republican Party Incumbent
                                                                1998
                                                                       552589
## 4 NA
           Alabama SESSIONS, JE~ Republican Party Incumbent
                                                                2000 1279664
           Alabama SESSIONS, JE~ Republican Party Incumbent
## 5 NA
                                                                2002
                                                                     4667726
           Alabama SOWELL, WAYNE Democratic Party Challenger
## 6 NA
                                                                2002
                                                                         4677
           Alabama SWANSON, JOH~ Independent
## 7 NA
                                                   Challenger
                                                                2002
                                                                        85393
## 8 NA
           Alaska STEVENS, THE~ Republican Party Incumbent
                                                                1998
                                                                       174173
           Alaska STEVENS, THE~ Republican Party Incumbent
## 9 NA
                                                                2000
                                                                       511839
            Alaska STEVENS, THE~ Republican Party Incumbent
## 10 NA
                                                                2002 2731101
## # ... with 194 more rows, and 7 more variables: `149775` <dbl>,
     '4000' <dbl>, '6970' <dbl>, '0' <dbl>, '161237' <dbl>, '0' <dbl>,
## #
     `0` <dbl>
janitor::row_to_names(F04S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(FO4S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row_to_names().
## # A tibble: 244 x 14
            Alabama `SHELBY, RICHAR~ `Republican Par~ Incumbent `2000`
##
##
      <lgl> <chr>
                   <chr>
                                     <chr>>
                                                      <chr>
                                                                 <dbl>
##
  1 NA
            Alabama SHELBY, RICHARD~ Republican Party Incumbent
                                                                 2002
           Alabama SHELBY, RICHARD~ Republican Party Incumbent
## 2 NA
                                                                  2004
## 3 NA
           Alabama SOWELL, WAYNE
                                     Democratic Party Challeng~
                                                                  2004
## 4 NA
           Alabama SWANSON, JOHNNY~ Independent
                                                      Challeng~
                                                                  2004
## 5 NA
           Alaska KNOWLES, TONY
                                    Democratic Party Challeng~
                                                                  2004
## 6 NA
           Alaska MILLER, MIKE
                                    Republican Party Challeng~
                                                                 2004
           Alaska MILLICAN, MARC ~ None
                                                     Challeng~
                                                                  2004
## 7 NA
           Alaska MURKOWSKI, LISA Republican Party Incumbent
## 8 NA
                                                                  2004
           Alaska SHEA, WEVLEY WI~ Republican Party Challeng~
## 9 NA
                                                                  2004
           Alaska SYKES, JAMES L. Green Party
                                                                  2004
## 10 NA
                                                      Challeng~
## # ... with 234 more rows, and 8 more variables: `1095063` <dbl>,
     `415092` <dbl>, `266392` <dbl>, `0` <dbl>, `0` <dbl>, `304525` <dbl>,
     `5349962` <dbl>, `0` <dbl>
## #
```

```
janitor::row_to_names(F06S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(F06S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row to names().
## # A tibble: 225 x 14
##
            Arizona `KYL, JON` `Republican Par~ Incumbent `2002` `280805`
##
      <lgl> <chr>
                   <chr>
                               <chr>
                                                <chr>
                                                           <dbl>
                                                                    <dbl>
##
  1 NA
            Arizona KYL, JON
                               Republican Party Incumbent
                                                            2004 1119334
## 2 NA
                                                            2006 14123880
            Arizona KYL, JON
                               Republican Party Incumbent
## 3 NA
            Arizona PEDERSON, ~ Democratic Party Challeng~
                                                            2006 14709628
## 4 NA
           Califo~ CARROLL, ~ Independent
                                                            2006
                                                Challeng~
                                                                      160
## 5 NA
           Califo~ CHRETIEN,~ Green Party
                                                Challeng~
                                                            2006
                                                                    61549
## 6 NA
           Califo~ FEINSTEIN~ Democratic Party Incumbent
                                                            2002
                                                                   854879
## 7 NA
           Califo~ FEINSTEIN~ Democratic Party Incumbent
                                                            2004 3107183
## 8 NA
           Califo~ FEINSTEIN~ Democratic Party Incumbent
                                                            2006 8238616
## 9 NA
            Califo~ MOUNTJOY,~ Republican Party Challeng~
                                                            2006
                                                                   198630
            Connec~ FERRUCCI,~ Green Party
## 10 NA
                                                Challeng~
                                                            2006
                                                                     2365
## # ... with 215 more rows, and 7 more variables: `134927` <dbl>,
      ~39907 \ \dbl>, \ \0` \ \dbl>, \ \0` \ \dbl>, \ \209843 \ \ \dbl>, \ \1062943 \ \dbl>,
## #
      `0` <dbl>
janitor::row_to_names(F08S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(FO8S, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean_names() after
## row_to_names().
## # A tibble: 230 x 14
##
            Alabama `FIGURES, VIVIA~ `Democratic Par~ Challenger
                                                                 `2008`
##
      <lgl> <chr>
                                                                  <dbl>
                    <chr>>
                                     <chr>
                                                      <chr>
## 1 NA
            Alabama GAVIN, EARL MACK Republican Party Challenger
                                                                   2008
## 2 NA
                                     Republican Party Incumbent
                                                                   2004
            Alabama SESSIONS, JEFF
## 3 NA
           Alabama SESSIONS, JEFF
                                     Republican Party Incumbent
                                                                   2006
         Alabama SESSIONS, JEFF
## 4 NA
                                     Republican Party Incumbent
                                                                   2008
## 5 NA
         Alabama SWANSON, JOHNNY~ Democratic Party Challenger
                                                                   2008
## 6 NA
         Alaska BEGICH, MARK
                                     Democratic Party Challenger
                                                                   2008
## 7 NA
         Alaska BIRD, ROBERT MA~ Independent
                                                      Challenger
                                                                   2008
## 8 NA
            Alaska CALDERO, ROCKY ~ Democratic Party Challenger
                                                                   2008
## 9 NA
           Alaska CUDDY, DAVID W
                                     Republican Party Challenger
                                                                   2008
## 10 NA
            Alaska METCALFE, RAY
                                     Democratic Party Challenger
                                                                   2008
## # ... with 220 more rows, and 8 more variables: `332750` <dbl>,
       `292898` <dbl>, `36983` <dbl>, `0` <dbl>, `0` <dbl>, `332007` <dbl>,
     `740` <dbl>, `0` <dbl>
## #
janitor::row_to_names(F10S,1, remove_row = TRUE)
## Warning in janitor::row_to_names(F1OS, 1, remove_row = TRUE): Row 1
## does not provide unique names. Consider running clean names() after
```

row_to_names().

```
## # A tibble: 360 x 14
##
            Alabama `BARNES, WILLIA~ `Democratic Par~ Challenger `2010` `5870`
      NA
                                     <chr>>
                                                      <chr>
##
                                                                   <dbl>
                                                                          <dbl>
            Alabama SHELBY, RICHARD~ Republican Party Incumbent
##
   1 NA
                                                                    2006 8.73e5
##
   2 NA
            Alabama SHELBY, RICHARD~ Republican Party Incumbent
                                                                    2008 2.40e6
##
   3 NA
           Alabama SHELBY, RICHARD~ Republican Party Incumbent
                                                                    2010 5.28e6
           Alaska MCADAMS, SCOTT
                                     Democratic Party Challenger
   4 NA
                                                                    2010 1.33e6
           Alaska MILLER, JOSEPH W Republican Party Challenger
##
   5 NA
                                                                    2010 3.37e6
##
   6 NA
           Alaska MURKOWSKI, LISA Republican Party Incumbent
                                                                    2006 1.18e5
                                     Republican Party Incumbent
##
   7 NA
            Alaska MURKOWSKI, LISA
                                                                    2008 4.99e5
   8 NA
            Alaska MURKOWSKI, LISA Republican Party Incumbent
                                                                    2010 4.07e6
   9 NA
            Alaska VONDERSAAR, FRA~ Democratic Party Challenger
                                                                    2010 1.05e3
##
## 10 NA
            Arizona DEAKIN, JIMMIE ~ Republican Party Challenger
                                                                    2010 7.15e4
## # ... with 350 more rows, and 7 more variables: `2360` <dbl>,
       `1000` <dbl>, `0` <dbl>, `0` <dbl>, `5871` <dbl>, `0` <dbl>, `0` <dbl>
# Change State Names to Abbreviations
F90S <-- F90S%>%mutate(state=state.abb[match(F90S$State,state.name)])
F92S <-- F92S %>%mutate(state=state.abb[match(F92S$State,state.name)])
F94S <-- F94S %>%mutate(state=state.abb[match(F94S$State,state.name)])
F96S <-- F96S %>%mutate(state=state.abb[match(F96S$State,state.name)])
F98S <-- F98S %>%mutate(state=state.abb[match(F98S$State,state.name)])
FOOS <- FOOS %>%mutate(state=state.abb[match(FOOS$State,state.name)])
F02S <-- F02S %>%mutate(state=state.abb[match(F02S$State,state.name)])
F04S <- F04S %>%mutate(state=state.abb[match(F04S$State,state.name)])
F06S <- F06S %>%mutate(state=state.abb[match(F06S$State,state.name)])
FO8S <- FO8S %>%mutate(state=state.abb[match(FO8S$State,state.name)])
F10S <<- F10S %>%mutate(state=state.abb[match(F10S$State,state.name)])
```

Since FEC Data for senate races is grouped in two year cycles, candidates, particularly incumbents, often have multiple fundraising rows on the table. New tables were created from the FEC data and grouped by candidate. The fundraising totals for each candidate in each six year cycle were calculated, and the tables were re-joined. The fundraising tables for each cycle were subsequently combined.

```
# Create new Tables grouped by candidate
C90S <<- F90S %>%group_by(Candidate)
C92S <<- F92S %>%group_by(Candidate)
C94S <<- F94S %>%group_by(Candidate)
C96S <<- F96S %>%group_by(Candidate)
C98S <<- F98S %>%group_by(Candidate)
COOS <-- FOOS %>%group by(Candidate)
CO2S <-- FO2S %>%group_by(Candidate)
CO4S <<- F04S %>%group_by(Candidate)
CO6S <<- F06S %>%group_by(Candidate)
CO8S <-- FO8S %>%group_by(Candidate)
C10S <<- F10S %>%group_by(Candidate)
# Remove Unnecessary Columns
C90S < -C90S[-c(1,2,6,7,8,9,10,11,12,13,14)]
C92S < -C92S[-c(1,2,6,7,8,9,10,11,12,13,14)]
C94S << -C94S[-c(1,2,6,7,8,9,10,11,12,13,14)]
C96S << -C96S[-c(1,2,6,7,8,9,10,11,12,13,14)]
C98S < -C98S[-c(1,2,6,7,8,9,10,11,12,13,14)]
COOS < -COOS[-c(1,2,6,7,8,9,10,11,12,13,14)]
CO2S << -CO2S[-c(1,2,6,7,8,9,10,11,12,13,14)]
```

```
C04S << -C04S[-c(1,2,6,7,8,9,10,11,12,13,14)]
CO6S < -CO6S[-c(1,2,6,7,8,9,10,11,12,13,14)]
COSS < -COSS[-c(1,2,6,7,8,9,10,11,12,13,14)]
C10S << -C10S[-c(1,2,6,7,8,9,10,11,12,13,14)]
# Get Fundraising totals for candidates
F90S <<- F90S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=1990)
F92S <<- F92S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=1992)
F94S <<- F94S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=1994)
F96S <<- F96S %>%
  group by (Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=1996)
F98S <<- F98S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=1998)
F00S <<- F00S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=2000)
F02S <<- F02S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=2002)
F04S <<- F04S %>%
  group_by(Candidate) %>%
  summarise(
    raised=sum(Receipts),
    spent=sum(Disbursements)) %>%
  mutate(year=2004)
```

```
F06S <<- F06S %>%
  group_by(Candidate) %>%
  summarise(
   raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=2006)
F08S <<- F08S %>%
  group_by(Candidate) %>%
  summarise(
   raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=2008)
F10S <<- F10S %>%
  group_by(Candidate) %>%
  summarise(
   raised=sum(Receipts),
    spent=sum(Disbursements))%>%
  mutate(year=2010)
# Join tibbles
F90S<<-inner_join(F90S,C90S)
## Joining, by = "Candidate"
F92S<<-inner_join(F92S,C92S)
## Joining, by = "Candidate"
F94S<<-inner_join(F94S,C94S)
## Joining, by = "Candidate"
F96S<<-inner_join(F96S,C96S)
## Joining, by = "Candidate"
F98S<<-inner_join(F98S,C98S)
## Joining, by = "Candidate"
FOOS<<-inner_join(FOOS,COOS)
## Joining, by = "Candidate"
F02S<<-inner_join(F02S,C02S)
## Joining, by = "Candidate"
```

```
F04S<<-inner_join(F04S,C04S)
## Joining, by = "Candidate"
F06S<<-inner_join(F06S,C06S)
## Joining, by = "Candidate"
F08S<<-inner join(F08S,C08S)
## Joining, by = "Candidate"
F10S<<-inner_join(F10S,C10S)
## Joining, by = "Candidate"
# Combine Fundraising Lists
FS1<<-full_join(F90S,F92S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
FS2<<-full_join(FS1,F94S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
FS3<<-full_join(FS2,F96S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
FS4<<-full_join(FS3,F98S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
FS5<<-full_join(FS4,F00S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
FS6<<-full_join(FS5,F02S)
## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")
```

```
FS7<<-full_join(FS6,F04S)

## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")

FS8<<-full_join(FS7,F06S)

## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")

FS9<<-full_join(FS8,F08S)

## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")

FS<<-full_join(FS9,F10S)

## Joining, by = c("Candidate", "raised", "spent", "year", "Party",
## "Incumbent/\r\nChallenger/Open", "state")</pre>
```

One of the biggest challenges associated with FEC data is the lack of standardized candidate names. In order to correct this, the Candidate names were then divided into first and last names. This will simplify the process of joining these tables with the MIT results Data.

The FEC Data also contained party names which were inconsistent with those in the MIT results tables. Certain states, such as minnesota, have state parties with slightly different names than the national parties with which they are affiliated. This was corrected to simplify the process of joining these tables with the MIT results Data.

```
# Standardizing Party Names ------

FS <<- FS %>%
    mutate(Party=sub(" Party", '', FS$Party))%>%
    mutate(party=Party)

FS <<- FS[ -c(3)]

FS <<- FS[,c(1,2,9,3,4,5,6,7,8)]
```

```
FS <<- FS %>%mutate(party=sub("Democratic-Farm-Labor", 'democrat', FS$party))
FS <<- FS %>%
    mutate(party=sub("Democratic", 'democrat', FS$party))%>%
    mutate(party=tolower(party))
#Some Duplicates were created during this process, likely due to running joins more than once. The dist
FS <<- distinct(FS)
FS <<- FS[,c(1,2,3,9,5,6,7,8)]</pre>
```

The MIT Data also needed work before it could be joined with the FEC Data. First, candidates who belonged to third parties or to no party were removed. The time frame was narrowed to the period between 1990-2010. A new column was created with each candidate's share of the vote. Candidates who recieved less than ten percent, or greater than ninety percent of the vote were removed as these races are particularly non-competative and could produce outliers which artificially skew the data. As with FEC data, new columns were made with the candidates' last names. Finally, states with jungle primaries were removed, as these states can have elections in which both candidates belong to the same party. Analyzing such elections would require intensive research in order to determine the ideological factors at play, as well as the development of new methods to quantify said factors.

```
# Results Name Matching --
RS <<- distinct(RS)
RSALL<<-RS
RSR <<-RS%>%filter(party =="republican")
RSD <<-RS%>%filter(party =="democrat")
RS<<-full_join(RSR,RSD)
## Joining, by = c("year", "state", "party", "candidate", "writein",
## "candidatevotes", "totalvotes")
RS<<-RS%>%
 filter(year >=1990)%>%
 filter(year <=2010)
RS<<-RS%>%mutate(percentage=candidatevotes/totalvotes)
RS<<-RS%>%filter(percentage >=.1)
RS<<-RS%>%filter(percentage <=.9)
#Create new column with candidate last names
RS <<- RS %>%mutate(last_name=candidate)
RS <<- RS %>%mutate(last_name=sub(".*? ", "", RS$last_name))
RS <<- RS %>%mutate(last name=toupper(last name))
#Remove un-necessary and redundant columns
RS << RS[,c(1,2,3,9,4,5,6,7,8)]
# Remove states with jungle primaries
RSNJ<<-RS%>%
  filter(state !="AK")%>%
 filter(state !="WA")%>%
 filter(state !="CA")%>%
  filter(state !="LA")
Senate1<<-left_join(RSNJ,FS)</pre>
```

```
## Joining, by = c("year", "state", "party", "last_name")
## Warning: Column `state` joining factor and character vector, coercing into
## character vector
## Warning: Column `party` joining factor and character vector, coercing into
## character vector
Senate1 << - distinct (Senate1)
In order to get a better idea of a candidate's performance, the previous election results are calculated.
# Add Pervious Election Data -----
RSREF<<-full join(RSR,RSD)
## Joining, by = c("year", "state", "party", "candidate", "writein",
## "candidatevotes", "totalvotes")
RSREF<<-RSREF%>%mutate(previous_percentage=candidatevotes/totalvotes)
RSREF<<-RSREF%>%
  filter(state !="AK")%>%
 filter(state !="WA")%>%
 filter(state !="CA")%>%
 filter(state !="LA")
RSREF<<-RSREF[ -c(4,5,6,7)]
RSREF<<-RSREF%>%mutate(year=year+6)
Senate2<<-left_join(Senate1,RSREF)</pre>
## Joining, by = c("year", "state", "party")
## Warning: Column `state` joining character vector and factor, coercing into
## character vector
## Warning: Column `party` joining character vector and factor, coercing into
## character vector
# Calculate Demonstrated PVI's from previous results and current r
Senate3 <<- Senate2%>%
 mutate(Previous_RPVI=previous_percentage-.5)%>%
 mutate(Previous_RPVI=2*Previous_RPVI)%>%
 mutate(RPVI=percentage-.5)%>%
  mutate(RPVI=2*RPVI)
Senate3<<-unique(Senate3)
```

Some duplicate data was created when the results and fundraising data was joined. The fundraising totals were re-calculated to ensure that no duplicate data remains.

Senate3<<-Senate3[-c(6,13)]

```
# Re-divide fundraising into years
R90S<<-Senate3%>%filter(year==1990)
R92S<<-Senate3%>%filter(year==1992)
R94S<<-Senate3%>%filter(year==1994)
R96S<<-Senate3%>%filter(year==1996)
R98S<<-Senate3%>%filter(year==1998)
ROOS<<-Senate3%>%filter(year==2000)
R02S<<-Senate3%>%filter(year==2002)
R04S<<-Senate3%>%filter(year==2004)
R06S<<-Senate3%>%filter(year==2006)
R08S<<-Senate3%>%filter(year==2008)
R10S<<-Senate3%>%filter(year==2010)
# Group By Candidate again ---
C90S <<- R90S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
C92S <<- R92S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
C94S <<- R94S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
C96S <<- R96S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
C98S <<- R98S %>%
  group by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
COOS <<- ROOS %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
CO2S <<- RO2S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
CO4S <<- RO4S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
```

```
C06S <<- R06S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
CO8S <<- RO8S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
C10S <<- R10S %>%
  group_by(candidate)%>%
  summarise(
    rcpt=sum(raised),
    disb=sum(spent))
# Re-join with results --
R90S<<-left_join(R90S,C90S)
## Joining, by = "candidate"
R92S<<-left_join(R92S,C92S)
## Joining, by = "candidate"
R94S<<-left_join(R94S,C94S)
## Joining, by = "candidate"
R96S<<-left_join(R96S,C96S)
## Joining, by = "candidate"
R98S<<-left_join(R98S,C98S)
## Joining, by = "candidate"
R00S<<-left_join(R00S,C00S)</pre>
## Joining, by = "candidate"
R02S<<-left_join(R02S,C02S)</pre>
## Joining, by = "candidate"
R04S<<-left_join(R04S,C04S)
## Joining, by = "candidate"
```

```
R06S<<-left_join(R06S,C06S)
## Joining, by = "candidate"
ROSS<<-left_join(ROSS,COSS)
## Joining, by = "candidate"
R10S<<-left_join(R10S,C10S)
## Joining, by = "candidate"
# Re-name fundraising columns -----
R90S<<-R90S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R92S<<-R92S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R94S<<-R94S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R96S<<-R96S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R98S<<-R98S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
ROOS<<-ROOS%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R02S<<-R02S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R04S<<-R04S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R06S<<-R06S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R08S<<-R08S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
R10S<<-R10S%>%
  mutate(raised=rcpt)%>%
  mutate(spent=disb)
# Remove un-necessary columns
R90S << -R90S[-c(15,16)]
R92S < -R92S[-c(15,16)]
R94S << -R94S[-c(15,16)]
R96S << -R96S[-c(15,16)]
```

```
R98S << -R98S[-c(15,16)]
ROOS << -ROOS[-c(15,16)]
R02S << -R02S[-c(15,16)]
R04S << -R04S[-c(15,16)]
RO6S << -RO6S[-c(15,16)]
RO8S << -RO8S[-c(15,16)]
R10S << -R10S[-c(15,16)]
# remove duplicate data -
R90S<<-unique(R90S)
R92S<<-unique(R92S)
R94S<<-unique(R94S)
R96S<<-unique(R96S)
R98S<<-unique(R98S)
R00S<<-unique(R00S)
R02S<<-unique(R02S)
R04S<<-unique(R04S)
R06S<<-unique(R06S)
R08S<<-unique(R08S)
R10S<<-unique(R10S)
```

The fundraising totals from each state are calculated and the candidate's share of the spending was calculated from these totals.

```
# Get totals for each state -----
#Create new tibbles for each year
S90S<<-R90S
S92S<<-R92S
S94S<<-R94S
S96S<<-R96S
S98S<<-R98S
S00S<<-R00S
S02S<<-R02S
S04S<<-R04S
S06S<<-R06S
S08S<<-R08S
S10S<<-R10S
# Get totals for each state
S90S <<- S90S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S92S <<- S92S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S94S <<- S94S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S96S <<- S96S %>%
```

```
group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S98S <<- S98S %>%
  group_by(state) %>%
  summarise(
    total raised=sum(raised),
    total_spent=sum(spent))
S00S <<- S00S %>%
  group_by(state) %>%
  summarise(
    total raised=sum(raised),
    total_spent=sum(spent))
S02S <<- S02S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S04S <<- S04S %>%
  group_by(state) %>%
  summarise(
    total raised=sum(raised),
    total_spent=sum(spent))
S06S <<- S06S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S08S <<- S08S %>%
  group_by(state) %>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
S10S <<- R10S %>%
  group_by(state)%>%
  summarise(
    total_raised=sum(raised),
    total_spent=sum(spent))
#Remove duplicates
S90S <<- distinct(S90S)
S92S <<- distinct(S92S)
S94S <<- distinct(S94S)
S96S <<- distinct(S96S)
S98S <<- distinct(S98S)
SOOS <<- distinct(SOOS)
S02S <<- distinct(S02S)
S04S <<- distinct(S04S)
S06S <<- distinct(S06S)
SO8S <<- distinct(SO8S)
S10S <<- distinct(S10S)
#Join tibbles
R90S<<-left_join(R90S,S90S)
```

```
## Joining, by = "state"
R92S<<-left_join(R92S,S92S)
## Joining, by = "state"
R94S<<-left_join(R94S,S94S)
## Joining, by = "state"
R96S<<-left_join(R96S,S96S)
## Joining, by = "state"
R98S<<-left_join(R98S,S98S)
## Joining, by = "state"
ROOS<<-left_join(ROOS,SOOS)</pre>
## Joining, by = "state"
R02S<<-left_join(R02S,S02S)
## Joining, by = "state"
R04S<<-left_join(R04S,S04S)
## Joining, by = "state"
R06S<<-left_join(R06S,S06S)</pre>
## Joining, by = "state"
R08S<<-left_join(R08S,S08S)
## Joining, by = "state"
R10S<<-left_join(R10S,S10S)
## Joining, by = "state"
```

The data was filtered again to include only races in which a Democrat and a Republican are running. This will ensure that candidates running without a major party opponent do not skew the data. The table was exported.

```
# Two candidates only -----
#Create new tibbles to count number of candidates in each state
CN90S<<-R90S%>% count(state)
CN92S<<-R92S%>% count(state)
CN94S<<-R94S%>% count(state)
CN96S<<-R96S%>% count(state)
CN98S<<-R98S%>% count(state)
CNOOS<<-ROOS%>% count(state)
CN02S<<-R02S%>% count(state)
CNO4S<<-RO4S%>% count(state)
CN06S<<-R06S%>% count(state)
CNO8S<<-R08S%>%count(state)
CN10S<<-R10S%>%count(state)
#Join number of candidates column
R90S<<-left_join(R90S,CN90S)
## Joining, by = "state"
R92S<<-left_join(R92S,CN92S)
## Joining, by = "state"
R94S<<-left_join(R94S,CN94S)
## Joining, by = "state"
R96S<<-left_join(R96S,CN96S)
## Joining, by = "state"
R98S<<-left_join(R98S,CN98S)
## Joining, by = "state"
ROOS<<-left_join(ROOS,CNOOS)</pre>
## Joining, by = "state"
R02S<<-left_join(R02S,CN02S)</pre>
## Joining, by = "state"
R04S<<-left_join(R04S,CN04S)
## Joining, by = "state"
```

```
RO6S<<-left_join(RO6S,CNO6S)
## Joining, by = "state"
R08S<<-left_join(R08S,CN08S)
## Joining, by = "state"
R10S<<-left_join(R10S,CN10S)
## Joining, by = "state"
#Only look at states with a republican and a democrat running
R90S<<-R90S%>%filter(n==2)
R92S<<-R92S%>%filter(n==2)
R94S << -R94S <> filter(n==2)
R96S<<-R96S%>%filter(n==2)
R98S<<-R98S%>%filter(n==2)
R00S<<-R00S%>%filter(n==2)
R02S << -R02S\% >\% filter(n==2)
R04S << -R04S \% filter(n==2)
R06S << -R06S \% > \% filter(n==2)
R08S<<-R08S%>%filter(n==2)
R10S<<-R10S%>%filter(n==2)
#get rid of N column
R90S << -R90S[-c(17)]
R92S << -R92S[-c(17)]
R94S << -R94S[-c(17)]
R96S << -R96S[-c(17)]
R98S << -R98S[-c(17)]
ROOS << -ROOS[-c(17)]
R02S << -R02S[-c(17)]
R04S << -R04S[-c(17)]
R06S << -R06S[-c(17)]
RO8S < -RO8S[-c(17)]
R10S << -R10S[-c(17)]
# JOIN SECTIONS ----
S4A<<-full_join(R90S,R92S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4B<<-full join(S4A,R94S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
```

```
S4C<<-full_join(S4B,R96S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4D<<-full join(S4C,R98S)
## Joining, by = c("year", "state", "party", "last_name", "candidate".
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4E<<-full join(S4D,R00S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4F<<-full_join(S4E,R02S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4G<<-full_join(S4F,R04S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4H<<-full join(S4G,R06S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
S4I << -full_join(S4H,R08S)
## Joining, by = c("year", "state", "party", "last_name", "candidate",
## "candidatevotes", "totalvotes", "percentage", "Incumbent/\r\nChallenger/
## Open", "raised", "spent", "previous_percentage", "Previous_RPVI", "RPVI",
## "total_raised", "total_spent")
```

Senate4<<-full_join(S4I,R10S)</pre>

The years were changed to not include the 2010. The rise of citizens united made it much more challenging to accurately depict fundraising based on what a candidate raises.

```
library("tidyverse")
Senate5<<- read.csv("~/Documents/GitHub/Final-Data-Project/Tables/Senate.csv", sep="\t")
Senate5<<-Senate5%>%
    filter(year<=2008)
#Export Data
write.table(Senate5, "~/Documents/GitHub/Final-Data-Project/Tables/Senate.csv", sep="\t")</pre>
```