hw_submit_wk8 STAT 412/612 Week 8 Homework

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Exercise 1: Keys

 $\mathbf{key} = \mathbf{a}$ set of variables used to connect a pair of dataframes

primary key = identifies individual rows its own data frame. Give me a value, I can tell the unique row that has that value.

1. Read the description of the babynames dataset with (you might need to install babynames)

What are the data frames in this data set?

Ans: Applicants, Baby names, Births and Lifetables.

```
library(babynames)
## Warning: package 'babynames' was built under R version 3.6.3
```

```
head(applicants) #Applicants.
## # A tibble: 6 x 3
##
     year sex
                 n_all
##
     <int> <chr> <int>
## 1 1880 F
                 97605
## 2 1880 M
                118400
## 3 1881 F
                 98855
## 4 1881 M
                108282
## 5 1882 F
                115695
## 6 1882 M
                122031
head(babynames) #Baby names.
## # A tibble: 6 x 5
##
     year sex name
                                prop
                              n
##
     <dbl> <chr> <chr>
                          <int> <dbl>
## 1 1880 F
                Mary
                          7065 0.0724
## 2 1880 F
                Anna
                           2604 0.0267
## 3 1880 F
                           2003 0.0205
                Emma
## 4 1880 F
                Elizabeth 1939 0.0199
## 5 1880 F
                Minnie
                           1746 0.0179
## 6 1880 F
                Margaret 1578 0.0162
head(births) # Births
## # A tibble: 6 x 2
##
     year births
     <int>
            <int>
## 1 1909 2718000
## 2 1910 2777000
## 3 1911 2809000
## 4 1912 2840000
## 5 1913 2869000
## 6 1914 2966000
head(lifetables) # Lifetables
## # A tibble: 6 x 9
##
        Х
               qх
                      lx
                            dx
                                  Lx
                                          Tx
                                                ex sex
                                                          year
##
     <dbl>
            <dbl> <dbl> <dbl> <dbl> <
                                       <dbl> <dbl> <fct> <dbl>
## 1
        0 0.146
                 100000 14596 90026 5151511 51.5 M
## 2
        1 0.0328
                   85404 2803 84003 5061484 59.3 M
                                                         1900
## 3
        2 0.0163
                   82601 1350 81926 4977482 60.3 M
                                                          1900
## 4
        3 0.0105
                   81251 855 80824 4895556 60.2 M
                                                          1900
## 5
        4 0.00875 80397 703 80045 4814732 59.9 M
                                                          1900
        5 0.00628 79693 501 79443 4734687 59.4 M
## 6
                                                          1900
```

What are the keys in each data frame? Demonstrate they are unique.

```
\# applicants : the keys are year and sex.
applicants %>%
  group_by(year,sex) %>%
  count() %>%
 filter(n > 1)
## # A tibble: 0 x 3
## # Groups: year, sex [0]
## # ... with 3 variables: year <int>, sex <chr>, n <int>
# babynames: the keys are year, sex, and name.
babynames %>%
  group_by(year, sex, name) %>%
  count() %>%
filter(n > 1)
## # A tibble: 0 x 4
## # Groups: year, sex, name [0]
## # ... with 4 variables: year <dbl>, sex <chr>, name <chr>, n <int>
# babynames: the keys are year, and births.
births %>%
  group_by(year, births) %>%
  count() %>%
filter(n > 1)
## # A tibble: 0 x 3
## # Groups: year, births [0]
## # ... with 3 variables: year <int>, births <int>, n <int>
# lifetables: the keys are x, sex, and year. (qx:ex are not)
lifetables %>%
  group_by(x,sex,year) %>%
  count() %>%
 filter(n > 1)
## Warning: Factor `sex` contains implicit NA, consider using
## `forcats::fct_explicit_na`
## # A tibble: 0 x 4
## # Groups: x, sex, year [1]
## # ... with 4 variables: x <dbl>, sex <fct>, year <dbl>, n <int>
```

2. Read the description of the nasaweather dataset with (you might need to install nasaweather)

```
library(help = "nasaweather")
```

What are the data frames in this data set?

Ans: Atmospheric data, Country borders, Elevation, Glacier locations and Storm tracks data.

```
library(nasaweather)
##
## Attaching package: 'nasaweather'
## The following object is masked from 'package:dplyr':
##
##
       storms
head(atmos) #Atmospheric_data.
## # A tibble: 6 x 11
##
       lat long year month surftemp temp pressure ozone cloudlow cloudmid
##
     <dbl> <dbl> <int> <int>
                                <dbl> <dbl>
                                                <dbl> <dbl>
                                                               <dbl>
                                                                         <dbl>
## 1 36.2 -114.
                  1995
                           1
                                 273.
                                        272.
                                                  835
                                                        304
                                                                 7.5
                                                                         34.5
## 2 33.7 -114.
                                 280.
                                                  940
                                                                         32.5
                  1995
                                        282.
                                                        304
                                                                11.5
                           1
      31.2 -114.
                 1995
                                  285.
                                                  960
                                                        298
                                                                16.5
                           1
                                        285.
                                                                          26
## 4 28.7 -114.
                                 289.
                                                  990
                                                        276
                                                                20.5
                                                                         14.5
                 1995
                           1
                                        291.
## 5 26.2 -114. 1995
                                  292.
                                        293.
                                                 1000
                                                        274
                                                                26
                                                                         10.5
                           1
## 6 23.7 -114.
                                  294.
                                                 1000
                  1995
                           1
                                        294.
                                                        264
                                                                30
                                                                          9.5
## # ... with 1 more variable: cloudhigh <dbl>
head(borders) #Country borders
## Warning: Detecting old grouped_df format, replacing `vars` attribute by `groups`
## # A tibble: 6 x 4
## # Groups:
               group [1]
##
     country long
                     lat group
     <chr>
             <dbl> <dbl> <int>
## 1 AG
             -61.7 17.0
## 2 AG
             -61.7 17.0
## 3 AG
             -61.9 17.0
                              1
## 4 AG
             -61.9 17.1
                             1
## 5 AG
             -61.9 17.1
                             1
## 6 AG
             -61.8 17.2
                             1
head(elev) #Elevation.
## # A tibble: 6 x 3
##
      long
              lat elev
##
     <dbl> <dbl> <dbl>
## 1 -114. -21.2
## 2 -114. -18.7
                      0
## 3 -114. -16.2
## 4 -114. -13.7
## 5 -114. -11.2
```

6 -114. -8.72

```
##
    <chr>>
                <chr>>
                            <dbl> <dbl> <chr>
                                              <chr>>
## 1 CO1A0101001 RAMIREZ E 4 10.8 -73.6 " NA"
                                              CO
## 2 CO1A0101002 RAMIREZ E 3 10.8 -73.6 " NA"
## 3 CO1AO101003 RAMIREZ E 2 10.8 -73.6 " NA"
## 4 CO1AO101004 RAMIREZ E 1 10.8 -73.6 "0.03" CO
## 5 CO1AO101005 RAMIREZ 5 N 10.8 -73.6 "0.1" CO
## 6 CO1A0101007 RAMIREZ 3 N 10.8 -73.6 "0.03" CO
head(storms) #Storm_tracks_data
## # A tibble: 6 x 11
                                    lat long pressure wind type
    name year month
                         day hour
                                                                         seasday
    <chr> <int> <int> <int> <int> <dbl> <dbl>
                                                 <int> <int> <chr>
                                                                            <int>
                                   0 17.4 -84.3
## 1 Allis... 1995
                       6
                             3
                                                    1005
                                                            30 Tropical De...
                                                                                   3
## 2 Allis... 1995
                       6
                             3
                                  6 18.3 -84.9
                                                    1004
                                                            30 Tropical De...
                                                                                   3
## 3 Allis... 1995
                       6
                            3
                               12 19.3 -85.7
                                                    1003
                                                            35 Tropical St...
                                                                                   3
## 4 Allis... 1995
                     6
                           3 18 20.6 -85.8
                                                    1001
                                                            40 Tropical St...
                                                                                   3
                                0 22
                                                            50 Tropical St...
## 5 Allis... 1995
                       6
                            4
                                           -86
                                                     997
                                                                                    4
## 6 Allis... 1995
                                   6 23.3 -86.3
                                                     995
                                                            60 Tropical St...
# Test note chunk
if (FALSE){
 Atmospheric_data.
 Country_borders
 Elevation.
 Glacier_locations
 Storm_tracks_data
What are the keys in each data frame?
# atmos: the keys are lat, long, year, month
nasaweather::atmos %>%
 count(lat, long, year, month) %>%
 filter(n > 1) %>%
 nrow()
## [1] 0
# borders:No key in this data frame
nasaweather::borders %>%
 count(country, long, lat, group) %>%
 filter(n > 1) %>%
 nrow()
```

lat long area

country

head(glaciers) #Glacier_locations

name

A tibble: 6 x 6

id

##

```
## [1] 154
```

```
# elev:the keys are long, lat, elev
nasaweather::elev %>%
  count(long, lat, elev) %>%
 filter(n > 1) %>%
 nrow()
## [1] 0
# glaciers:the key is id
nasaweather::glaciers %>%
  count(id) %>%
  filter(n > 1) %>%
 nrow()
## [1] O
# storms: the key is name, year, month, day, hour, lat, long
nasaweather::storms %>%
  count(name, year, month, day, hour, lat, long) %>%
  filter(n > 1) %>%
 nrow()
## [1] 0
```

Exercise 3: Lahman's Baseball Dataset

This exercise concerns the Lahman dataset. You can read about it with:

```
library(tidyverse)
library(Lahman)

## Warning: package 'Lahman' was built under R version 3.6.3

help("Lahman-package")

## starting httpd help server ... done
```

For this exercise, we'll use the Master, Batting, Pitching, Fielding, Teams, and Salaries data frames.

1. Load these data frames into R and read about them.

head(Master)

```
playerID birthYear birthMonth birthDay birthCountry birthState
                                                                           birthCity
## 1 aardsda01
                     1981
                                   12
                                             27
                                                          USA
                                                                       CO
                                                                              Denver
                                    2
## 2 aaronha01
                     1934
                                              5
                                                          USA
                                                                       AL
                                                                              Mobile
                                              5
## 3 aaronto01
                     1939
                                    8
                                                          USA
                                                                       AL
                                                                              Mobile
                                    9
                                              8
                                                          USA
## 4
      aasedo01
                     1954
                                                                       CA
                                                                              Orange
## 5
      abadan01
                     1972
                                    8
                                             25
                                                          USA
                                                                       FL Palm Beach
                                   12
## 6
      abadfe01
                     1985
                                             17
                                                         D.R.
                                                               La Romana
##
     deathYear deathMonth deathDay deathCountry deathState deathCity nameFirst
## 1
            NA
                        NA
                                  NA
                                              <NA>
                                                          <NA>
                                                                     <NA>
                                                                              David
## 2
            NA
                        NA
                                  NA
                                              <NA>
                                                          <NA>
                                                                     <NA>
                                                                               Hank
## 3
          1984
                         8
                                  16
                                               USA
                                                            GA
                                                                 Atlanta
                                                                             Tommie
## 4
            NA
                                  NA
                                              <NA>
                                                          <NA>
                                                                     <NA>
                                                                                Don
                        NA
## 5
            NA
                        NA
                                              <NA>
                                                          <NA>
                                                                     <NA>
                                  NA
                                                                               Andy
## 6
                                              <NA>
                                                          <NA>
                                                                     <NA>
            NΑ
                        NA
                                  NA
                                                                           Fernando
     nameLast
                      nameGiven weight height bats throws
                                                                  debut finalGame
                                                           R 2004-04-06 2015-08-23
## 1
      Aardsma
                    David Allan
                                    215
                                             75
                                                   R
## 2
        Aaron
                    Henry Louis
                                    180
                                             72
                                                   R
                                                           R 1954-04-13 1976-10-03
## 3
                                    190
                                             75
                                                   R
                                                           R 1962-04-10 1971-09-26
        Aaron
                     Tommie Lee
## 4
                                    190
                                                           R 1977-07-26 1990-10-03
         Aase
                 Donald William
                                             75
                                                   R
## 5
         Abad
                  Fausto Andres
                                    184
                                             73
                                                   L
                                                           L 2001-09-10 2006-04-13
                                                           L 2010-07-28 2017-10-01
## 6
         Abad Fernando Antonio
                                    220
                                             73
##
      retroID
                 bbrefID
                          deathDate birthDate
                                <NA> 1981-12-27
## 1 aardd001 aardsda01
## 2 aaroh101 aaronha01
                                <NA> 1934-02-05
## 3 aarot101 aaronto01 1984-08-16 1939-08-05
## 4 aased001
               aasedo01
                                <NA> 1954-09-08
## 5 abada001
                                <NA> 1972-08-25
               abadan01
## 6 abadf001
               abadfe01
                                <NA> 1985-12-17
```

head(Batting)

```
playerID yearID stint teamID lgID G
                                              AB
                                                    R H X2B X3B HR RBI SB CS BB SO
##
## 1 abercda01
                                                       0
                                                                0
                                                                   0
                  1871
                            1
                                 TRO
                                        NA
                                            1
                                                    0
                                                                        0
## 2
     addybo01
                  1871
                            1
                                 RC1
                                        NA 25 118 30 32
                                                            6
                                                                0
                                                                   0
                                                                      13
                                                                           8
                                                                              1
                                                                                     0
                                        NA 29 137
                                                                   0
                                                                      19
## 3 allisar01
                  1871
                                 CL1
                                                  28
                                                      40
                                                            4
                                                                5
                                                                           3
                                                                                     5
                                                          10
## 4 allisdo01
                  1871
                                 WS3
                                        NA 27 133
                                                   28
                                                      44
                                                                2
                                                                   2
                                                                      27
                                                                           1
                                                                              1
                                                                                     2
                            1
## 5 ansonca01
                  1871
                                 RC1
                                        NA 25 120
                                                  29
                                                      39
                                                                3
                                                                   0
                                                                       16
## 6 armstbo01
                                 FW1
                                                            2
                                                                        5
                  1871
                            1
                                        NA 12
                                              49
                                                    9 11
                                                                1
                                                                   0
                                                                           0
                                                                              1
     IBB HBP SH SF GIDP
## 1
      NA
          NA NA NA
## 2
      NA
          NA NA NA
## 3
      NA
          NA NA NA
                        1
## 4
      NA
          NA NA NA
## 5
          NA NA NA
      NA
                       0
          NA NA NA
## 6
      NA
```

head(Pitching)

playerID yearID stint teamID lgID W L G GS CG SHO SV IPouts H ER HR BB

```
## 1 bechtge01
                  1871
                                  PH1
                                        NA 1 2 3
                                                     3
                                                              0
                                                                        78 43 23
                            1
## 2 brainas01
                  1871
                                  WS3
                                        NA 12 15 30 30 30
                                                              0
                                                                       792 361 132
                                                                                     4 37
                                                                 0
                            1
## 3 fergubo01
                  1871
                                  NY2
                                        NA
                                               0
                                                              0
                                                                 0
                                                                         3
                                                                              8
                                                                                  3
## 4 fishech01
                                  RC1
                                                                       639 295 103
                  1871
                                        NA
                                            4 16 24 24 22
                                                              1
                                                                 0
                                                                                     3 31
                            1
## 5 fleetfr01
                  1871
                                  NY2
                                        NA
                                            0
                                                   1
                                                      1
                                                              0
                                                                  0
                                                                        27
                                                                            20
                                                                                 10
                                                                                     0
## 6 flowedi01
                  1871
                                  TRO
                                        NA
                                            0
                                               0
                                                   1
                                                      0
                                                          0
                                                              0
                                                                 Ω
                                                                         3
                                                                                  0
                                                                                     0
                            1
                                                                              1
                 ERA IBB WP HBP
                                 BK
                                      BFP GF
                                                R SH SF
     SO BAOpp
                7.96
                           7
## 1 1
           NA
                       NA
                              NA
                                   0
                                      146
                                           0
                                               42 NA NA
## 2 13
           NA
                4.50
                       NA
                           7
                              NA
                                   0 1291
                                           0 292 NA NA
                                                           NA
## 3
                       NA
                           2
                              NA
                                       14
                                           0
     Ω
           NA 27.00
                                  0
                                                9 NA NA
## 4 15
                4.35
                       NA 20
                              NA
                                   0 1080
                                           1 257 NA NA
                                                           NA
## 5
                       NA
                           0
                              NA
                                       57
                                           0
                                               21 NA NA
      0
           NA 10.00
                                   0
                                                           NA
## 6
                0.00
                       NA O
                              NA
                                  0
                                        3
                                           1
                                                O NA NA
```

head(Fielding)

```
playerID yearID stint teamID lgID POS
                                              G GS InnOuts PO
                                                                Α
                                                                   E DP PB WP SB CS
                                          SS
## 1 abercda01
                 1871
                           1
                                TRO
                                      NA
                                              1 1
                                                         24
                                                             1
                                                                3
                                                                   2
                                                                      O NA NA NA NA
## 2 addybo01
                 1871
                           1
                                RC1
                                      NA
                                          2B 22 22
                                                        606 67 72 42
                                                                      5 NA NA NA NA
## 3 addybo01
                 1871
                                RC1
                                          SS
                                              3
                                                 3
                                                         96
                                                            8 14
                                                                   7
                                                                      O NA NA NA NA
                           1
                                      NA
                                CL1
                                                                      O NA NA NA NA
## 4 allisar01
                 1871
                           1
                                      NA
                                          2B
                                              2
                                                 0
                                                         18
                                                             1
                                                                4
                                                                   0
## 5 allisar01
                                CL1
                                          OF 29 29
                                                        729 51
                                                                3
                                                                   7
                                                                      1 NA NA NA NA
                 1871
                           1
                                      NA
## 6 allisdo01
                 1871
                                WS3
                                      NA
                                           C 27 27
                                                        681 68 15 20 4 18 NA 0 0
##
     ZR.
## 1 NA
## 2 NA
## 3 NA
## 4 NA
## 5 NA
## 6 NA
```

head(Teams)

```
yearID lgID teamID franchID divID Rank G Ghome W L DivWin WCWin LgWin
## 1
       1871
              NA
                     BS1
                              BNA
                                   <NA>
                                            3 31
                                                    NA 20 10
                                                                <NA>
                                                                      <NA>
## 2
       1871
              NA
                     CH1
                              CNA
                                   <NA>
                                            2 28
                                                    NA 19 9
                                                                <NA>
                                                                      <NA>
                                                                                N
                     CL1
                                   <NA>
                                                                      <NA>
## 3
       1871
              NA
                              CFC
                                            8 29
                                                    NA 10 19
                                                                <NA>
                                                                                N
## 4
       1871
                     FW1
                              KEK
                                   <NA>
                                            7 19
                                                        7 12
                                                                <NA>
                                                                      <NA>
                                                                                N
              NA
                                                    NΑ
                                            5 33
## 5
       1871
              NA
                     NY2
                              NNA
                                   <NA>
                                                    NA 16 17
                                                                <NA>
                                                                      <NA>
                                                                                N
## 6
       1871
              NA
                     PH1
                              PNA
                                   <NA>
                                            1 28
                                                    NA 21
                                                                <NA>
                                                                      <NA>
                                                                                Y
##
     WSWin
             R
                 AB
                       H X2B X3B HR BB SO SB CS HBP SF
                                                         RA ER ERA CG SHO SV
      <NA> 401 1372 426
                          70
                              37
                                 3 60 19 73 16
                                                  NA NA 303 109 3.55 22
## 1
## 2
      <NA> 302 1196 323
                          52
                              21 10 60 22 69 21
                                                  NA NA 241
                                                             77 2.76 25
                                                                               1
                          35
                              40
                                  7 26 25 18
## 3
      <NA> 249 1186 328
                                              8
                                                  NA NA 341 116 4.11 23
## 4
      <NA> 137
                746 178
                          19
                               8
                                  2 33
                                        9
                                          16
                                                  NA NA 243
                                                             97 5.17 19
                                                                               0
                                              4
                                                                           1
## 5
      <NA> 302 1404 403
                          43
                              21
                                  1 33 15 46 15
                                                  NA NA 313 121 3.72 32
                                                                               0
                          66
                              27
                                  9 46 23 56 12 NA NA 266 137 4.95 27
## 6
      <NA> 376 1281 410
     IPouts HA HRA BBA SOA
                               E DP
                                        FP
                                                               name
## 1
                      42
                          23 243 24 0.834
        828 367
                  2
                                              Boston Red Stockings
## 2
        753 308
                  6
                      28
                          22 229 16 0.829 Chicago White Stockings
## 3
        762 346
                  13
                      53
                          34 234 15 0.818
                                           Cleveland Forest Citys
                  5
                      21
                          17 163 8 0.803
                                              Fort Wayne Kekiongas
        507 261
## 5
                  7 42 22 235 14 0.840
                                                  New York Mutuals
        879 373
```

```
## 6
        747 329
                   3 53 16 194 13 0.845 Philadelphia Athletics
##
                              park attendance BPF PPF teamIDBR teamIDlahman45
## 1
              South End Grounds I
                                            NA 103 98
                                                             BOS
                                                                              CH1
## 2
          Union Base-Ball Grounds
                                            NA 104 102
                                                              CHI
## 3 National Association Grounds
                                            NA 96 100
                                                              CLE
                                                                              CL1
                                            NA 101 107
                                                                              FW1
## 4
                    Hamilton Field
                                                             KF.K
## 5
         Union Grounds (Brooklyn)
                                            NA 90
                                                     88
                                                             NYU
                                                                              NY2
                                                                              PH1
## 6
         Jefferson Street Grounds
                                            NA 102 98
                                                              ATH
##
     teamIDretro
## 1
             BS1
## 2
             CH1
## 3
             CL1
## 4
             FW1
## 5
             NY2
## 6
             PH<sub>1</sub>
```

head(Salaries)

```
yearID teamID lgID playerID salary
##
## 1
       1985
               ATL
                     NL barkele01 870000
## 2
       1985
               ATL
                     NL bedrost01 550000
## 3
       1985
               ATL
                     NL benedbr01 545000
## 4
       1985
               ATL
                     NL
                         campri01 633333
## 5
       1985
               ATL
                     NL ceronri01 625000
## 6
       1985
               ATL
                     NL chambch01 800000
```

- 2. Find all the names of the players who have ever had a stint (from the Fielding data frame) in the Red Sox (or the Boston Americans) in years where they made it to the World Series (so they won their leagues).
- Show the first ten names (arranged in alphabetical order of last name).
- Note the World Series was not played each year and began in 1903.

```
Teams %>%
  filter(yearID >= 1903 ) %>%
  filter(LgWin == "Y" & teamID == "BOS") %>%
  filter(!is.na(WSWin)) %>% # WSWin should be Y or No
  select(yearID,lgID,teamID,LgWin,WSWin) -> Boston_League

left_join( Boston_League,Fielding,by = c("yearID", "lgID", "teamID")) %>%
  left_join(Master, by = "playerID" ) %>%
  filter(stint > 0) %>%
  select(nameFirst, nameLast, yearID) %>%
  arrange(nameLast) %>%
  distinct() %>% #unique() also
  head(10)
```

```
## 4
                    Agnew
                             1916
             Sam
## 5
                             1918
             Sam
                    Agnew
                             1903
## 6
           Nick
                 Altrock
## 7
                             2004
             Abe
                  Alvarez
## 8
           Jimmy Anderson
                             2004
## 9
          Ernie
                   Andres
                             1946
## 10
             Kim
                   Andrew
                             1975
```

3. Some players play on multiple teams each year.

- Construct a data frame containing the total salary for each player for each year.
- Construct a second data frame containing the total number of at bats and hits for each player in a year.

```
## # A tibble: 98,815 x 5
   # Groups:
                yearID [148]
##
      yearID playerID salary_total total_bats total_hits
##
       <int> <chr>
                                <int>
                                            <int>
                                                        <int>
##
    1
        1985 ackerji01
                               170000
                                                0
                                                            0
##
    2
        1985 agostju01
                               147500
                                                0
                                                            0
##
    3
        1985 aguaylu01
                               237000
                                              165
                                                           46
##
    4
        1985 alexado01
                               875000
                                                0
                                                            0
##
    5
        1985 allenne01
                               750000
                                                2
                                                            0
##
    6
        1985 almonbi01
                               255000
                                              244
                                                           66
    7
        1985 anderal02
##
                                62500
                                               NA
                                                           NA
##
    8
        1985 anderla02
                               250500
                                                4
                                                            0
##
   9
        1985 andujjo01
                              1030000
                                               94
                                                           10
        1985 armasto01
                               915000
                                              385
                                                          102
## 10
## # ... with 98,805 more rows
```

4. The batting average of a player is the number of Hits divided by the number of at bats. A larger value is good.

• Using the data frames you created in part 3, create a new data frame with batting average and salary information for only players in the years after 1985 (when salary information started being collected) who had a minimum of 400 at bats.

```
after_1985 <- multiple_teams_each_year %>%
 mutate(batting_average = (total_hits / total_bats)) %>%
 filter(yearID > 1985 & total_bats >= 400) %>% #including 1985?
 select(yearID, playerID, batting_average, salary_total)
after_1985
## # A tibble: 5,681 x 4
## # Groups: yearID [33]
##
     yearID playerID batting_average salary_total
##
      <int> <chr>
                                <dbl>
                                             <int>
       1986 armasto01
##
                                0.264
                                           1000000
  1
      1986 baineha01
## 2
                                0.296
                                            775000
       1986 balbost01
                                0.229
## 3
                                            525000
## 4
       1986 barfije01
                                0.289
                                            725000
## 5
       1986 barrema02
                                0.286
                                            435000
## 6
       1986 basske01
                                0.311
                                            310000
## 7
       1986 baylodo01
                                0.238
                                            660696
## 8
       1986 bellbu01
                                0.278
                                            870000
## 9
       1986 bellge02
                                            725000
                                0.309
       1986 bernato01
                                0.301
                                            580000
## 10
## # ... with 5,671 more rows
```

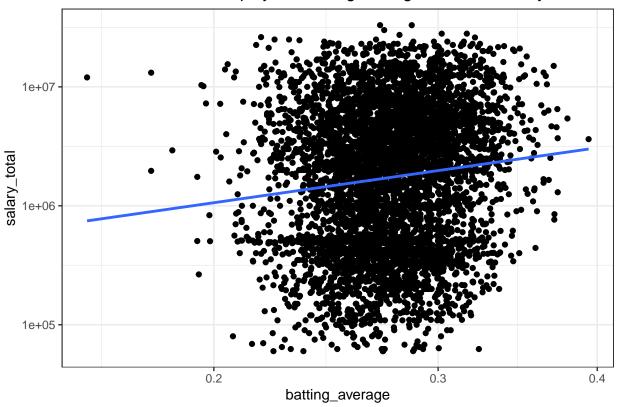
• Explore the marginal association between a player's batting average and their salary.

```
after_1985 %>%
  ggplot(aes(x = batting_average, y = salary_total))+
  geom_point()+
  scale_x_log10()+
  scale_y_log10()+
  ggtitle("Association between a player's batting average and their salary") +
  geom_smooth(method = "lm", se = FALSE )+
  theme_bw()

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

## Warning: Removed 492 rows containing non-finite values (stat_smooth).
## Warning: Removed 492 rows containing missing values (geom_point).
```

Association between a player's batting average and their salary



• Explore if this association has changed over time (for example, because sports teams are getting more stats-savvy). Hint: figure out how to set the color based on year.

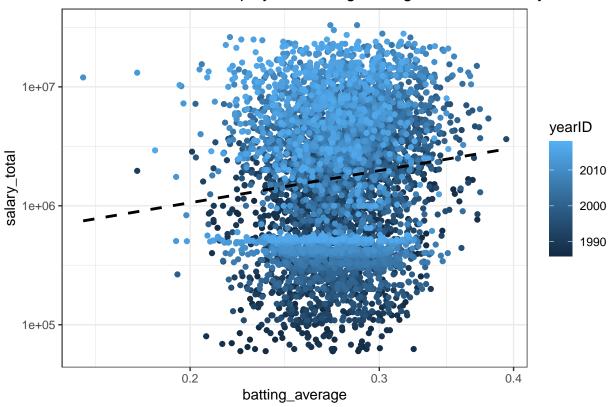
```
after_1985 %>%
  ggplot(aes(x = batting_average, y = salary_total, color = yearID ))+
  geom_point()+
  scale_x_log10()+
  scale_y_log10()+
  ggtitle("Association between a player's batting average and their salary") +
  geom_smooth(method = "lm", se = FALSE, color = "black",linetype = "dashed")+
  theme_bw()
```

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

Warning: Removed 492 rows containing non-finite values (stat_smooth).

Warning: Removed 492 rows containing missing values (geom_point).

Association between a player's batting average and their salary



Conclusion: The relationship between the batting average and the total salary is positive. On the other hand, when the batting average is increasing, the total salary is increasing, too. (the year of legend is not affected the batting average and total of salary.) Therefore, what happens to totally salary, while batting average is increasing over time.

5. Find the salary of all players named "John" in even numbered years after 1985. Print the first ten values arranged in descending order of salary.

```
Lahman::Master %>%
filter(nameFirst == "John") -> John_bio

left_join(John_bio, Salaries, by = "playerID") %>%
  select(yearID,nameFirst,nameLast,salary) %>%
  arrange(desc(salary)) %>%
  filter(yearID %%2 == 0) %>%
  head(10)
```

```
yearID nameFirst nameLast
##
                                 salary
## 1
       2010
                 John Lackey 18700000
## 2
       2016
                 John Lackey 16000000
## 3
       2012
                 John Lackey 15950000
       2016
                        Danks 15750000
## 4
                 John
```

##	5	2014	John	Lackey	15250000
##	6	2014	John	Danks	14250000
##	7	2008	John	${\tt Smoltz}$	14000000
##	8	2004	John	${\tt Smoltz}$	11666667
##	9	2006	John	Smoltz	11000000
##	10	2000	John	Smoltz	8500000